# simuPOP Reference Manual

Release 1.0.0 (Rev: 3310)

Bo Peng

December 2004

Last modified January 3, 2010

Department of Epidemiology, U.T. M.D. Anderson Cancer Center

Email: bpeng@mdanderson.org

 ${\bf URL:}\ \ http://simupop.sourceforge.net$ 

Mailing List: simupop-list@lists.sourceforge.net



#### Abstract

simuPOP is a general-purpose individual-based forward-time population genetics simulation environment. Unlike coalescent-based programs, simuPOP evolves populations forward in time, subject to arbitrary number of genetic and environmental forces such as mutation, recombination, migration and population/subpopulation size changes. In contrast to competing applications that use command-line options or configuration files to direct the execution of a limited number of predefined evolutionary scenarios, users of simuPOP's scripting interface could make use of many of its unique features, such as customized chromosome types, arbitrary nonrandom mating schemes, virtual subpopulations, information fields and Python operators, to construct and study almost arbitrarily complex evolutionary scenarios.

simuPOP is provided as a number of Python modules, which consist of a large number of Python objects and functions, including Population, mating schemes, operators (objects that manipulate populations) and simulators to coordinate the evolutionary processes. It is the users' responsibility to write a Python script to glue these pieces together and form a simulation. At a more user-friendly level, an increasing number of functions and scripts contributed by simuPOP users is available in the online simuPOP cookbook. They provide useful functions for different applications (e.g. load and manipulate HapMap samples, import and export files from another application) and allow users who are unfamiliar with simuPOP to perform a large number of simulations ranging from basic population genetics models to generating datasets under complex evolutionary scenarios.

This document provides complete references to all classes and functions of simuPOP and its utility modules. Please refer to the *simuPOP user's guide* for a detailed introduction to simuPOP concepts, and a number of examples on how to use simuPOP to perform various simulations. All resources, including a pdf version of this guide and a mailing list can be found at the simuPOP homepage http://simupop.sourceforge.net.

#### How to cite simuPOP:

Bo Peng and Marek Kimmel (2005) simuPOP: a forward-time population genetics simulation environment. *bioinformatics*, **21** (18): 3686-3687.

Bo Peng and Christopher Amos (2008) Forward-time simulations of nonrandom mating populations using simuPOP. *bioinformatics*, **24** (11): 1408-1409.

# **Contents**

1	simu	imuPOP Components			
1.1 Individual, Population, pedigree and Simulator				1	
		1.1.1	Class GenoStruTrait	1	
		1.1.2	Class Individual	3	
		1.1.3	Class Population	4	
		1.1.4	Class Pedigree	10	
		1.1.5	Class Simulator	11	
	1.2	Virtual	splitters	13	
		1.2.1	Class BaseVspSplitter	13	
		1.2.2	Class SexSplitter	13	
		1.2.3	Class AffectionSplitter	13	
		1.2.4	Class InfoSplitter	14	
		1.2.5	Class ProportionSplitter	14	
		1.2.6	Class RangeSplitter	14	
		1.2.7	Class GenotypeSplitter	15	
		1.2.8	Class CombinedSplitter	15	
		1.2.9	Class ProductSplitter	16	
	1.3	Mating	Schemes	16	
		1.3.1	Class HomoMating	16	
		1.3.2	Class HeteroMating	17	
		1.3.3	Class SequentialParentChooser	17	
		1.3.4	Class SequentialParentsChooser	18	
		1.3.5	Class RandomParentChooser	18	
		1.3.6	Class RandomParentsChooser	18	
		1.3.7	Class PolyParentsChooser	19	
		1.3.8	Class AlphaParentsChooser	19	
		1.3.9	Class PyParentsChooser	19	
		1.3.10	Class OffspringGenerator	20	
		1.3.11	Class ControlledOffspringGenerator	20	
	1.4	Pre-def	ined mating schemes	21	
		1.4.1	Class CloneMating	21	
		1.4.2	Class RandomSelection	21	
		1.4.3	Class RandomMating	21	
		1.4.4	Class Monogamous Mating	22	
		1.4.5	Class PolygamousMating	22	
		1.4.6	Class AlphaMating	22	
		1.4.7	Class HaplodiploidMating	22	
		1.4.8	Class SelfMating	23	
		1.4.9	Class ControlledRandomMating	23	
	1.5	Utility (	Classes	23	
		1.5.1	Class WithArgs	23	
		1.5.2	Class RNG	23	

	1.6	Global	functions	24
2 Operator References				27
_	2.1		lass for all operators	27
	2.1	2.1.1	Class BaseOperator	27
	2.2		zation	28
	2.2	2.2.1	Class InitSex (Can be applied directly using function initSex)	28
		2.2.2	Class InitByFreq (Can be applied directly using function initByFreq)	29
		2.2.3	Class InitByValue (Can be applied directly using function initByValue)	29
		2.2.4	Class InitInfo (Can be applied directly using function initInfo)	29
	2.3		sion and Statements	30
	2.5	2.3.1	Class PyOutput	30
		2.3.2	Class PyEval (Can be applied directly using function pyEval)	30
		2.3.3	Class PyExec (Can be applied directly using function pyExec)	31
		2.3.4	Class InfoEval (Can be applied directly using function infoEval)	31
		2.3.5	Class InfoEvec (Can be applied directly using function infoExec)	31
	2.4		graphic models	32
	∠.∓	2.4.1	Class Migrator	32
		2.4.2	Class SplitSubPops (Can be applied directly using function splitSubPops)	33
		2.4.3	Class MergeSubPops (Can be applied directly using function mergeSubPops)	34
		2.4.4	Class ResizeSubPops (Can be applied directly using function resizeSubPops)	34
	2.5		repe transmitters	35
	4.5	2.5.1	Class GenoTransmitter	35
		2.5.2	Class CloneGenoTransmitter	35
		2.5.3	Class MendelianGenoTransmitter	36
		2.5.4	Class SelfingGenoTransmitter	36
		2.5.5	Class HaplodiploidGenoTransmitter	36
		2.5.6	Class Mitochondrial GenoTransmitter	37
		2.5.7	Class Recombinator	37
	2.6		on	38
	2.0	2.6.1	Class BaseMutator	39
		2.6.2	Class MatrixMutator (Can be applied directly using function matrixMutate)	39
		2.6.3	Class KAlleleMutator (Can be applied directly using function kAlleleMutate)	40
		2.6.4	Class StepwiseMutator (Can be applied directly using function stepwqiseMutate)	40
		2.6.5	Class PyMutator (Can be applied directly using function pyMutate)	41
		2.6.6	Class MixedMutator (Can be applied directly using function mixedMutate)	41
		2.6.7	Class ContextMutator (Can be applied directly using function contextMutate)	41
		2.6.8	Class PointMutator (Can be applied directly using function pointMutate)	42
		2.6.9	Class SNPMutator	42
		2.6.10	Class AcqtMutator	42
	2.7		ance	42
	2.7	2.7.1	Class BasePenetrance	43
		2.7.2	Class MapPenetrance (Applicable to all ploidy, can be applied directly using function	
			mapPenetrance)	43
		2.7.3	Class MaPenetrance (Can be applied directly using function maPenetrance)	44
		2.7.4	Class MlPenetrance (Can be applied directly using function mlPenetrance)	44
		2.7.5	Class PyPenetrance (Can be applied directly using function pyPenetrance)	44
	2.8		tative Trait	45
	2.0	2.8.1	Class BaseOuanTrait	45
		2.8.2	Class PyQuanTrait (Can be applied directly using function pyQuanTrait)	45
	2.9		I selection	46
		2.9.1	Class BaseSelector	46
		2.9.2	Class MapSelector (Applicable to all ploidy)	47
		2.9.3	Class MaSelector	47

	2.9.4	Class MlSelector	48
	2.9.5	Class PySelector	48
2.10		es Calculation	48
		Class Stat (Can be applied directly using function stat)	48
2.11		g operators	53
		Class IdTagger (Can be applied directly using function tagID)	53
		Class InheritTagger	54
		Class SummaryTagger	55
		Class Parents Tagger	55
	2.11.5	Class PedigreeTagger	55
		Class PyTagger	56
2.12	Termina	ator	56
	2.12.1	Class TerminateIf	56
2.13	The Pyt	hon operator	57
	2.13.1	Class PyOperator	57
2.14	Miscell	aneous operators	57
	2.14.1	Class NoneOp	57
		Class Dumper	57
	2.14.3	Class SavePopulation	58
	2.14.4	Class IfElse	58
	2.14.5	Class Pause	58
	2.14.6	Class TicToc	59
2.15	Functio	n form of operators	59
	2.15.1	Function dump	59
	2.15.2	Function initSex	59
	2.15.3	Function initInfo	59
	2.15.4	Function initByFreq	59
	2.15.5	Function initByValue	60
	2.15.6	Function pyEval	60
	2.15.7	Function pyExec	60
	2.15.8	Function infoEval	60
	2.15.9	Function infoExec	60
		Function migrate	60
		Function resizeSubPops	60
		Function mergeSubPops	60
		Function splitSubPops	61
		Function matrixMutate	61
		Function snpMutate	61
		Function acgtMutate	61
		Function kAlleleMutate	61
		Function stepwqiseMutate	61
		Function pyMutate	61
		Function mixedMutate	61
		Function contextMutate	61
		Function pointMutate	62
		Function stat	62
		Function tagID	62
			62
		Function mapPenetrance	62
		Function malenetrance	
		Function mlPenetrance	62
		Function pyPenetrance	62
	2.13.29	Function pyQuanTrait	62
3 Utilit	ty Modu	les	63

3.1	Module	simuOpt	63
	3.1.1	Function setOptions	63
	3.1.2	Class SimuParam	64
	3.1.3	Function param	66
	3.1.4	Function valueNot	67
	3.1.5	Function valueOr	67
	3.1.6	Function valueAnd	67
	3.1.7	Function valueOneOf	67
	3.1.8	Function valueTrueFalse	67
	3.1.9	Function valueBetween	67
	3.1.10	Function valueGT	67
	3.1.10		67
		Function valueGE	
	3.1.12	Function valueLT	67
	3.1.13	Function valueLE	68
	3.1.14	Function valueEqual	68
	3.1.15	Function valueNotEqual	68
	3.1.16	Function valueIsNum	68
	3.1.17	Function valueIsList	68
	3.1.18	Function valueValidDir	68
	3.1.19	Function valueValidFile	68
3.2	Module	simuPOP.utils	68
	3.2.1	Class Trajectory	68
	3.2.2	Class TrajectorySimulator	69
	3.2.3	Function simulateForwardTrajectory	71
	3.2.4	Function simulateBackwardTrajectory	71
	3.2.5	Function migrIslandRates	71
	3.2.6	Function migrHierarchicalIslandRates	71
	3.2.7	Function migrSteppingStoneRates	72
	3.2.8	Class SimuProgress	72
	3.2.9	Function viewVars	72
	3.2.10	Function saveCSV	73
3.3			73
3.3		simuPOP.plotter	
	3.3.1	Function newDevice	73
	3.3.2	Function saveFigure	73
	3.3.3	Class DerivedArgs	74
	3.3.4	Class VarPlotter	74
	3.3.5	Class ScatterPlotter	76
	3.3.6	Class InfoPlotter	77
	3.3.7	Class HistPlotter	78
	3.3.8	Class QQPlotter	78
	3.3.9	Class BoxPlotter	78
3.4	Module	simuPOP.sampling	79
	3.4.1	Class BaseSampler	79
	3.4.2	Class RandomSampler	80
	3.4.3	Function drawRandomSample	80
	3.4.4	Function drawRandomSamples	80
	3.4.5	Class CaseControlSampler	80
	3.4.6	Function drawCaseControlSample	81
	3.4.7	Function drawCaseControlSamples	81
	3.4.8	Class PedigreeSampler	81
	3.4.9	Class AffectedSibpairSampler	81
	3.4.10		82
		Function drawAffectedSibpairSample	
	3.4.11	Function drawAffectedSibpairSamples	82
	3.4.12	Class NuclearFamilySampler	82

	3.4.13	Function drawNuclearFamilySample	83
	3.4.14	Function drawNuclearFamilySamples	83
	3.4.15	Class ThreeGenFamilySampler	83
	3.4.16	Function drawThreeGenFamilySample	83
	3.4.17	Function drawThreeGenFamilySamples	84
	3.4.18	Class CombinedSampler	84
	3.4.19	Function drawCombinedSample	84
	3.4.20	Function drawCombinedSamples	84
3.5	Module	simuPOP.gsl	84
Index			87

# **Chapter 1**

# simuPOP Components

# 1.1 Individual, Population, pedigree and Simulator

# 1.1.1 Class GenoStruTrait

All individuals in a population share the same genotypic properties such as number of chromosomes, number and position of loci, names of markers, chromosomes, and information fields. These properties are stored in this GenoStruTrait class and are accessible from Individual, Population, and Simulator classes. Currently, a genotypic structure consists of

- Ploidy, namely the number of homologous sets of chromosomes, of a Population. HAPLODIPLOID Population is also supported.
- Number of chromosomes and number of loci on each chromosome.
- Positions of loci, which determine the relative distance between loci on the same chromosome. No unit is assumed so these positions can be ordinal (1, 2, 3, ..., the default), in physical distance (bp, kb or mb), or in map distance (e.g. centiMorgan) depending on applications.
- Names of alleles. Although alleles at different loci usually have different names, simuPOP uses the same names for alleles across loci for simplicity.
- Names of loci and chromosomes.
- Names of information fields attached to each individual.

In addition to basic property access functions, this class also provides some utility functions such as locusByName, which looks up a locus by its name.

#### class GenoStruTrait()

A GenoStruTrait object is created with the creation of a Population so it cannot be initialized directly.

# ploidy()

Return the number of homologous sets of chromosomes, specified by the *ploidy* parameter of the Population function. Return 2 for a haplodiploid population because two sets of chromosomes are stored for both males and females in such a population.

## ploidyName()

Return the ploidy name of this population, can be one of haploid, diploid, haplodiploid, triploid, tetraploid or #-ploid where # is the ploidy number.

#### chromBegin (chrom)

Return the index of the first locus on chromosome *chrom*.

#### chromByName (name)

Return the index of a chromosome by its *name*.

#### chromEnd(chrom)

Return the index of the last locus on chromosome *chrom* plus 1.

#### chromName (chrom)

Return the name of a chromosome *chrom*. Default to chrom# where # is the 1-based index of the chromosome.

## chromNames()

Return a list of the names of all chromosomes.

# chromType (chrom)

Return the type of a chromosome *chrom* (CUSTOMIZED, AUTOSOME, CHROMOSOME\_X, or CHROMOSOME Y).

## chromTypes()

Return the type of all chromosomes (CUSTOMIZED, AUTOSOME, CHROMOSOME\_X or CHROMOSOME\_Y).

#### numChrom()

Return the number of chromosomes.

#### absLocusIndex (chrom, locus)

Return the absolute index of locus locus on chromosome chrom. c.f. chromLocusPair.

#### chromLocusPair (locus)

Return the chromosome and relative index of a locus using its absolute index *locus*. c.f. absLocusIndex.

# lociByNames (names)

Return the indexes of loci with names *names*. Raise a ValueError if any of the loci cannot be found.

#### lociDist (locus1, locus2)

Return the distance between loci *locus1* and *locus2* on the same chromosome. A negative value will be returned if *locus1* is after *locus2*.

#### lociNames()

Return the names of all loci specified by the *lociNames* parameter of the Population function. An empty list will be returned if *lociNames* was not specified.

#### lociPos()

Return the positions of all loci, specified by the *lociPos* prameter of the Population function. The default positions are 1, 2, 3, 4, ... on each chromosome.

### locusByName (name)

Return the index of a locus with name *name*. Raise a ValueError if no locus is found. Note that empty strings are used for loci without name but you cannot lookup such loci using this function.

#### locusName (locus)

Return the name of locus *locus* specified by the *lociNames* parameter of the Population function. An empty string will be returned if no name has been given to locus *locus*.

# locusPos (locus)

Return the position of locus locus specified by the lociPos parameter of the Population function.

## numLoci(chrom)

Return the number of loci on chromosome chrom.

# numLoci()

Return the number of loci on all chromosomes.

#### totNumLoci()

Return the total number of loci on all chromosomes.

#### alleleName (allele, locus=0)

Return the name of allele *allele* at *lcous* specified by the *alleleNames* parameter of the Population function. *locus* could be ignored if alleles at all loci share the same names. If the name of an allele is unspecified, its index ('0', '1', '2', etc) is returned.

#### alleleNames (locus=0)

Return a list of allele names at given by the *alleleNames* parameter of the Population function. *locus* could be ignored if alleles at all loci share the same names. This list does not have to cover all possible allele states of a population so alleleNames() [allele] might fail (use alleleNames (allele) instead).

#### infoField(idx)

Return the name of information field idx.

#### infoFields()

Return a list of the names of all information fields of the population.

#### infoIdx (name)

Return the index of information field *name*. Raise an IndexError if *name* is not one of the information fields.

# 1.1.2 Class Individual

A Population consists of individuals with the same genotypic structure. An Individual object cannot be created independently, but refences to inidividuals can be retrieved using member functions of a Population object. In addition to structural information shared by all individuals in a population (provided by class genoStruTrait), the Individual class provides member functions to get and set *genotype*, *sex*, *affection status* and *information fields* of an individual.

Genotypes of an individual are stored sequentially and can be accessed locus by locus, or in batch. The alleles are arranged by position, chromosome and ploidy. That is to say, the first allele on the first chromosome of the first homologous set is followed by alleles at other loci on the same chromsome, then markers on the second and later chromosomes, followed by alleles on the second homologous set of the chromosomes for a diploid individual. A consequence of this memory layout is that alleles at the same locus of a non-haploid individual are separated by Individual::totNumLoci() loci. It is worth noting that access to invalid chromosomes, such as the Y chromosomes of female individuals, are not restricted.

# class Individual()

An Individual object cannot be created directly. It has to be accessed from a Population object using functions such as Population::Individual(idx).

# allele (idx, ploidy=-1, chrom=-1)

Return the current allele at a locus, using its absolute index idx. If a ploidy ploidy and/or a chromosome indexes are given, idx is relative to the beginning of specified homologous copy of chromosomes (if chrom = -1) or the beginning of the specified homologous copy of specified chromosome (if chrom > = 0).

## **setAllele** (allele, idx, ploidy=-1, chrom=-1)

Set allele *allele* to a locus, using its absolute index idx. If a ploidy *ploidy* and/or a chromosome indexes are given, idx is relative to the beginning of specified homologous copy of chromosomes (if chrom=-1) or the beginning of the specified homologous copy of specified chromosome (if chrom >= 0).

#### genotype (ploidy=-1, chrom=-1)

Return an editable array (a carray of length totNumLoci()) that represents all alleles on the p-th homologous set of chromosomes. If ploidy or chrom is given, only alleles on the chrom-th chromosome (or all chromosomes if chrom = -1) of ploidy-th homologous copy of chromosomes will be returned.

#### **setGenotype** (*geno*, *ploidy=-1*, *chrom=-1*)

Fill the genotype of an individual using a list of alleles *geno*. If parameters *ploidy* and/or *chrom* are specified, alleles will be copied to only all or specified chromosome on selected homologous copy of chromosomes. geno will be reused if its length is less than number of alleles to be filled.

# setSex(sex)

Set individual sex to MALE or FEMALE.

#### sex()

Return the sex of an individual, 1 for male and 2 for female.

# sexChar()

Return the sex of an individual, M for male or F for female.

#### affected()

Return True if this individual is affected.

## affectedChar()

Return A if this individual is affected, or U otherwise.

# setAffected (affected)

Set affection status to affected (True or False).

#### info (field)

Return the value of an information field *filed* (by index or name). ind.info(name) is equivalent to ind.name although the function form allows the use of indexes of information fieldes.

## setInfo(value, field)

Set the value of an information field *field* (by index or name) to *value*. ind.setInfo(value, field) is equivalent to ind.field = value although the function form allows the use of indexes of information fieldes.

# 1.1.3 Class Population

A simuPOP population consists of individuals of the same genotypic structure, organized by generations, subpopulations and virtual subpopulations. It also contains a Python dictionary that is used to store arbitrary population variables.

In addition to genotypic structured related functions provided by the GenoStruTrait class, the population class provides a large number of member functions that can be used to

- Create, copy and compare populations.
- Manipulate subpopulations. A population can be divided into several subpopulations. Because individuals only
  mate with individuals within the same subpopulation, exchange of genetic information across subpopulations
  can only be done through migration. A number of functions are provided to access subpopulation structure
  information, and to merge and split subpopulations.
- Define and access virtual subpopulations. A *virtual subpopulation splitter* can be assigned to a population, which defines groups of individuals called *virtual subpopulations* (VSP) within each subpopulation.
- Access individuals Individually, or through iterators that iterate through individuals in (virtual) subpopulations.
- Access genotype and information fields of individuals at the population level. From a population point of view, all genotypes are arranged sequentially individual by individual. Please refer to class Individual for an introduction to genotype arragement of each individual.

- Store and access *ancestral generations*. A population can save arbitrary number of ancestral generations. It is possible to directly access an ancestor, or make an ancestral generation the current generation for more efficient access
- Insert or remove loci, resize (shrink or expand) a population, sample from a population, or merge with other populations.
- Manipulate population variables and evaluate expressions in this *local namespace*.
- Save and load a population.

 $\textbf{class Population} \ (size=[], \ ploidy=2, \ loci=[], \ chromTypes=[], \ lociPos=[], \ ancGen=0, \ chromNames=[], \ allele-Names=[], \ lociNames=[], \ subPopNames=[], \ infoFields=[])$ 

The following parameters are used to create a population object:

- size: A list of subpopulation sizes. The length of this list determines the number of subpopulations of this population. If there is no subpopulation, size=[popSize] can be written as size=popSize.
- ploidy: Number of homologous sets of chromosomes. Default to 2 (diploid). For efficiency considerations, all chromosomes have the same number of homologous sets, even if some customized chromosomes or some individuals (e.g. males in a haplodiploid Population) have different numbers of homologous sets. The first case is handled by setting *chromTypes* of each chromosome. Only the haplodiploid populations are handled for the second case, for which ploidy=HAPLODIPLOID should be used.
- *loci:* A list of numbers of loci on each chromosome. The length of this parameter determines the number of chromosomes. Default to [1], meaning one chromosome with a single locus.
- chromTypes: A list that specifies the type of each chromosome, which can be AUTOSOME, CHROMOSOME\_X, CHROMOSOME\_Y, or CUSTOMIZED. All chromosomes are assumed to be autosomes if this parameter is ignored. Sex chromosome can only be specified in a diploid population where the sex of an individual is determined by the existence of these chromosomes using the XX (FEMALE) and XY (MALE) convention. Both sex chromosomes have to be available and be specified only once. Because chromosomes X and Y are treated as two chromosomes, recombination on the pseudo-autosomal regions of the sex chromosomes is not supported. CUSTOMIZED chromosomes are special chromosomes whose inheritance patterns are undefined. They rely on user-defined functions and operators to be passed from parents to offspring. Multiple customized chromosomes have to be arranged consecutively.
- *lociPos:* Positions of all loci on all chromosome, as a list of float numbers. Default to 1, 2, ... etc on each chromosome. *lociPos* should be arranged chromosome by chromosome. If lociPos are not in order within a chromosome, they will be re-arranged along with corresponding *lociNames* (if specified).
- ancGen: Number of the most recent ancestral generations to keep during evolution. Default to 0, which means only the current generation will be kept. If it is set to -1, all ancestral generations will be kept in this population (and exhaust your computer RAM quickly).
- chromNames: A list of chromosome names. Default to "for all chromosomes.
- alleleNames: A list or a nested list of allele names. If a list of alleles is given, it will be used for all loci in this population. For example, alleleNames = ('A', 'C', 'T', 'G') gives names A, C, T, and G to alleles 0, 1, 2, and 3 respectively. If a nested list of names is given, it should specify alleles names for all loci.
- *lociNames*: A list of names for each locus. It can be empty or a list of unique names for each locus. If loci are not specified in order, loci names will be rearranged according to their position on the chromosome.
- subPopNames: A list of subpopulation names. All subpopulations will have name " if this parameter is not specified.
- infoFields: Names of information fields (named float number) that will be attached to each individual.

#### absIndIndex (idx, subPop)

Return the absolute index of an individual *idx* in subpopulation *subPop*.

# numSubPop()

Return the number of subpopulations in a population. Return 1 if there is no subpopulation structure.

#### subPopBegin(subPop)

Return the index of the first individual in subpopulation *subPop*.

# subPopEnd(subPop)

Return the index of the last individual in subpopulation *subPop* plus 1, so that range (subPopBegin (subPop), subPopEnd (subPop) can iterate through the index of all individuals in subpopulation *subPop*.

#### subPopIndPair(idx)

Return the subpopulation ID and relative index of an individual, given its absolute index idx.

## setSubPopName (name, subPop)

Assign a name name to subpopulation subPop. does not have to be unique.

#### subPopByName (name)

Return the index of the first subpopulation with name *name*. An IndexError will be raised if subpopulations are not named, or if no subpopulation with name *name* is found. Virtual subpopulation name is not supported.

# subPopName (subPop)

Return the "spName - vspName" (virtual named subpopulation), "" (unnamed non-virtual subpopulation), "spName" (named subpopulation) or "vspName" (unnamed virtual subpopulation), depending on whether subpopulation is named or if *subPop* is virtual.

## subPopNames()

Return the names of all subpopulations (excluding virtual subpopulations). An empty string will be returned for unnamed subpopulations.

#### popSize()

Return the total number of individuals in all subpopulations.

### subPopSize(subPop=[])

Return the size of a subpopulation (subPopSize(sp)) or a virtual subpopulation (subPopSize([sp, vsp])). If no *subpop* is given, it is the same as popSize().

#### subPopSizes()

Return the sizes of all subpopulations in a list. Virtual subpopulations are not considered.

## numVirtualSubPop()

Return the number of virtual subpopulations (VSP) defined by a VSP splitter. Return 0 if no VSP is defined.

#### setVirtualSplitter(splitter)

Set a VSP *splitter* to the population, which defines the same VSPs for all subpopulations. If different VSPs are needed for different subpopulations, a CombinedSplitter can be used to make these VSPs available to all subpopulations.

## ind(idx, subPop=[])

Return a reference to individual idx in the population (if subPop=[], default) or a subpopulation (if subPop=sp). Virtual subpopulation is not supported. Note that a float idx is acceptable as long as it rounds closely to an integer.

# indByID (id, ancGen=-1, idField="ind\_id")

Return a reference to individual with *id* stored in information field *idField* (default to ind\_id). This function by default search the present and all ancestral generations (ancGen=-1), but you can suggest a specific generation if you know which generation to search (ancGen=0 for present generation, ancGen=1 for parental generation, and so on). This function will search this generation first but will search the whole population if an individual with *id* is not found. If no individual with *id* is found, an IndexError will be raised. A float *id* is acceptable as long as it rounds closely to an integer. Note that this function uses

a dynamic searching algorithm which tends to be slow. If you need to look for multiple individuals from a static population, you might want to convert a population object to a pedigree object and use function Pedigree.indByID.

### individuals (subPop=[])

Return an iterator that can be used to iterate through all individuals in a population (if subPop=[], default), or a (virtual) subpopulation (subPop=spID or (spID, vspID)).

#### genotype (subPop=[])

Return an editable array of the genotype of all individuals in a population (if subPop=[], default), or individuals in a subpopulation *subPop*. Virtual subpopulation is unsupported.

# setGenotype (geno, subPop=[])

Fill the genotype of all individuals in a population (if subPop=[]) or in a (virtual) subpopulation subPop (if subPop=sp or (sp, vsp)) using a list of alleles geno. geno will be reused if its length is less than subPopSize (subPop) \*totNumLoci() \*ploidy().

# ancestor(idx, gen, subPop=[])

Return a reference to individual idx in ancestral generation gen. The correct individual will be returned even if the current generation is not the present one (see also useAncestralGen). If a valid *subPop* is specified, *index* is relative to that *subPop*. Virtual subpopulation is not supported. Note that a float *idx* is acceptable as long as it rounds closely to an integer.

#### ancestralGens()

Return the actual number of ancestral generations stored in a population, which does not necessarily equal to the number set by setAncestralDepth().

# push (pop)

Push population *pop* into the current population. Both populations should have the same genotypic structure. The current population is discarded if *ancestralDepth* (maximum number of ancestral generations to hold) is zero so no ancestral generation can be kept. Otherise, the current population will become the parental generation of *pop*, a the greatness level of all existing ancestral generations by one. If *ancestralDepth* is positive and there are already *ancestralDepth* ancestral generations (see also: ancestralGens()), the greatest ancestral generation will be discarded. In any case, Population*pop* becomes invalid as all its individuals are absorbed by the current population.

# setAncestralDepth(depth)

Set the intended ancestral depth of a population to *depth*, which can be 0 (does not store any ancestral generation), -1 (store all ancestral generations), and a positive number (store *depth* ancestral generations. If there exists more than *depth* ancestral generations (if *depth* > 0), extra ancestral generations are removed.

# useAncestralGen(idx)

Making ancestral generation idx (0 for current generation, 1 for parental generation, 2 for grand-parental generation, etc) the current generation. This is an efficient way to access Population properties of an ancestral generation. useAncestralGen(0) should always be called afterward to restore the correct order of ancestral generations.

# addChrom(lociPos, lociNames=[], chromName="", alleleNames=[], chromType=AUTOSOME)

Add chromosome *chromName* with given type *chromType* to a population, with loci *lociNames* inserted at position *lociPos*. *lociPos* should be ordered. *lociNames* and *chromName* should not exist in the current population. Allele names could be specified for all loci (a list of names) or differently for each locus (a nested list of names), using parameter *alleleNames*. Empty loci names will be used if *lociNames* is not specified.

#### addChromFrom(pop)

Add chromosomes in population *pop* to the current population. population *pop* should have the same number of individuals as the current population in the current and all ancestral generations. This function merges genotypes on the new chromosomes from population pop individual by individual.

#### addIndFrom(pop)

Add all individuals, including ancestors, in *pop* to the current population. Two populations should have the same genotypic structures and number of ancestral generations. Subpopulations in population *pop* are kept.

# addLoci (chrom, pos, lociNames=[], alleleNames=[])

Insert loci *lociNames* at positions *pos* on chromosome *chrom*. These parameters should be lists of the same length, although *names* may be ignored, in which case empty strings will be assumed. Single-value input is allowed for parameter *chrom* and *pos* if only one locus is added. Alleles at inserted loci are initialized with zero alleles. Note that loci have to be added to existing chromosomes. If loci on a new chromosome need to be added, function addChrom should be used. Optionally, allele names could be specified either for all loci (a single list) or each loci (a nested list). This function returns indexes of the inserted loci.

#### addLociFrom (pop)

Add loci from population *pop*, chromosome by chromosome. Added loci will be inserted according to their position. Their position and names should not overlap with any locus in the current population. population *pop* should have the same number of individuals as the current population in the current and all ancestral generations.

#### extractIndividuals (indexes=[], IDs=[], idField="ind\_id")

Extract individuals with given absolute indexes (parameter *indexes*), or IDs (*IDs*, stored in information field *idField*, default to ind\_id). If a list of absolute indexes are specified, the present generation will be extracted and form a one-generational Population. If a list of IDs are specified, this function will look through all ancestral generations and extract individuals with given ID. Extracted individuals will be in their original ancestral generations and subpopulations, even if some subpopulations even generations are empty. An IndexError will be raised if an index is out of bound or if an invalid ID is encountered.

# extractSubPops (subPops=ALL\_AVAIL, rearrange=False)

Extract a list of (virtual) subpopulations from a population and create a new population. If rearrange is False (default), structure and names of extracted subpopulations are kept although extracted subpopulations can have fewer individuals if they are created from extracted virtual subpopulations. (e.g. it is possible to extract all male individuals from a subpopulation using a SexSplitter()). If rearrange is True, each (virtual) subpopulation in subPops becomes a new subpopulation in the extracted population in the order at which they are specified. Because each virtual subpopulation becomes a subpopulation, this function could be used, for example, to separate male and female individuals to two subpopulations (subPops=[(0,0), (0,1)]). If overlapping (virtual) subpopulations are specified, individuals will be copied multiple times. This function only extract individuals from the present generation.

# mergeSubPops (subPops=ALL\_AVAIL, name="")

Merge subpopulations *subPops*. If *subPops* is ALL\_AVAIL (default), all subpopulations will be merged. *subPops* do not have to be adjacent to each other. They will all be merged to the subpopulation with the smallest subpopulation ID. Indexes of the rest of the subpopulation may be changed. A new name can be assigned to the merged subpopulation through parameter *name* (an empty *name* will be ignored). This function returns the ID of the merged subpopulation.

## recodeAlleles (alleles, loci=ALL\_AVAIL, alleleNames=[])

Recode alleles at loci (default to all loci in a population) to other values according to parameter alleles. This parameter can a list of new allele numbers for alleles 0, 1, 2, ... (allele x will be recoded to  $x \in x$ ) or a Python function. In the latter case, each allele and the index of the locus it resides are passed to this function. The return value will become the new allele. A new list of allele names could be specified for these loci. Different sets of names could be specified for each locus if a nested list of names are given. This function recode alleles for all subpopulations in all ancestral generations.

#### removeIndividuals (indexes=[], IDs=[], idField="ind\_id")

Remove individual(s) either by absolute indexes (parameter *index*) or their IDs (parameter *IDs*). In the latter form, an unique ID for all individual should be saved in an information field *idField* (default to "ind\_id"). If indexes are used, individuals can only be removed from the current generation. If IDs are used, individuals from all ancestral generations could be removed. An IndexError will be raised if an index is out of bound, or if no individual is found for a given ID. This function does not affect

subpopulation structure in the sense that a subpopulation will be kept even if all individuals from it are removed.

# removeLoci (loci=[], keep=[])

Remove *loci* (absolute indexes) and genotypes at these loci from the current population. Alternatively, a parameter *keep* can be used to specify loci that will not be removed.

# removeSubPops (subPops)

Remove (virtual) subpopulation(s) *subPops* and all their individuals. This function can be used to remove complete subpopulations (with shifted subpopulation indexes) or individuals belonging to virtual subpopulations of a subpopulation. In the latter case, the subpopulations are kept even if all individuals have been removed. This function only handles the present generation.

# resize (sizes, propagate=False)

Resize Population by giving new subpopulation sizes *sizes*. individuals at the end of some subpopulations will be removed if the new subpopulation size is smaller than the old one. New individuals will be appended to a subpopulation if the new size is larger. Their genotypes will be set to zero (default), or be copied from existing individuals if *propagate* is set to True. More specifically, if a subpopulation with 3 individuals is expanded to 7, the added individuals will copy genotypes from individual 1, 2, 3, and 1 respectively. Note that this function only resizes the current generation.

# setSubPopByIndInfo(field)

Rearrange individuals to their new subpopulations according to their integer values at information field *field* (value returned by Individual::info(field)). individuals with negative values at this *field* will be removed. Existing subpopulation names are kept. New subpopulations will have empty names.

#### splitSubPop (subPop, sizes, names=[])

Split subpopulation *subPop* into subpopulations of given *sizes*, which should add up to the size of subpopulation *subPop*. If *subPop* is not the last subpopulation, indexes of subpopulations after *subPop* are shifted. If *subPop* is named, the same name will be given to all new subpopulations unless a new set of *names* are specified for these subpopulations. This function returns the IDs of split subpopulations.

#### addInfoFields (fields, init=0)

Add a list of information fields *fields* to a population and initialize their values to *init*. If an information field alreay exists, it will be re-initialized.

# indInfo(field, subPop=[])

Return the values (as a list) of information field field (by index or name) of all individuals (if subPop=[], default), or individuals in a (virtual) subpopulation (if subPop=sp or (sp, vsp)).

# removeInfoFields (fields)

Remove information fields fields from a population.

# setIndInfo(values, field, subPop=[])

Set information field field (specified by index or name) of all individuals (if subPop=[], default), or individuals in a (virtual) subpopulation (subPop=sp or (sp, vsp)) to values. values will be reused if its length is smaller than the size of the population or (virtual) subpopulation.

## setInfoFields (fields, init=0)

Set information fields *fields* to a population and initialize them with value *init*. All existing information fields will be removed.

# updateInfoFieldsFrom (fields, pop, fromFields=[], ancGen=-1)

Update information fields *fields* from *fromFields* of another population (or Pedigree) *pop*. Two populations should have the same number of individuals. If *fromFields* is not specified, it is assumed to be the same as *fields*. If ancGen is not -1, only the most recent ancGen generations are updated.

#### clone()

Create a cloned copy of a population. Note that Python statement pop1 = pop only creates a reference to an existing population pop.

#### save (filename)

Save population to a file *filename*, which can be loaded by a global function loadPopulation(filename).

#### vars (subPop=[])

Return variables of a population as a Python dictionary. If a valid subpopulation *subPop* is specified, a dictionary vars() ["subPop"] [subPop] is returned. A ValueError will be raised if key *subPop* does not exist in vars(), or if key *subPop* does not exist in vars() ["subPop"].

# 1.1.4 Class Pedigree

The pedigree class is derived from the population class. Unlike a population class that emphasizes on Individual properties, the pedigree class emphasizes on relationship between individuals. An unique ID for all individuals is needed to create a pedigree object from a population object. Compared to the Population class, a pedigree object is optimized for access individuals by their IDs, regardless of population structure and ancestral generations. Note that although the pedigree class is derived from the population class so most of the population member functions could be called, functions such as removeSubPops that alter population structure are disabled.

A pedigree object can be created from a population, or loaded from a disk file, which is usually saved by an operator during a previous evolutionary process. Depending on how a pedigree is saved, sex and affection status information may be missing.

class Pedigree (pop, loci=[], infoFields=[], ancGen=-1, idField="ind\_id", fatherField="father\_id", motherField="mother id")

Create a pedigree object from a population, using a subset of loci (parameter *loci*, default to no locus), information fields (parameter *infoFields*, default to no information field besides *idField*, *fatherField* and *motherField*), and ancestral generations (parameter *ancGen*, default to all ancestral generations). By default, information field father\_id (parameter *fatherField*) and mother\_id (parameter *motherField*) are used to locate parents identified by ind\_id (parameter *idField*), which should store an unique ID for all individuals. Multiple individus with the same ID are allowed and will be considered as the same individual, but a warning will be given if they actually differ in genotype or information fields. Operators IdTagger and PedigreeTagger are usually used to assign such IDs, although function sampling.indexToID could be used to assign unique IDs and construct parental IDs from index based relationship recorded by operator ParentsTagger. A pedigree object could be constructed with one or no parent but certain functions such as relative tracking will not be available for such pedigrees.

# clone()

Create a cloned copy of a Pedigree.

#### numParents()

Return the number of parents each individual has. This function returns the number of information fields used to store parental indexes, even if one of the fields are unused.

# indByID (id)

Return a reference to individual with *id*. An IndexError will be raised if no individual with *id* is found. An float *id* is acceptable as long as it rounds closely to an integer.

individualsWithRelatives (infoFields, sex=[], affectionStatus=[], subPops=ALL\_AVAIL, ancGen=-1)
Return a list of IDs of individuals who have non-negative values at information fields infoFields. Additional requirements could be specified by parameters sex and affectionStatus. sex can be ANY\_SEX (default), MALE\_ONLY, FEMALE\_ONLY, SAME\_SEX or OPPOSITE\_SEX, and affectionStatus can be AFFECTED, UNAFFECTED or ANY\_AFFECTION\_STATUS (default). This function by default check all individuals in all ancestral generations, but you could limit the search using parameter subPops (a list of

(virtual) subpopulations) and (recent ancestral generations) *ancGen*. Relatives fall out of specified subpopulations and ancestral generations will be considered invalid.

This function locates relatives (of type *relType*) of each individual and store their ID (if idField is specified) or indexes (if idField is not specified) in information fields *relFields*. The length of *relFields* determines how many relatives an individual can have.

Parameter *relType* specifies what type of relative to locate. It can be

- •SPOUSE locate spouses with whom an individual has at least one common offspring.
- •OUTBRED\_SPOUSE locate non-slibling spouses, namely spouses with no shared parent.
- •OFFSPRING all offspring of each individual.
- •COMMON\_OFFSPRING common offspring between each individual and its spouse (located by SPOUSE or OUTBRED\_SPOUSE). *relFields* should consist of an information field for spouse and m−1 fields for offspring where m is the number of fields.
- •FULLSIBLING siblings with common father and mother,
- •SIBLING siblings with at least one common parent.

Optionally, you can specify the sex and affection status of relatives you would like to locate, using parameters *sex* and *affectionStatus*. *sex* can be ANY\_SEX (default), MALE\_ONLY, FEMALE\_ONLY, SAME\_SEX or OPPOSITE\_SEX, and *affectionStatus* can be AFFECTED, UNAFFECTED or ANY\_AFFECTION\_STATUS (default). Only relatives with specified properties will be located.

This function will by default go through all ancestral generations and locate relatives for all individuals. This can be changed by setting parameter *ancGen* to the greatest ancestral generation you would like to process.

traceRelatives (fieldPath, sex=[], affectionStatus=[], resultFields=[], ancGen=-1)

Trace a relative path in a population and record the result in the given information fields *result-Fields*. This function is used to locate more distant relatives based on the relatives located by function locateRelatives. For example, after siblings and offspring of all individuals are located, you can locate mother's sibling's offspring using a *relative path*, and save their indexes in each individuals information fields *resultFields*.

A *relative path* consits of a *fieldPath* that specifies which information fields to look for at each step, a *sex* specifies sex choices at each generation, and a *affectionStatus* that specifies affection status at each generation. *fieldPath* should be a list of information fields, *sex* and *affectionStatus* are optional. If specified, they should be a list of ANY\_SEX, MALE\_ONLY, FEMALE\_ONLY, SAME\_SEX and OppsiteSex for parameter *sex*, and a list of *UNAFFECTED*, *AFFECTED* and *ANY\_AFFECTION\_STATUS* for parameter *affectionStatus*.

For example, if fieldPath = [['father\_id', 'mother\_id'], ['sib1', 'sib2'], ['off1', 'off2']], and sex = [ANY\_SEX, MALE\_ONLY, FEMALE\_ONLY], this function will locate father\_id and mother\_id for each individual, find all individuals referred by father\_id and mother\_id, find information fields sib1 and sib2 from these parents and locate male individuals referred by these two information fields. Finally, the information fields off1 and off2 from these siblings are located and are used to locate their female offspring. The results are father or mother's brother's daughters. Their indexes will be saved in each individuals information fields resultFields. If a non-negative ancGen is given, only individuals in these ancestral generations will be processed.

## 1.1.5 Class Simulator

A simuPOP simulator is responsible for evolving one or more replicates of a *Population* forward in time, subject to various *operators*. populations in a simulator are created as identical copies of a population and will become different after evolution. A number of functions are provided to access Simulator properties, access populations and their variables, copy, save and load a simulator.

The most important member function of a simulator is evolve, which evolves populations forward in time, subject to various operators.

# class Simulator (pops, rep=1, steal=True)

Create a simulator with *rep* (default to 1) replicates of populations *pops*, which is a list of populations although a single population object is also acceptable. Contents of passed populations are by default moved to the simulator to avoid duplication of potentially large population objects, leaving empty populations behind. This behavior can be changed by setting *steal* to False, in which case populations are copied to the simulator.

# clone()

Clone a simulator, along with all its populations. Note that Python assign statement simu1 = simu only creates a symbolic link to an existing Simulator.

# $\textbf{evolve} \ (initOps=[], \ preOps=[], \ matingScheme=MatingScheme, \ postOps=[], \ finalOps=[], \ gen=-1)$

Evolve all populations *gen* generations, subject to several lists of operators which are applied at different stages of an evolutionary process. Operators *initOps* are applied to all populations (subject to applicability restrictions of the operators, imposed by the *rep* parameter of these operators) before evolution. They are used to initialize populations before evolution. Operators *finalOps* are applied to all populations after the evolution.

Operators *preOps*, and *postOps* are applied during the life cycle of each generation. These operators can be applied at all or some of the generations, to all or some of the evolving populations, depending the *begin*, *end*, *step*, *at* and *reps* parameters of these operators. These operators are applied in the order at which they are specified. populations in a simulator are evolved one by one. At each generation, operators *preOps* are applied to the parental generations. A mating scheme is then used to populate an offspring generation. For each offspring, his or her sex is determined before during-mating operators of the mating scheme are used to transmit parental genotypes. After an offspring generation is successfully generated and becomes the current generation, operators *postOps* are applied to the offspring generation. If any of the *preOps* and *postOps* fails (return False), the evolution of a population will be stopped. The generation number of a population is increased by one if an offspring generation has been successfully populated even if a post-during operator fails.

Parameter *gen* can be set to a positive number, which is the number of generations to evolve. Because a simulator always starts at the beginning of a generation g (e.g. 0), a simulator will stop at the beginning (instead of the end) of generation g + gen (e.g. gen). If *gen* is negative (default), the evolution will continue indefinitely, until all replicates are stopped by operators that return False at some point (these operators are called *terminators*). At the end of the evolution, the generations that each replicates have evolved are returned. Note that *finalOps* are applied to all applicable population, including those that have stopped before others.

#### extract (rep)

Extract the *rep-th* population from a simulator. This will reduce the number of populations in this simulator by one.

#### numRep()

Return the number of replicates.

#### pop (rep)

Return a reference to the *rep-th* population of a simulator. The reference will become invalid once the simulator starts evolving or becomes invalid (removed). Modifying the returned object is discouraged because it will change the population within the simulator. If an independent copy of the population is needed, use simu.population(rep). clone().

# add (pop, steal=True)

Add a population *pop* to the end of an existing Simulator. This function by default moves pop to the simulator, leaving an empty population for passed population object. If steal is set to False, the population will be copied to the simulator, and thus unchanged.

#### populations()

Return a Python iterator that can be used to iterate through all populations in a simulator.

```
vars (rep, subPop=[])
Return the local namespace of the rep-th population, equivalent to
x.Population(rep).vars(subPop).
```

# 1.2 Virtual splitters

# 1.2.1 Class BaseVspSplitter

This class is the base class of all virtual subpopulation (VSP) splitters, which provide ways to define groups of individuals in a subpopulation who share certain properties. A splitter defines a fixed number of named VSPs. They do not have to add up to the whole subpopulation, nor do they have to be distinct. After a splitter is assigned to a population, many functions and operators can be applied to individuals within specified VSPs.

Each VSP has a name. A default name is determined by each splitter but you can also assign a name to each VSP. The name of a VSP can be retrieved by function Population.subPopName.

Only one VSP splitter can be assigned to a population, which defined VSPs for all its subpopulations. If different splitters are needed for different subpopulations, a CombinedSplitter should be used.

```
class BaseVspSplitter (names=[])
    This is a virtual class that cannot be instantiated.
    clone()
        All VSP splitter defines a clone() function to create an identical copy of itself.
    name (vsp)
        Return the name of VSP vsp (an index between 0 and numVirtualSubPop()).
    numVirtualSubPop()
        Return the number of VSPs defined by this splitter.
```

# 1.2.2 Class SexSplitter

This splitter defines two VSPs by individual sex. The first VSP consists of all male individuals and the second VSP consists of all females in a subpopulation.

```
class SexSplitter (names=[])
```

Create a sex splitter that defines male and female VSPs. These VSPs are named MALE and FEMALE unless a new set of names are specified by parameter *names*.

```
name (vsp)
    Return "Male" if vsp=0 and "Female" otherwise, unless a new set of names are specified.
numVirtualSubPop()
    Return 2.
```

# 1.2.3 Class AffectionSplitter

This class defines two VSPs according individual affection status. The first VSP consists of unaffected invidiauls and the second VSP consists of affected ones.

1.2. Virtual splitters

#### class AffectionSplitter (names=[])

Create a splitter that defined two VSPs by affection status. These VSPs are named UNAFFECTED and AFFECTED unless a new set of names are specified by parameter *names*.

#### name(vsp)

Return "Unaffected" if vsp=0 and "Affected" if vsp=1, unless a new set of names are specified.

## numVirtualSubPop()

Return 2.

# 1.2.4 Class InfoSplitter

This splitter defines VSPs according to the value of an information field of each indivdiual. A VSP is defined either by a value or a range of values.

# class InfoSplitter (field, values=[], cutoff=[], ranges=[], names=[])

Create an infomration splitter using information field *field*. If parameter *values* is specified, each item in this list defines a VSP in which all individuals have this value at information field *field*. If a set of cutoff values are defined in parameter *cutoff*, individuals are grouped by intervals defined by these cutoff values. For example, cutoff=[1,2] defines three VSPs with v < 1, 1 <= v < 2 and v >= 2 where v is the value of an individual at information field *field*. If parameter ranges is specified, each range defines a VSP. For example, ranges=[[1, 3], [2, 5]] defines two VSPs with 1 <= v < 3 and 2 <= 3 < 5. Of course, only one of the parameters *values*, *cutoff* and *ranges* should be defined, and values in *cutoff* should be distinct, and in an increasing order. A default set of names are given to each VSP unless a new set of names is given by parameter *names*.

#### name(vsp)

Return the name of a VSP *vsp*, which is field = value if VSPs are defined by values in parameter *values*, or field < value (the first VSP), v1 <= field < v2 and field >= v (the last VSP) if VSPs are defined by cutoff values. A user-specified name, if specified, will be returned instead.

#### numVirtualSubPop()

Return the number of VSPs defined by this splitter, which is the length parameter *values* or the length of *cutoff* plus one, depending on which parameter is specified.

# 1.2.5 Class ProportionSplitter

This splitter divides subpopulations into several VSPs by proportion.

# class ProportionSplitter (proportions=[], names=[])

Create a splitter that divides subpopulations by *proportions*, which should be a list of float numbers (between 0 and 1) that add up to 1. A default set of names are given to each VSP unless a new set of names is given by parameter *names*.

#### name(vsp)

Return the name of VSP *vsp*, which is "Prop p" where p=propotions[vsp]. A user specified name will be returned if specified.

# numVirtualSubPop()

Return the number of VSPs defined by this splitter, which is the length of parameter proportions.

# 1.2.6 Class RangeSplitter

This class defines a splitter that groups individuals in certain ranges into VSPs.

# class RangeSplitter (ranges, names=[])

Create a splitter according to a number of individual ranges defined in *ranges*. For example, RangeSplitter(ranges=[[0, 20], [40, 50]]) defines two VSPs. The first VSP consists of individuals 0, 1, ..., 19, and the second VSP consists of individuals 40, 41, ..., 49. Note that a nested list has to be used even if only one range is defined. A default set of names are given to each VSP unless a new set of names is given by parameter *names*.

# name(vsp)

Return the name of VSP vsp, which is "Range [a, b]" where [a, b] is range ranges [vsp]. A user specified name will be returned if specified.

# numVirtualSubPop()

Return the number of VSPs, which is the number of ranges defined in parameter ranges.

# 1.2.7 Class GenotypeSplitter

This class defines a VSP splitter that defines VSPs according to individual genotype at specified loci.

# class GenotypeSplitter (loci, alleles, phase=False, names=[])

Create a splitter that defines VSPs by individual genotype at *loci* (a locus index or a list of loci indexes). Each list in a list *allele* defines a VSP, which is a list of allowed alleles at these *loci*. If only one VSP is defined, the outer list of the nested list can be ignored. If phase if true, the order of alleles in each list is significant. If more than one set of alleles are given, Individuals having either of them is qualified.

For example, in a haploid population, loci=1, alleles=[0, 1] defines a VSP with individuals having allele 0 or 1 at locus 1, alleles=[[0, 1], [2]] defines two VSPs with individuals in the second VSP having allele 2 at locus 1. If multiple loci are involved, alleles at each locus need to be defined. For example, VSP defined by loci=[0, 1], alleles=[0, 1, 1, 1] consists of individuals having alleles [0, 1] or [1, 1] at loci [0, 1].

In a haploid population, loci=1, loci=1, alleles=[0, 1] defines a VSP with individuals having genotype [0, 1] or [1, 0] at locus 1. alleles[[0, 1], [2, 2]] defines two VSPs with individuals in the second VSP having genotype [2, 2] at locus 1. If *phase* is set to True, the first VSP will only has individuals with genotype [0, 1]. In the multiple loci case, alleles should be arranged by haplotypes, for example, loci=[0, 1], alleles=[0, 0, 1, 1], phase=True defines a VSP with individuals having genotype -0-0-, -1-1- at loci 0 and 1. If phase=False (default), genotypes -1-1-, -0-0-, -0-1- and -1-0- are all allowed.

A default set of names are given to each VSP unless a new set of names is given by parameter names.

#### name (vsp)

Return name of VSP vsp, which is "Genotype loc1, loc2:genotype" as defined by parameters *loci* and *alleles*. A user provided name will be returned if specified.

# numVirtualSubPop()

Number of virtual subpops of subpopulation sp

# 1.2.8 Class CombinedSplitter

This splitter takes several splitters and stacks their VSPs together. For example, if the first splitter defines 3 VSPs and the second splitter defines 2, the two VSPs from the second splitter become the fourth (index 3) and the fifth (index 4) VSPs of the combined splitter. In addition, a new set of VSPs could be defined as the union of one or more of the original VSPs. This splitter is usually used to define different types of VSPs to a population.

```
class CombinedSplitter (splitters=[], vspMap=[], names=[])
```

Create a combined splitter using a list of *splitters*. For example, CombinedSplitter([SexSplitter(), AffectionSplitter()]) defines a combined splitter with four VSPs, defined by male (vsp 0), female

1.2. Virtual splitters 15

(vsp 1), unaffected (vsp 2) and affected individuals (vsp 3). Optionally, a new set of VSPs could be defined by parameter *vspMap*. Each item in this parameter is a list of VSPs that will be combined to a single VSP. For example, vspMap=[(0, 2), (1, 3)] in the previous example will define two VSPs defined by male or unaffected, and female or affected individuals. VSP names are usually determined by splitters, but can also be specified using parameter *names*.

#### name(vsp)

Return the name of a VSP *vsp*, which is the name a VSP defined by one of the combined splitters unless a new set of names is specified.

# numVirtualSubPop()

Return the number of VSPs defined by this splitter, which is the sum of the number of VSPs of all combined splitters.

# 1.2.9 Class ProductSplitter

This splitter takes several splitters and take their intersections as new VSPs. For example, if the first splitter defines 3 VSPs and the second splitter defines 2, 6 VSPs will be defined by splitting 3 VSPs defined by the first splitter each to two VSPs. This splitter is usually used to define finer VSPs from existing VSPs.

# class ProductSplitter (splitters=[], names=[])

Create a product splitter using a list of *splitters*. For example, ProductSplitter([SexSplitter(), AffectionSplitter()]) defines four VSPs by male unaffected, male affected, female unaffected, and female affected individuals. VSP names are usually determined by splitters, but can also be specified using parameter *names*.

#### name(vsp)

Return the name of a VSP *vsp*, which is the names of indivdual VSPs separated by a comma, unless a new set of names is specified for each VSP.

#### numVirtualSubPop()

Return the number of VSPs defined by this splitter, which is the sum of the number of VSPs of all combined splitters.

# 1.3 Mating Schemes

# 1.3.1 Class HomoMating

A homogeneous mating scheme that uses a parent chooser to choose parents from a prental generation, and an offspring generator to generate offspring from chosen parents. It can be either used directly, or within a heterogeneous mating scheme. In the latter case, it can be applied to a (virtual) subpopulation.

# class HomoMating (chooser, generator, subPopSize=[], subPops=ALL\_AVAIL, weight=0)

Create a homogeneous mating scheme using a parent chooser chooser and an offspring generator generator.

If this mating scheme is used directly in a simulator, it will be responsible for creating an offspring population according to parameter *subPopSize*. This parameter can be a list of subpopulation sizes (or a number if there is only one subpopulation) or a Python function which will be called at each generation, just before mating, to determine the subpopulation sizes of the offspring generation. The function should be defined with one or both parameters of gen and pop where gen is the current generation number and pop is the parental population just before mating. The return value of this function should be a list of subpopulation sizes for the offspring generation. A single number can be returned if there is only one subpopulation. The passed parental population is usually used to determine offspring population size from parental population size but you can also modify this population to prepare for mating. A common practice is to split and merge parental populations in this function so that you demographic related information and actions could be implemented in the same function.

If this mating shome is used within a heterogeneous mating scheme. Parameters *subPops* and *weight* are used to determine which (virtual) subpopulations this mating scheme will be applied to, and how many offspring this mating scheme will produce. Please refer to mating scheme HeteroMating for the use of these two parameters.

```
clone()
```

Deep copy of a homogeneous mating scheme.

```
describe (format=True)
```

Describe a homogeneous mating scheme.

# 1.3.2 Class HeteroMating

A heterogeneous mating scheme that applies a list of mating schemes to different (virtual) subpopulations.

```
class HeteroMating (matingSchemes, subPopSize=[], shuffleOffspring=True)
```

Create a heterogeneous mating scheme that will apply a list of homogeneous mating schemes *matingSchemes* to different (virtual) subpopulations. The size of the offspring generation is determined by parameter *subPopSize*, which can be a list of subpopulation sizes or a Python function that returns a list of subpopulation sizes at each generation. Please refer to HomoMating for a detailed explanation of this parameter.

Each mating scheme defined in *matingSchemes* can be applied to one or more (virtual) subpopulation. If parameter *subPops* is not specified, a mating scheme will be applied to all subpopulations. If a list of (virtual) subpopulation is specified, the mating scheme will be applied to specific (virtual) subpopulations.

If multiple mating schemes are applied to the same subpopulation, a weight (parameter *weight*) can be given to each mating scheme to determine how many offspring it will produce. The default for all mating schemes are 0. In this case, the number of offspring each mating scheme produces is proportional to the size of its parental (virtual) subpopulation. If all weights are negative, the numbers of offspring are determined by the multiplication of the absolute values of the weights and their respective parental (virtual) subpopulation sizes. If all weights are positive, the number of offspring produced by each mating scheme is proportional to these weights. Mating schemes with zero weight in this case will produce no offspring. If both negative and positive weights are present, negative weights are processed before positive ones.

If multiple mating schemes are applied to the same subpopulation, offspring produced by these mating schemes are shuffled randomly. If this is not desired, you can turn off offspring shuffling by setting parameter *shuffleOff-spring* to False.

```
clone()
```

Deep copy of a heterogeneous mating scheme

```
describe (format=True)
```

Describe a heterogeneous mating scheme.

# 1.3.3 Class SequentialParentChooser

This parent chooser chooses a parent from a parental (virtual) subpopulation sequentially. Sex and selection is not considered. If the last parent is reached, this parent chooser will restart from the beginning of the (virtual) subpopulation.

#### class SequentialParentChooser()

Create a parent chooser that chooses a parent from a parental (virtual) subpopulation sequentially.

#### clone()

Deep copy of a sequential parent chooser.

```
describe (format=True)
```

Describe a sequential parent chooser

# 1.3.4 Class SequentialParentsChooser

This parent chooser chooses two parents (a father and a mother) sequentially from their respective sex groups. Selection is not considered. If all fathers (or mothers) are exhausted, this parent chooser will choose fathers (or mothers) from the beginning of the (virtual) subpopulation again.

# class SequentialParentsChooser()

Create a parent chooser that chooses two parents sequentially from a parental (virtual) subpopulation.

clone()

Deep copy of a sequential parents chooser.

describe (format=True)

Describe a sequential parents chooser.

# 1.3.5 Class RandomParentChooser

This parent chooser chooses a parent randomly from a (virtual) parental subpopulation. Parents are chosen with or without replacement. If parents are chosen with replacement, a parent can be selected multiple times. If natural selection is enabled, the probability that an individual is chosen is proportional to his/her fitness value stored in an information field *selectionField* (default to "fitness"). If parents are chosen without replacement, a parent can be chosen only once. An RuntimeError will be raised if all parents are exhausted. Selection is disabled in the without-replacement case.

# class RandomParentChooser (replacement=True, selectionField="fitness")

Create a random parent chooser that choose parents with or without replacement (parameter *replacement*, default to True). If selection is enabled and information field *selectionField* exists in the passed population, the probability that a parent is chosen is proportional to his/her fitness value stored in *selectionField*.

clone()

Deep copy of a random parent chooser.

describe (format=True)

Describe a random parent chooser

# 1.3.6 Class RandomParentsChooser

This parent chooser chooses two parents, a male and a female, randomly from a (virtual) parental subpopulation. Parents are chosen with or without replacement from their respective sex group. If parents are chosen with replacement, a parent can be selected multiple times. If natural selection is enabled, the probability that an individual is chosen is proportional to his/her fitness value among all individuals with the same sex. Selection will be disabled if specified information field <code>selectionField</code> (default to "fitness") does not exist. If parents are chosen without replacement, a parent can be chosen only once. An RuntimeError will be raised if all males or females are exhausted. Selection is disabled in the without-replacement case.

# class RandomParentsChooser (replacement=True, selectionField="fitness")

Create a random parents chooser that choose two parents with or without replacement (parameter *replacement*, default to True). If selection is enabled and information field *selectionField* exists in the passed population, the probability that a parent is chosen is proportional to his/her fitness value stored in *selectionField*.

clone()

Deep copy of a random parents chooser.

describe (format=True)

Describe a random parents chooser

# 1.3.7 Class PolyParentsChooser

This parent chooser is similar to random parents chooser but instead of selecting a new pair of parents each time, one of the parents in this parent chooser will mate with several spouses before he/she is replaced. This mimicks multi-spouse mating schemes such as polygyny or polyandry in some populations. Natural selection is supported for both sexes.

# class PolyParentsChooser (polySex=MALE, polyNum=1, selectionField="fitness")

Create a multi-spouse parents chooser where each father (if *polySex* is MALE) or mother (if *polySex* is FE-MALE) has *polyNum* spouses. The parents are chosen with replacement. If natural selection is enabled, the probability that an individual is chosen is proportional to his/her fitness value among all individuals with the same sex. Selection will be disabled if specified information field *selectionField* (default to "fitness") does not exist.

```
clone()
    Deep copy of a parent chooser.
describe (format=True)
    Describe a polygenic parents chooser
```

# 1.3.8 Class AlphaParentsChooser

This parent chooser mimicks some animal populations where only certain individuals (usually males) can mate. Alpha individuals can be chosen either randomly (with natural selection) or according to an information field. After the alpha individuals are selected, the parent chooser works identical to a random mating scheme, except that one of the parents are chosen from these alpha individuals.

```
class AlphaParentsChooser (alphaSex=MALE, alphaNum=0, alphaField="", selectionField="fitness")
```

Create a parent chooser that chooses father (if *alphaSex* is MALE) or mother (if *alphaSex* is FEMALE) from a selected group of alpha individuals. If *alphaNum* is given, alpha individuals are chosen randomly or according to individual fitness if natural selection is enabled. If *alphaField* is given, individuals with non-zero values at this information field are considered as alpha individuals. After alpha individuals are selected, *alphaSex* parent will be chosen from the alpha individuals randomly or according to individual fitness. The other parents are chosen randomly.

```
clone()
    Deep copy of an alpha parents chooser.
describe (format=True)
    Describe an alpha parents chooser
```

# 1.3.9 Class PyParentsChooser

This parents chooser accept a Python generator function that repeatedly yields one or two parents, which can be references to individual objects or indexes relative to each subpopulation. The parent chooser calls the generator function with parental population and a subpopulation index for each subpopulation and retrieves parents repeatedly using the iterator interface of the generator function.

This parent chooser does not support virtual subpopulation directly. However, because virtual subpopulations are defined in the passed parental population, it is easy to return parents from a particular virtual subpopulation using virtual subpopulation related functions.

#### class PyParentsChooser (parentsGenerator)

Create a Python parent chooser using a Python generator function *parentsGenerator*. This function should accept a population object (the parental population) and a subpopulation number and return the reference or

index (relative to subpopulation) of a parent or a pair of parents repeatedly using the iterator interface of the generator function.

clone()

Deep copy of a python parent chooser.

describe (format=True)

Describe a hybrid parent chooser

# 1.3.10 Class OffspringGenerator

An *offspring generator* generates offspring from parents chosen by a parent chooser. It is responsible for creating a certain number of offspring, determining their sex, and transmitting genotypes from parents to offspring.

# class OffspringGenerator (ops, numOffspring=1, sexMode=RANDOM\_SEX)

Create a basic offspring generator. This offspring generator uses *ops* genotype transmitters to transmit genotypes from parents to offspring.

A number of *during-mating operators* (parameter *ops*) can be used to, among other possible duties such as setting information fields of offspring, transmit genotype from parents to offspring. This general offspring generator does not have any default during-mating operator but all stock mating schemes use an offspring generator with a default operator. For example, a mendelianOffspringGenerator is used by RandomMating to trasmit genotypes. Note that applicability parameters begin, step, end, at and reps could be used in these operators but negative population and generation indexes are unsupported.

Parameter *numOffspring* is used to control the number of offspring per mating event, or in another word the number of offspring in each family. It can be a number, a function, or a mode parameter followed by some optional arguments. If a number is given, given number of offspring will be generated at each mating event. If a Python function is given, it will be called each time when a mating event happens. Current generation number will be passed to this function, and its return value will be considered the number of offspring. In the last case, a tuple (or a list) in one of the following forms: (GEOMETRIC\_DISTRIBUTION, p), (POISSON\_DISTRIBUTION, p), (BINOMIAL\_DISTRIBUTION, p, N), or (UNIFORM\_DISTRIBUTION, a, b) can be given. The number of offspring will be determined randomly following these statistical distributions. Please refer to the simuPOP user's guide for a detailed description of these distributions and their parameters.

Parameter *sexMode* is used to control the sex of each offspring. Its default value is usually *RANDOM\_SEX* which assign MALE or FEMALE to each individual randomly, with equal probabilities. If NO\_SEX is given, all individuals will be MALE. *sexMode* can also be one of (PROB\_OF\_MALES, p), (NUM\_OF\_MALES, n), and (NUM\_OF\_FEMALES, n). The first case specifies the probability of male for each offspring. The next two cases specifies the number of male or female individuals in each family, respectively. If n is greater than or equal to the number of offspring in this family, all offspring in this family will be MALE or FEMALE.

clone ()

Make a deep copy of this offspring generator.

describe (format=True)

Describe an offspring generator

# 1.3.11 Class ControlledOffspringGenerator

This offspring generator populates an offspring population and controls allele frequencies at specified loci. At each generation, expected allele frequencies at these loci are passed from a user defined allele frequency *trajectory* function. The offspring population is populated in two steps. At the first step, only families with disease alleles are accepted until until the expected number of disease alleles are met. At the second step, only families with wide type alleles are accepted to populate the rest of the offspring generation. This method is described in detail in "Peng et al, (2007) PLoS Genetics".

class ControlledOffspringGenerator (loci, alleles, freqFunc, ops=[], numOffspring=1, sex- $Mode=RANDOM\ SEX$ )

Create an offspring generator that selects offspring so that allele frequency at specified loci in the offspring generation reaches specified allele frequency. At the beginning of each generation, expected allele frequency of *alleles* at *loci* is returned from a user-defined trajectory function *freqFunc*. If there is no subpopulation, this function should return a list of frequencies for each locus. If there are multiple subpopulations, *freqFunc* can return a list of allele frequencies for all subpopulations or combined frequencies that ignore population structure. In the former case, allele frequencies should be arranged by loc0\_sp0, loc1\_sp0, ... loc0\_sp1, loc1\_sp1, ..., and so on. In the latter case, overall expected number of alleles are scattered to each subpopulation in proportion to existing number of alleles in each subpopulation, using a multinomial distribution.

After the expected alleles are calculated, this offspring generator accept and reject families according to their genotype at *loci* until allele frequecies reach their expected values. The rest of the offspring generation is then filled with families without only wild type alleles at these *loci*.

This offspring generator is derived from class *OffspringGenerator*. Please refer to class *OffspringGenerator* for a detailed description of parameters *ops*, *numOffspring* and *sexMode*.

clone()

Deep copy of a controlled random mating scheme.

describe (format=True)

Describe a controlled offspring generator

# 1.4 Pre-defined mating schemes

# 1.4.1 Class CloneMating

A homogeneous mating scheme that uses a sequential parent chooser and a clone offspring generator. Please refer to class OffspringGenerator for parameters *ops* and *numOffspring*, and to class HomoMating for parameters *subPopSize*, *subPops* and *weight*. Parameters *sexMode* and *selectionField* are ignored because this mating scheme does not support natural selection, and CloneGenoTransmitter copies sex from parents to offspring. Note that CloneGenoTransmitter by default also copies all parental information fields to offspring.

#### 1.4.2 Class RandomSelection

A homogeneous mating scheme that uses a random single-parent parent chooser with replacement, and a clone off-spring generator. This mating scheme is usually used to simulate the basic haploid Wright-Fisher model but it can also be applied to diploid populations. Please refer to class RandomParentChooser for parameter selectionField, to class OffspringGenerator for parameters ops and numOffspring, and to class HomoMating for parameters subPopSize, subPops and weight. Parameter sexMode is ignored because cloneOffspringGenerator copies sex from parents to offspring.

# 1.4.3 Class RandomMating

A homogeneous mating scheme that uses a random parents chooser with replacement and a Mendelian offspring generator. This mating scheme is widely used to simulate diploid sexual Wright-Fisher random mating. Please refer to

class RandomParentsChooser for parameter selectionField, to class OffspringGenerator for parameters ops, sexMode and numOffspring, and to class HomoMating for parameters subPopSize, subPops and weight.

# 1.4.4 Class Monogamous Mating

A homogeneous mating scheme that uses a random parents chooser without replacement and a Mendelian offspring generator. It differs from the basic random mating scheme in that each parent can mate only once so there is no half-sibling in the population. Please refer to class OffspringGenerator for parameters ops, sexMode and numOffspring, and to class HomoMating for parameters subPopSize, subPops and weight. Parameter selectionField is ignored because this mating scheme does not support natural selection.

# 1.4.5 Class Polygamous Mating

A homogeneous mating scheme that uses a multi-spouse parents chooser and a Mendelian offspring generator. It differs from the basic random mating scheme in that each parent of sex *polySex* will have *polyNum* spouses. Please refer to class PolyParentsChooser for parameters *polySex*, *polyNum* and *selectionField*, to class OffspringGenerator for parameters *ops*, *sexMode* and *numOffspring*, and to class HomoMating for parameters *subPopSize*, *subPops* and *weight*.

# 1.4.6 Class AlphaMating

A homogeneous mating scheme that uses a alpha-individual parents chooser and a Mendelian offspring generator. It differs from the basic random mating scheme in that selection of parents of sex *alphaSex* is limited to certain alpha individuals, which are chosen either randomly (parameter *alphaNum*) or from an information field (parameter *alphaField*). This mating scheme is usually used to simulate animal population where only a few alpha individuals have the right to mate. Please refer to class AlphaParentsChooser for parameters *alphaSex*, *alphaNum*, *alphaField* and *selectionField*, to class OffspringGenerator for parameters *ops*, *sexMode* and *numOffspring*, and to class HomoMating for parameters *subPopSize*, *subPops* and *weight*.

# 1.4.7 Class HaplodiploidMating

A homogeneous mating scheme that uses a random parents chooser with replacement and a haplodiploid off-spring generator. It should be used in a haplodiploid population where male individuals only have one set of homologous chromosomes. Please refer to class RandomParentsChooser for parameter selectionField, to class OffspringGenerator for parameters ops, sexMode and numOffspring, and to class HomoMating for parameters subPopSize, subPops and weight.

 $\textbf{class HaplodiploidMating} \ (numOffspring=1.0, sexMode=RANDOM\_SEX, ops=< simuPOP. HaplodiploidGenoTransmitter>, subPopSize=[], subPops=ALL\_AVAIL, weight=0, selectionField='fitness')$ 

# 1.4.8 Class SelfMating

A homogeneous mating scheme that uses a random single-parent parent chooser with or without replacement (parameter *replacement*) and a selfing offspring generator. It is used to mimic self-fertilization in certain plant populations. Please refer to class RandomParentChooser for parameter *replacement* and *selectionField*, to class OffspringGenerator for parameters *ops*, *sexMode* and *numOffspring*, and to class HomoMating for parameters *subPopSize*, *subPops* and *weight*.

```
 \begin{array}{ll} \textbf{class SelfMating} \ (replacement = True, & numOffspring = 1, & sexMode = RANDOM\_SEX, \\ ops = < simuPOP.SelfingGenoTransmitter >, \ subPopSize = [], \ subPops = ALL\_AVAIL, \ weight = 0, \\ selectionField = 'fitness') \end{array}
```

# 1.4.9 Class ControlledRandomMating

A homogeneous mating scheme that uses a random sexual parents chooser with replacement and a controlled off-spring generator using Mendelian genotype transmitter. At each generation, function *freqFunc* will be called to obtain intended frequencies of alleles at loci *loci*. The controlled offspring generator will control the acceptance of off-spring so that the generation reaches desired allele frequencies at these loci. If *loci* is empty or *freqFunc* is None, this mating scheme works identically to a RandomMating scheme. Rationals and applications of this mating scheme is described in details in a paper *Peng et al*, 2007 (*PLoS Genetics*). Please refer to class RandomParentsChooser for parameters *selectionField*, to class ControlledOffspringGenerator for parameters *loci*, *alleles*, *freqFunc*, to class OffspringGenerator for parameters *ops*, *sexMode* and *numOffspring*, and to class HomoMating for parameters *subPopSize*, *subPops* and *weight*.

```
 \begin{array}{lll} \textbf{class ControlledRandomMating} & (loci=[], & alleles=[], & freqFunc=None, & numOffspring=1, & sex-\\ & Mode=RANDOM\_SEX, & ops=<simuPOP.MendelianGenoTransmitter>, \\ & subPopSize=[], subPops=ALL\_AVAIL, weight=0, selectionField='fitness') \end{array}
```

# 1.5 Utility Classes

# 1.5.1 Class WithArgs

This class wraps around a function func and provides an attribute args so that simuPOP knows which parameters to send to the function. args should be a list of parameter names.

class WithArgs (func, args)

# 1.5.2 Class RNG

This random number generator class wraps around a number of random number generators from GNU Scientific Library. You can obtain and change the RNG used by the current simuPOP module through the getRNG() function, or create a separate random number generator and use it in your script.

```
class RNG (name=None, seed=0)
```

Create a RNG object using specified name and seed. If *rng* is not given, environmental variable GSL\_RNG\_TYPE will be used if it is available. Otherwise, generator mt19937 will be used. If *seed* is not given, /dev/urandom, /dev/random, or other system random number source will be used to guarantee that random seeds are used even if more than one simuPOP sessions are started simultaneously. Names of supported random number generators are available from moduleInfo() ['availableRNGs'].

```
setRNG (name=None, seed=0)
```

Use another underlying RNG for the current RNG object. The handling of parameters *rng* and *seed* is the same as RNG::RNG (name, seed).

1.5. Utility Classes 23

#### setSeed(seed=0)

Set random seed for this random number generator. If seed is 0, method described in setRNG is used.

#### name()

Return the name of the current random number generator.

#### seed (

Return the seed used to initialize the RNG. This can be used to repeat a previous session.

#### randInt(n)

Return a random number in the range of  $[0, 1, 2, \dots n-1]$ 

#### randUniform()

Generate a random number following a rng\_uniform [0, 1) distribution.

#### randBinomial(n, p)

Generate a random number following a binomial distribution with parameters n and p.

## randChisq(nu)

Generate a random number following a Chi-squared distribution with *nu* degrees of freedom.

#### randExponential (mu)

Generate a random number following a exponential distribution with parameter mu.

#### randGamma(a, b)

Generate a random number following a gamma distribution with parameters a and b.

#### randGeometric(p)

Generate a random number following a geometric distribution with parameter p.

#### randMultinomial(N, p)

Generate a random number following a multinomial distribution with parameters N and p (a list of probabilities).

#### randNormal (mu, sigma)

Generate a random number following a normal distribution with mean mu and standard deviation sigma.

# randPoisson(mu)

Generate a random number following a Poisson distribution with parameter mu.

# 1.6 Global functions

# closeOutput (output="")

Output files specified by '>' are closed immediately after they are written. Those specified by '>>' and '>>>' are closed by a Simulator after Simulator.evolve(). However, these files will be kept open if the operators are applied directly to a population using the operators' function form. In this case, function closeOutput can be used to close a specific file *output*, and close all unclosed files if *output* is unspecified. An exception will be raised if *output* does not exist or it has already been closed.

describe (initOps=[], preOps=[], matingScheme=MatingScheme, postOps=[], finalOps=[], gen=-1, numRep=1)

This function takes the same parameters as Simulator.evolve and output a description of how an evolutionary process will be executed, basically by calling the describe() function of all operators. It is recommended that you call this function if you have any doubt how your simulation will proceed.

# loadPopulation(file)

Load a population from a file.

## moduleInfo()

Return a dictionary with information regarding the currently loaded simuPOP module. This dictionary has the following keys:

- •revision: revision number.
- •version: simuPOP version string.
- •optimized: Is this module optimized (True or False).
- •alleleType: Allele type of the module (short, long or binary).
- •maxAllele: the maximum allowed allele state, which is 1 for binary modules, 255 for short modules and 65535 for long modules.
- •compiler: the compiler that compiles this module.
- •date: date on which this module is compiled.
- •python: version of python.
- •platform: platform of the module.
- •maxNumSubPop: maximum number of subpopulations.
- •maxIndex: maximum index size (limits population size \* total number of marker).
- •debug: A list of effective debugging codes.

# getRNG()

Return the currently used random number generator

# setRNG(rng="", seed=0)

Set random number generator. If seed=0 (default), a random seed will be given. If rng="", seed will be set to the current random number generator.

# turnOnDebug (code="")

Set debug code *code*. More than one code could be specified using a comma separated string. Name of available codes are available from moduleInfo() ['debug'].keys().

# turnOffDebug(code="DBG\_ALL")

Turn off debug code *code*. More than one code could be specified using a comma separated string. Default to turn off all debug codes.

1.6. Global functions 25

# Chapter 2

# **Operator References**

## 2.1 Base class for all operators

## 2.1.1 Class BaseOperator

Operators are objects that act on populations. They can be applied to populations directly using their function forms, but they are usually managed and applied by a simulator. In the latter case, operators are passed to the evolve function of a simulator, and are applied repeatedly during the evolution of the simulator.

The *BaseOperator* class is the base class for all operators. It defines a common user interface that specifies at which generations, at which stage of a life cycle, to which populations and subpopulations an operator is applied. These are achieved by a common set of parameters such as begin, end, step, at, stage for all operators. Note that a specific operator does not have to honor all these parameters. For example, a Recombinator can only be applied during mating so it ignores the stage parameter.

An operator can be applied to all or part of the generations during the evolution of a simulator. At the beginning of an evolution, a simulator is usually at the beginning of generation 0. If it evolves 10 generations, it evolves generations 0, 1, ,,,, and 9 (10 generations) and stops at the begging of generation 10. A negative generation number a has generation number 10 + a, with -1 referring to the last evolved generation 9. Note that the starting generation number of a simulator can be changed by its setGen() member function.

Output from an operator is usually directed to the standard output (sys.stdout). This can be configured using a output specification string, which can be "for no output, '>' standard terminal output (default), a filename prefixed by one or more '>' characters or a Python expression indicated by a leading exclamation mark ('!expr'). In the case of '>filename' (or equivalently 'filename'), the output from an operator is written to this file. However, if two operators write to the same file filename, or if an operator writes to this file more than once, only the last write operation will succeed. In the case of '>>filename', file filename will be opened at the beginning of the evolution and closed at the end. Outputs from multiple operators are appended. >>>filename works similar to >>filename but filename, if it already exists at the beginning of an evolutionary process, will not be cleared. If the output specification is prefixed by an exclamation mark, the string after the mark is considered as a Python expression. When an operator is applied to a population, this expression will be evaluated within the population's local namespace to obtain a population specific output specification. As an advanced feature, a Python function can be assigned to this parameter. Output strings will be sent to this function for processing.

class BaseOperator (output, begin, end, step, at, reps, subPops, infoFields)

The following parameters can be specified by all operators. However, an operator can ignore some parameters and the exact meaning of a parameter can vary.

output: A string that specifies how output from an operator is written, which can be " (no output), '>' (standard output), 'filename' prefixed by one or more '>', or an Python expression prefixed by an exclamation

mark ('!expr'). Alternatively, a Python function can be given to handle outputs.

- *begin:* The starting generation at which an operator will be applied. Default to 0. A negative number is interpreted as a generation counted from the end of an evolution (-1 being the last evolved generation).
- end: The last generation at which an operator will be applied. Default to -1, namely the last generation.
- step: The number of generations between applicable generations. Default to 1.
- at: A list of applicable generations. Parameters begin, end, and step will be ignored if this parameter is specified. A single generation number is also acceptable.
- reps: A list of applicable replicates. A common default value ALL\_AVAIL is interpreted as all replicates in a simulator. Negative indexes such as -1 (last replicate) is acceptable. rep=idx can be used as a shortcut for rep=[idx].
- subPops: A list of applicable (virtual) subpopulations, such as subPops=[sp1, sp2, (sp2, vsp1)].
  subPops=[sp1] can be simplied as subPops=sp1. Negative indexes are not supported. A common default value (ALL\_AVAIL) of this parameter reprents all subpopulations of the population being aplied.
  Suport for this parameter vary from operator to operator and some operators do not support virtual subpopulations at all. Please refer to the reference manual of individual operators for their support for this parameter.
- *infoFields*: A list of information fields that will be used by an operator. You usually do not need to specify this parameter because operators that use information fields usually have default values for this parameter.

#### apply(pop)

Apply an operator to population *pop* directly, without checking its applicability.

clone()

Return a cloned copy of an operator. This function is available to all operators.

initializeIfNeeded(pop)

FIXME: No document

#### 2.2 Initialization

### 2.2.1 Class InitSex (Can be applied directly using function initSex)

This operator initialize sex of individuals, either randomly or use a list of sexes.

```
class InitSex (maleFreq=0.5, maleProp=-1, sex=[], begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, sub-
Pops=ALL_AVAIL, infoFields=[])
```

Create an operator that initialize individual sex to MALE or FEMALE. By default, it assign sex to individuals randomly, with equal probability of having a male or a female. This probabability can be adjusted through parameter *maleFreq* or be made to exact proportions by specifying parameter *maleProp*. Alternatively, a fixed sequence of sexes can be assigned. For example, if sex=[MALE, FEMALE], individuals will be assigned MALE and FEMALE successively. Parameter *maleFreq* or *maleProp* are ignored if *sex* is given. If a list of (virtual) subpopulation is specified in parameter *subPop*, only individuals in these subpopulations will be initialized. Note that the *sex* sequence, if used, is assigned repeatedly regardless of (virtual) subpopulation boundaries.

```
apply(pop)
```

Apply this operator to population pop

clone()

Deep copy of an InitSex operator.

## 2.2.2 Class InitByFreq (Can be applied directly using function initByFreq)

This operator assigns alleles at all or part of loci with given allele frequencies. Alternatively, an individual can be initialized and be copied to all individuals in the same (virtual) subpopulations.

This function creates an initializer that initializes individual genotypes randomly, using allele frequencies specified in parameter *alleleFreq*. Elements in *alleleFreq* specifies the allele frequencies of allele 0, 1, ... respectively. These frequencies should add up to 1. If *loci*, *ploidy* and/or *subPop* are specified, only specified loci, ploidy, and individuals in these (virtual) subpopulations will be initialized. If *identicalInds* is True, the first individual in each (virtual) subpopulation will be initialized randomly, and be copied to all other individuals in this (virtual) subpopulation. If a list of frequencies are given, they will be used for each (virtual) subpopulation. This operator initializes all chromosomes, including unused genotype locations and customized chromosomes.

```
apply (pop)
     Apply this operator to population pop
clone()
     Deep copy of the operator InitByFreq
```

## 2.2.3 Class InitByValue (Can be applied directly using function initByValue)

This operator initialize individuals by given values.

This function creates an initializer that initializes individual genotypes with given genotype *value*. If *loci*, *ploidy* and/or *subPop* are specified, only specified loci, ploidy, and individuals in these (virtual) subpopulations will be initialized. *value* can be used to initialize given *loci*, all loci, and all homologous copies of these loci. If *freq* (a list of positive numbers that add up to 1) is given, *value* should be a list of values that will be assigned randomly according to their respective proportion. Althernatively, you can use parameter *proportions* which assign values randomly, but with exact proportion. If a list of values are given without *frequencies* or *proportions*, they will be used for each (virtual) subpopulations. This operator initializes all chromosomes, including unused genotype locations and customized chromosomes.

```
apply (pop)
    Apply this operator to population pop
clone()
    Deep copy of the operator InitByValue
```

## **2.2.4 Class InitInfo (Can be applied directly using function** initInfo)

This operator initializes given information fields with a sequence of values, or a user-provided function such as random, random.

class InitInfo (values, begin=0, end=-1, step=1, at=[], reps=ALL\_AVAIL, subPops=ALL\_AVAIL, infoFields=[])

Create an operator that initialize individual information fields infoFields using a sequence of values or a user-defined function. If a list of values are given, it will be used sequentially for all individuals. The values will be reused if its length is less than the number of individuals. The values will be assigned repeatedly regardless of subpopulation boundaries. If a Python function is given, it will be called, without any argument, whenever a value is needed. If a list of (virtual) subpopulation is specified in parameter subPop, only individuals in these subpopulations will be initialized.

2.2. Initialization 29

```
apply (pop)
    Apply this operator to population pop
clone()
    Deep copy of an InitInfo operator.
```

## 2.3 Expression and Statements

## 2.3.1 Class PyOutput

This operator outputs a given string when it is applied to a population.

Creates a PyOutput operator that outputs a string *msg* to *output* (default to standard terminal output) when it is applied to a population. Please refer to class BaseOperator for a detailed description of common operator parameters such as *stage*, *begin* and *output*.

```
apply (pop)
    Simply output some info
clone()
    Deep copy of a PyOutput operator.
```

## **2.3.2 Class PyEval (Can be applied directly using function** pyEval)

A PyEval operator evaluates a Python expression in a population's local namespace when it is applied to this population. The result is written to an output specified by parameter *output*.

Crete a PyEval operator that evaluates a Python expression *expr* in a population's local namespace when it is applied to this population. If Python statements *stmts* is given (a single or multi-line string), the statement will be executed before *expr*. If *exposePop* is set to an non-empty string, the current population will be exposed in its own local namespace as a variable with this name. This allows the execution of expressions such as 'pop.individual(0).allele(0)'. The result of *expr* will be sent to an output stream specified by parameter output. The exposed population variable will be removed after *expr* is evaluated. Please refer to class BaseOperator for other parameters.

**Note** Although the statements and expressions are evaluated in a population's local namespace, they have access to a \*\*global\*\* namespace which is the module global namespace. It is therefore possible to refer to any module variable in these expressions. Such mixed use of local and global variables is, however, strongly discouraged.

```
apply (pop)

Apply the PyEval operator to population pop.
```

```
clone()
```

Deep copy of a PyEval operator

```
evaluate(pop)
```

Evaluate the expression and optional statements in the local namespace of population *pop* and return its result as a string.

## **2.3.3 Class PyExec (Can be applied directly using function pyExec)**

This operator executes given Python statements in a population's local namespace when it is applied to this population.

```
class PyExec (stmts="", exposePop="", output=">", begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, sub-Pops=ALL_AVAIL, infoFields=[])
```

Create a PyExec operator that executes statements *stmts* in a population's local namespace when it is applied to this population. If *exposePop* is given, current population will be exposed in its local namespace as a variable named by *exposePop*. Although multiple statements can be executed, it is recommended that you use this operator to execute short statements and use PyOperator for more complex once. Note that exposed population variable will be removed after the statements are executed.

```
clone()
```

Deep copy of a PyExec operator

#### 2.3.4 Class InfoEval (Can be applied directly using function infoEval)

Unlike operator PyEval and PyExec that work at the population level, in a population's local namespace, operator InfoEval works at the individual level, working with individual information fields. When this operator is applied to a population, information fields of eligible individuals are put into either a temporary dictionary or in the local namespace of the population. A Python expression is then evaluated for each individual. The result is written to an output.

#### Note:

Unlike operator "InfoExec", individual information fields are not updated after this operator is applied to a population. This operator tends to generate a large amount of output so use it is with caution.

Create an operator that evaluate a Python expression *expr* using individual information fields as variables. For each eligible individual (individuals in (virtual) subpopulations specified by parameter *subPops*, default to all individuals), its information fields are copied either to a temporary namespace (default) or the population's local namespace (if *usePopVars* is True). If *exposeInd* is not empty, the individual itself will be exposed in this namespace as a variable with name specified by *exposeInd*. In the usePopVars=True case, any population variable whose name matches an information field or *exposeInd* will be silently overridden.

A Python expression (*expr*) is evaluated for each individual. The results are converted to strings and are written to an output specified by parameter *output*. Optionally, a statement (or several statements separated by newline) can be executed before *expr* is evaluated.

This operator is by default applied post-mating. If it stage is set to DuringMating, it will be applied to all offspring, regardless of subPops settings.

**Note** Although *expr* is evaluated in individual or population level local namespaces, it can also access a global namespace which is the module namespace of your script. However, using module level variables and functions in this operator is discouraged.

```
apply (pop)
    Apply the InfoEval operator
clone()
    Deep copy of a InfoEval operator
```

## 2.3.5 Class InfoExec (Can be applied directly using function infoExec)

Operator InfoExec is similar to InfoEval in that it works at the individual level, using individual information

fields as variables. The difference is that instead of evaluating an expression and outputing its result, this operator execute one or more statements and **update individual information fields** from the namespace after the specified statements are execuated. This implies that you have to set new values to information fields through variables (e.g. "a = 5"), not through functions (e.g. "ind.setInfo(5, 'a')" with individuals exposed as "ind" will not work).

```
class InfoExec (stmts="", usePopVars=False, exposeInd="", output="", begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, subPops=ALL_AVAIL, infoFields=[])
```

Create an operator that executes Python statements *stmts* using individual information fields as variables. For each eligible individual (individuals in (virtual) subpopulations specified by parameter *subPops*, default to all individuals), its information fields are copied either to a temporary namespace (default) or the population's local namespace (if *usePopVars* is True). If *exposeInd* is not empty, the individual itself will be exposed in this namespace as a variable with name specified by *exposeInd*. In the usePopVars=True case, any population variable whose name matches an information field or *exposeInd* will be silently overridden.

One or more python statements (stmts) are executed for each individual. Information fields of these individuals are then updated from the corresponding variables. For example, a=1 will set information field a of all individuals to 1, a=b will set information field a of all individuals to information field b or a population variable b if b is not an information field but a population variable (needs usePopVars=True), and a=ind.sex() will set information field a of all individuals to its sex (needs exposeInd=' ind'.

This operator is by default applied post-mating. If it stage is set to DuringMating, it will be applied to all offspring, regardless of subPops settings.

**Note** Although *stmts* are executed in individual or population level local namespaces, they also have access to a global namespace which is the module namespace of your script. However, using module level variables and functions in *stmts* is discouraged.

```
apply (pop)
    Apply the InfoExec operator
clone()
    Deep copy of a InfoExec operator
```

# 2.4 Demographic models

### 2.4.1 Class Migrator

This operator migrates individuals from (virtual) subpopulations to other subpopulations, according to either prespecified destination subpopulation stored in an information field, or randomly according to a migration matrix.

In the former case, values in a specified information field (default to *migrate\_to*) are considered as destination subpopulation for each individual. If *subPops* is given, only individuals in specified (virtual) subpopulations will be migrated where others will stay in their original subpopulation. Negative values are not allowed in this information field because they do not represent a valid destination subpopulation ID.

In the latter case, a migration matrix is used to randomly assign destination subpoulations to each individual. The elements in this matrix can be probabilities to migrate, proportions of individuals to migrate, or exact number of individuals to migrate.

By default, the migration matrix should have m by m elements if there are m subpopulations. Element (i, j) in this matrix represents migration probability, rate or count from subpopulation i to j. If *subPops* (length m) and/or *toSubPops* (length n) are given, the matrix should have m by n elements, corresponding to specified source and destination subpopulations. Subpopulations in *subPops* can be virtual subpopulations, which makes it possible to migrate, for example, males and females at different rates from a subpopulation. If a subpopulation in *toSubPops* does not exist, it will be created. In case that all individuals from a subpopulation are migrated, the empty subpopulation will be kept.

If migration is applied by probability, the row of the migration matrix corresponding to a source subpopulation is

intepreted as probabilities to migrate to each destination subpopulation. Each individual's detination subpopulation is assigned randomly according to these probabilities. Note that the probability of staying at the present subpopulation is automatically calculated so the corresponding matrix elements are ignored.

If migration is applied by proportion, the row of the migration matrix corresponding to a source subpopulation is intepreted as proportions to migrate to each destination subpopulation. The number of migrants to each destination subpopulation is determined before random indidividuals are chosen to migrate.

If migration is applied by counts, the row of the migration matrix corresponding to a source subpopulation is interpreted as number of individuals to migrate to each defination subpopulation. The migrants are chosen randomly.

This operator goes through all source (virtual) subpopulations and assign defination subpopulation of each individual to an information field. Unexpected results may happen if individuals migrate from overlapping virtual subpopulations.

Create a Migrator that moves individuals from source (virtual) subpopulations *subPops* (default to migrate from all subpopulations) to destination subpopulations *toSubPops* (default to all subpopulations), according to existing values in an information field *infoFields*[0], or randomly according to a migration matrix *rate*. In the latter case, the size of the matrix should match the number of source and destination subpopulations.

Depending on the value of parameter *mode*, elements in the migration matrix (*rate*) are interpreted as either the probabilities to migrate from source to destination subpopulations (*mode* = BY\_PROBABILITY), proportions of individuals in the source (virtual) subpopulations to the destination subpopulations (*mode* = BY\_PROPORTION), numbers of migrants in the source (virtual) subpopulations (*mode* = BY\_COUNTS), or ignored completely (*mode* = BY\_IND\_INFO). In the last case, parameter *subPops* is respected (only Individuals in specified (virtual) subpopulations will migrate) but *toSubPops* is ignored.

This operator is by default applied pre-mating (parameter *stage*). Please refer to operator BaseOperator for a detailed explanation for all parameters.

```
apply (pop)
    Apply the Migrator to populaiton pop.
clone()
    Deep copy of a Migrator
rate()
    Return migration rate
```

#### **2.4.2 Class SplitSubPops (Can be applied directly using function** splitSubPops)

Split a given list of subpopulations according to either sizes of the resulting subpopulations, proportion of individuals, or an information field. The resulting subpopulations will have the same name as the original subpopulation.

```
class SplitSubPops (subPops=ALL_AVAIL, sizes=[], proportions=[], names=[], randomize=True, begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, infoFields=[])
```

Split a list of subpopulations *subPops* into finer subpopulations. A single subpopulation is acceptable but virtual subpopulations are not allowed. All subpopulations will be split if *subPops* is not specified.

The subpopulations can be split in three ways:

- •If parameter *sizes* is given, each subpopulation will be split into subpopulations with given size. The *sizes* should add up to the size of all original subpopulations.
- •If parameter *proportions* is given, each subpopulation will be split into subpopulations with corresponding proportion of individuals. *proportions* should add up to 1.

•If an information field is given (parameter *infoFields*), individuals having the same value at this information field will be grouped into a subpopulation. The number of resulting subpopulations is determined by the number of distinct values at this information field.

If parameter randomize is True (default), individuals will be randomized before a subpopulation is split. This is designed to remove artificial order of individuals introduced by, for example, some non-random mating schemes. Note that, however, the original individual order is not guaranteed even if this parameter is set to False.

Unless the last subpopulation is split, the indexes of existing subpopulations will be changed. If a subpopulation has a name, this name will become the name for all subpopulations separated from this subpopulation. Optionally, you can assign names to the new subpopulations using a list of names specified in parameter *names*. Because the same set of names will be used for all subpopulations, this parameter is not recommended when multiple subpopulations are split.

This operator is by default applied pre-mating (parameter *stage*). Please refer to operator BaseOperator for a detailed explanation for all parameters.

**Note** Unlike operator Migrator, this operator does not require an information field such as migrate\_to. apply (pop)

```
Apply a SplitSubPops operator
```

clone()

Deep copy of a SplitSubPops operator

#### **2.4.3 Class MergeSubPops (Can be applied directly using function mergeSubPops)**

This operator merges subpopulations *subPops* to a single subpopulation. If subPops is ignored, all subpopulations will be merged. Virtual subpopulations are not allowed in *subPops*.

```
class MergeSubPops (subPops=ALL_AVAIL, name="", begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, in-
foFields=[])
```

Create an operator that merges subpopulations *subPops* to a single subpopulation. If *subPops* is not given, all subpopulations will be merged. The merged subpopulation will take the name of the first subpopulation being merged unless a new *name* is given.

This operator is by default applied pre-mating (parameter *stage*). Please refer to operator BaseOperator for a detailed explanation for all parameters.

```
apply (pop)
     Apply a MergeSubPops operator
clone()
     Deep copy of a MergeSubPops operator
```

### **2.4.4 Class ResizeSubPops (Can be applied directly using function** resizeSubPops)

This operator resizes subpopulations to specified sizes. individuals are added or removed depending on the new subpopulation sizes.

Resize given subpopulations *subPops* to new sizes *size*, or sizes proportional to original sizes (parameter *proportions*). All subpopulations will be resized if *subPops* is not specified. If the new size of a subpopulation is smaller than its original size, extra individuals will be removed. If the new size is larger, new individuals with empty genotype will be inserted, unless parameter *propagate* is set to True (default). In this case, existing individuals will be copied sequentially, and repeatedly if needed.

This operator is by default applied pre-mating (parameter *stage*). Please refer to operator BaseOperator for a detailed explanation for all parameters.

```
\mathtt{apply}\left(pop\right)
```

Apply a ResizeSubPops operator

#### clone()

Deep copy of a ResizeSubPops operator

## 2.5 Genotype transmitters

#### 2.5.1 Class GenoTransmitter

This during mating operator is the base class of all genotype transmitters. It is made available to users because it provides a few member functions that can be used by derived transmitters, and by customized Python during mating operators.

Create a base genotype transmitter.

#### clearChromosome (ind, ploidy, chrom)

Clear (set alleles to zero) chromosome *chrom* on the *ploidy-th* homologous set of chromosomes of individual *ind*. It is equivalent to ind. setGenotype ([0], ploidy, chrom).

#### clone()

Deep copy of a base genotype transmitter.

#### copyChromosome (parent, parPloidy, offspring, ploidy, chrom)

Transmit chromosome *chrom* on the *parPloidy* set of homologous chromosomes from *parent* to the *ploidy* set of homologous chromosomes of *offspring*. It is equivalent to offspring. setGenotype (parent.genotype (parPloidy, chrom), polidy, chrom).

#### copyChromosomes (parent, parPloidy, offspring, ploidy)

Transmit the *parPloidy* set of homologous chromosomes from *parent* to the *ploidy* set of homologous chromosomes of *offspring*. Customized chromosomes are not copied. It is equivalent to offspring.setGenotype(parent.genotype(parPloidy), ploidy).

#### initialize(pop)

Initialize a base genotype operator for a population. This function should be called before any other functions are used to transmit genotype.

## 2.5.2 Class CloneGenoTransmitter

This during mating operator copies parental genotype directly to offspring. This operator works for all mating schemes when one or two parents are involved. If both parents are passed, maternal genotype are copied. This genotype transmitter does not copy genotype on customized chromosomes.

```
 \textbf{class CloneGenoTransmitter} (output="", begin=0, end=-1, step=1, at=[], reps=ALL\_AVAIL, sub-Pops=ALL\_AVAIL, infoFields=ALL\_AVAIL)
```

Create a clone genotype transmitter (a during-mating operator) that copies genotypes from parents to offspring. If two parents are specified, genotypes are copied maternally. After genotype transmission, offspring sex is copied from parental sex even if sex has been determined by an offspring generator. All or specified information fields (parameter *infoFields*, default to ALL\_AVAIL) will also be copied from parent to offspring. Parameters *subPops* is ignored.

#### clone()

Deep copy of a clone genotype transmitter.

#### 2.5.3 Class MendelianGenoTransmitter

This Mendelian offspring generator accepts two parents and pass their genotypes to an offspring following Mendel's laws. Sex chromosomes are handled according to the sex of the offspring, which is usually determined in advance by an offspring generator. Customized chromosomes are not handled.

```
class MendelianGenoTransmitter (output=""", begin=0, end=-1, step=1, at=[], reps=ALL\_AVAIL, sub-Pops=ALL\_AVAIL, infoFields=[])
```

Create a Mendelian genotype transmitter (a during-mating operator) that transmits genotypes from parents to offspring following Mendel's laws. Autosomes and sex chromosomes are handled but customized chromosomes are ignored. Parameters *subPops* and *infoFields* are ignored.

```
clone()
```

Deep copy of a Mendelian genotype transmitter.

```
initialize(pop)
```

Initialize a base genotype operator for a population. This function should be called before function transmitGenotype is used to transmit genotype.

```
transmitGenotype (parent, offspring, ploidy)
```

Transmit genotype from parent to offspring, and fill the *ploidy* homologous set of chromosomes. This function does not set genotypes of customized chromosomes and handles sex chromosomes properly, according to offspring sex and ploidy.

## 2.5.4 Class SelfingGenoTransmitter

A genotype transmitter (during-mating operator) that transmits parental genotype of a parent through self-fertilization. That is to say, the offspring genotype is formed according to Mendel's laws, only that a parent serves as both maternal and paternal parents.

```
class SelfingGenoTransmitter (output="", begin=0, end=-1, step=1, at=[], reps=ALL\_AVAIL, sub-Pops=ALL\_AVAIL, infoFields=[])
```

Create a self-fertilization genotype transmitter that transmits genotypes of a parent to an offspring through self-fertilization. Cutsomized chromosomes are not handled. Parameters *subPops* and *infoFields* are ignored.

```
clone()
```

Deep copy of a selfing genotype transmitter.

## 2.5.5 Class HaplodiploidGenoTransmitter

A genotype transmitter (during-mating operator) for haplodiploid populations. The female parent is considered as diploid and the male parent is considered as haploid (only the first homologous copy is valid). If the offspring is FEMALE, she will get a random copy of two homologous chromosomes of her mother, and get the only paternal copy from her father. If the offspring is MALE, he will only get a set of chromosomes from his mother.

Create a haplodiploid genotype transmitter (during-mating operator) that transmit parental genotypes from parents to offspring in a haplodiploid population. Parameters *subPops* and *infoFields* are ignored.

#### clone()

Deep copy of a haplodiploid transmitter.

#### 2.5.6 Class MitochondrialGenoTransmitter

This geno transmitter assumes that the first homologous copy of several (or all) Customized chromosomes are copies of mitochondrial chromosomes. It transmits these chromosomes randomly from the female parent to offspring. If this transmitter is applied to populations with more than one homologous copies of chromosomes, it transmits the first homologous copy of chromosomes and clears alleles (set to zero) on other homologous copies.

 $\textbf{class MitochondrialGenoTransmitter} (\textit{output}="", \textit{chroms}=[], \textit{begin}=0, \textit{end}=-1, \textit{step}=1, \textit{at}=[], \textit{reps}=ALL\_AVAIL, \textit{subPops}=ALL\_AVAIL, \textit{infoFields}=[])$ 

Createa a mitochondrial genotype transmitter that treats all Customized chromosomes, or a list of chromosomes specified by *chroms*, as human mitochondrial chromosomes. These chromosomes should have the same length and the same number of loci. This operator transmits these chromosomes randomly from the female parent to offspring of both sexes.

clone()

Deep copy of a mitochondrial genotype transmitter.

#### 2.5.7 Class Recombinator

A genotype transmitter (during-mating operator) that transmits parental chromosomes to offspring, subject to recombination and gene conversion. This can be used to replace MendelianGenoTransmitter and SelfingGenoTransmitter. It does not work in haplodiploid populations, although a customized genotype transmitter that makes uses this operator could be defined. Please refer to the simuPOP user's guide or online cookbook for details.

Recombination could be applied to all adjacent markers or after specified loci. Recombination rate between two adjacent markers could be specified directly, or calculated using physical distance between them. In the latter case, a recombination intensity is multiplied by physical distance between markers.

Gene conversion is interpreted as double-recombination events. That is to say, if a recombination event happens, it has a certain probability (can be 1) to become a conversion event, namely triggering another recombination event down the chromosome. The length of the converted chromosome can be controlled in a number of ways.

#### Note

simuPOP does not assume any unit to loci positions so recombination intensity could be explained differntly (e.g. cM/Mb, Morgan/Mb) depending on your interpretation of loci positions. For example, if basepair is used for loci position, intensity=10^8 indicates 10^8 per basepair, which is equivalent to 10^2 per Mb or 1 cM/Mb. If Mb is used for physical positions, the same recombination intensity could be achieved by intensity=0.01.

class Recombinator (rates=[], intensity=-1, loci=ALL\_AVAIL, convMode=NO\_CONVERSION, output="", begin=0, end=-1, step=1, at=[], reps=ALL\_AVAIL, subPops=ALL\_AVAIL, infoFields=[])

Create a Recombinator (a mendelian genotype transmitter with recombination and gene conversion) that passes genotypes from parents (or a parent in case of self-fertilization) to offspring.

Recombination happens by default between all adjacent markers but can be limited to a given set of *loci*. Each locus in this list specifies a recombination point between the locus and the locus immediately **before** it. Loci that are the first locus on each chromosome are ignored.

If a single recombination rate (parameter *rates*) is specified, it will used for all loci (all loci or loci specified by parameter *loci*), regardless of physical distances between adjacent loci.

If a list of recombination rates are specified in *rates*, a parameter *loci* with the same length should also be specified. Different recombination rates can then be used after these loci (between specified loci and their immediate neighbor to the right).

A recombination intensity (*intensity*) can be used to specify recombination rates that are proportional to physical distances between adjacent markers. If the physical distance between two markers is d, the recombination rate between them will be intensity \* d. No unit is assume for loci position and recombination intensity.

Gene conversion is controlled using parameter *convMode*, which can be

- •NoConversion: no gene conversion (default).
- (NUM\_MARKERS, prob, n): With probability *prob*, convert a fixed number (n) of markers if a recombination event happens.
- (GEOMETRIC\_DISTRIBUTION, prob, p): With probability *prob*, convert a random number of markers if a recombination event happens. The number of markes converted follows a geometric distribution with probability *p*.
- (TRACT\_LENGTH, prob, n): With probability *prob*, convert a region of fixed tract length (n) if a recombination event happens. The actual number of markers converted depends on loci positions of surrounding loci. The starting position of this tract is the middle of two adjacent markers. For example, if four loci are located at 0, 1, 2, 3 respectively, a conversion event happens between 0 and 1, with a tract length 2 will start at 0.5 and end at 2.5, covering the second and third loci.
- (EXPONENTIAL\_DISTRIBUTION, prob, p): With probability *prob*, convert a region of random tract length if a recombination event happens. The distribution of tract length follows a exponential distribution with probability p. The actual number of markers converted depends on loci positions of surrounding loci.

simuPOP uses this probabilistic model of gene conversion because when a recombination event happens, it may become a recombination event if the Holliday junction is resolved/repaired successfully, or a conversion event if the junction is not resolved/repaired. The probability, however, is more commonly denoted by the ratio of conversion to recombination events in the literature. This ratio varies greatly from study to study, ranging from 0.1 to 15 (Chen et al, Nature Review Genetics, 2007). This translate to 0.1/0.90.1 to 15/160.94 of the gene conversion probability.

A Recombinator usually does not send any output. However, if an information field is given (parameter *infoFields*), this operator will treat this information field as an unique ID of parents and offspring and output all recombination events in the format of offspring\_id parent\_id starting\_ploidy loc1 loc2 ... where starting\_ploidy indicates which homologous copy genotype replication starts from (0 or 1), loc1, loc2 etc are loci after which recombination events happens. If there are multiple chromosomes on the genome, you will see a lot of (fake) recombination events because of independent segregation of chromosomes. Such a record will be generated for each set of homologous chromosomes so an diploid offspring will have two lines of output. Note that individual IDs need to be set (using a IdTagger operator) before this Recombinator is applied.

**Note** conversion tract length is usually short, and is estimated to be between 337 and 456 bp, with overall range between maybe 50 - 2500 bp. This is usually not enough to convert, for example, two adjacent markers from the HapMap dataset. There is no recombination between sex chromosomes (Chromosomes X and Y), although recombination is possible between pesudoautosomal regions on these chromosomes. If such a feature is required, you will have to simulate the pesudoautosomal regions as separate chromosomes.

#### clone()

Deep copy of a Recombinator

#### initialize(pop)

Initialize a Recombinator for the genotypic structure of population *pop*. This function should be called before a Recombinator is explicitly applied to a population.

#### transmitGenotype (parent, offspring, ploidy)

This function transmits genotypes from a *parent* to the *ploidy-th* homologous set of chromosomes of an *offspring*. It can be used, for example, by a customized genotype transmitter to use sex-specific recombination rates to transmit parental genotypes to offspring.

#### 2.6 Mutation

#### 2.6.1 Class BaseMutator

Class mutator is the base class of all mutators. It handles all the work of picking an allele at specified loci from certain (virtual) subpopulation with certain probability, and calling a derived mutator to mutate the allele. Alleles can be changed before and after mutation if existing allele numbers do not match those of a mutation model.

class BaseMutator (rates=[], loci=ALL\_AVAIL, mapIn=[], mapOut=[], context=0, output=">", begin=0, end=1, step=1, at=[], reps=ALL\_AVAIL, subPops=ALL\_AVAIL, infoFields=[])

A mutator mutates alleles from one state to another with given probability. This base mutator does not perform any mutation but it defines common behaviors of all mutators.

By default, a mutator mutates all alleles in all populations of a Simulator at all generations. A number of parameters can be used to restrict mutations to certain generations (parameters *begin*, *end*, *step* and *at*), replicate populations (parameter *rep*), (virtual) subpopulations (parameter *subPops*) and loci (parameter *loci*). Please refer to class BaseOperator for a detailed explanation of these parameters.

Parameter *rate* or its equivalence specifies the probability that a a mutation event happens. The exact form and meaning of *rate* is mutator-specific. If a single rate is specified, it will be applied to all *loci*. If a list of mutation rates are given, they will be applied to each locus specified in parameter *loci*. Note that not all mutators allow specification of multiple mutation rate, especially when the mutation rate itself is a list or matrix.

Alleles at a locus are non-negative numbers 0, 1, ... up to the maximum allowed allele for the loaded module (1 for binary, 255 for short and 65535 for long modules). Whereas some general mutation models treat alleles as numbers, other models assume specific interpretation of alleles. For example, an AcgtMutator assumes alleles 0, 1, 2 and 3 as nucleotides A, C, G and T. Using a mutator that is incompatible with your simulation will certainly yield erroneous results.

If your simulation assumes different alleles with a mutation model, you can map an allele to the allele used in the model and map the mutated allele back. This is achieved using a mapIn list with its i-th item being the corresponding allele of real allele i, and a mapOut list with its i-th item being the real allele of allele i assumed in the model. For example mapIn=[0, 0, 1] and mapOut=[1, 2] would allow the use of a SNPMutator to mutate between alleles 1 and 2, instead of 0 and 1. Parameters mapIn and mapOut also accept a user-defined Python function that returns a corresponding allele for a given allele. This allows easier mapping between a large number of alleles and advanced models such as random emission of alleles.

Some mutation models are context dependent. Namely, how an allele mutates will depend on its adjecent alleles. Whereas most simuPOP mutators are context independent, some of them accept a parameter *context* which is the number of alleles to the left and right of the mutated allele. For example *context=1* will make the alleles to the immediate left and right to a mutated allele available to a mutator. These alleles will be mapped in if parameter *mapIn* is defined. How exactly a mutator makes use of these information is mutator dependent.

```
apply (pop)
     Apply a mutator.
clone()
     Deep copy of a mutator
```

## **2.6.2** Class MatrixMutator (Can be applied directly using function matrixMutate)

A matrix mutator mutates alleles 0, 1, ..., n-1 using a n by n matrix, which specifies the probability at which each allele mutates to another. Conceptually speaking, this mutator goes through all mutable allele and mutate it to another state according to probabilities in the corresponding row of the rate matrix. Only one mutation rate matrix can be specified which will be used for all specified loci. #

Create a mutator that mutates alleles 0, 1, ..., n-1 using a n by n matrix rate. Item (i, j) of this matrix specifies the probability at which allele i mutates to allele j. Diagnal items (i, i) are ignored because they are

2.6. Mutation 39

automatically determined by other probabilities. Only one mutation rate matrix can be specified which will be used for all loci in the applied population, or loci specified by parameter *loci*. Please refer to classes mutator and BaseOperator for detailed explanation of other parameters.

#### clone()

Deep copy of a MatrixMutator

#### 2.6.3 Class KAlleleMutator (Can be applied directly using function kAlleleMutate)

This mutator implements a k-allele mutation model that assumes k allelic states (alleles 0, 1, 2, ..., k-l) at each locus. When a mutation event happens, it mutates an allele to any other states with equal probability.

Create a k-allele mutator that mutates alleles to one of the other k-1 alleles with equal probability. This mutator by default applies to all loci unless parameter loci is specified. A single mutation rate will be used for all loci if a single value of parameter rates is given. Otherwise, a list of mutation rates can be specified for each locus in parameter loci. Please refer to classes mutator and BaseOperator for descriptions of other parameters.

#### clone()

Deep copy of a KAlleleMutator

# 2.6.4 Class StepwiseMutator (Can be applied directly using function stepwqiseMutate)

A stepwise mutation model treats alleles at a locus as the number of tandem repeats of microsatellite or minisatellite markers. When a mutation event happens, the number of repeats (allele) either increase or decrease. A standard stepwise mutation model increases of decreases an allele by 1 with equal probability. More complex models (generalized stepwise mutation model) are also allowed. Note that an allele cannot be mutated beyond boundaries (0 and maximum allowed allele).

Create a stepwise mutation mutator that mutates an allele by increasing or decreasing it. This mutator by default applies to all loci unless parameter *loci* is specified. A single mutation rate will be used for all loci if a single value of parameter *rates* is given. Otherwise, a list of mutation rates can be specified for each locus in parameter *loci*.

When a mutation event happens, this operator increases or decreases an allele by *mutStep* steps. Acceptable input of parameter *mutStep* include

- •A number: This is the default mode with default value 1.
- (GEOMETRIC\_DISTRIBUTION, p): The number of steps follows a a geometric distribution with parameter p.
- •A Python function: This user defined function accepts the allele being mutated and return the steps to mutate.

The mutation process is usually neutral in the sense that mutating up and down is equally likely. You can adjust parameter *incProb* to change this behavior.

If you need to use other generalized stepwise mutation models, you can implement them using a PyMutator. If performance becomes a concern, I may add them to this operator if provided with a reliable reference.

#### clone()

Deep copy of a StepwiseMutator

## **2.6.5** Class PyMutator (Can be applied directly using function pyMutate)

This hybrid mutator accepts a Python function that determines how to mutate an allele when an mutation event happens.

class PyMutator (rates=[], loci=ALL\_AVAIL, func=None, context=0, mapIn=[], mapOut=[], output=">", begin=0, end=-1, step=1, at=[], reps=ALL\_AVAIL, subPops=ALL\_AVAIL, infoFields=[])

Create a hybrid mutator that uses a user-provided function to mutate an allele when a mutation event happens. This function (parameter *func*) accepts the allele to be mutated and return a mutated allele. If *context* is specified, the *context* alleles to the left and to the right of the mutated alleles will be passed to this function as the second parameter. Invalid context alleles (e.g. left allele to the first locus of a chromosome) will be marked by -1. The passed, returned and context alleles might be changed if parameters *mapIn* and *mapOut* are used although allele mappings, if needed, are usually handled in *func* as well. This mutator by default applies to all loci unless parameter *loci* is specified. A single mutation rate will be used for all loci if a single value of parameter *rates* is given. Otherwise, a list of mutation rates can be specified for each locus in parameter *loci*. Please refer to classes mutator and BaseOperator for descriptions of other parameters.

clone()

Deep copy of a PyMutator

## **2.6.6 Class MixedMutator (Can be applied directly using function** mixedMutate)

This mixed mutator accepts a list of mutators and use one of them to mutate an allele when an mutation event happens.

Create a mutator that randomly chooses one of the specified *mutators* to mutate an allele when a mutation event happens. The mutators are choosen according to a list of probabilities ( *prob*) that should add up to 1. The passed and returned alleles might be changed if parameters *mapIn* and *mapOut* are used. Most parameters, including *loci*, *mapIn*, *mapOut*, *rep*, and *subPops* of mutators specified in parameter *mutators* are ignored. This mutator by default applies to all loci unless parameter *loci* is specified. Please refer to classes mutator and BaseOperator for descriptions of other parameters.

clone()

Deep copy of a MixedMutator

## **2.6.7 Class ContextMutator (Can be applied directly using function** contextMutate)

This context-dependent mutator accepts a list of mutators and use one of them to mutate an allele depending on the context of the mutated allele.

Create a mutator that choose one of the specified *mutators* to mutate an allele when a mutation event happens. The mutators are choosen according to the context of the mutated allele, which is specified as a list of alleles to the left and right of an allele ( *contexts*). For example, contexts = [(0,0), (0,1), (1,1)] indicates which mutators should be used to mutate allele X in the context of 0X0, 0X1, and 1X1. A context can include more than one alleles at both left and right sides of a mutated allele but all contexts should have the same (even) number of alleles. If an allele does not have full context (e.g. when a locus is the first locus on a chromosome), unavailable alleles will be marked as -1. There should be a mutator for each context but an additional mutator

2.6. Mutation 41

can be specified as the default mutator for unmatched contexts. If parameters mapIn is specified, both mutated allele and its context alleles will be mapped. Most parameters, including loci, mapIn, mapOut, rep, and subPops of mutators specified in parameter mutators are ignored. This mutator by default applies to all loci unless parameter loci is specified. Please refer to classes mutator and BaseOperator for descriptions of other parameters.

```
clone()
```

Deep copy of a context-dependentMutator

## **2.6.8 Class PointMutator (Can be applied directly using function** pointMutate)

A point mutator is different from all other mutators because mutations in this mutator do not happen randomly. Instead, it happens to specific loci and mutate an allele to a specific state, regardless of its original state. This mutator is usually used to introduce a mutant to a population.

Create a point mutator that mutates alleles at specified *loci* to a given *allele* of individuals *inds*. If there are multiple alleles at a locus (e.g. individuals in a diploid population), only the first allele is mutated unless indexes of alleles are listed in parameter *ploidy*. This operator is by default applied to individuals in the first subpopulation but you can apply it to a different or more than one (virtual) subpopulations using parameter \*subPops\* ("AllAvail" is also accepted). Please refer to class BaseOperator for detailed descriptions of other parameters.

```
apply (pop)
    Apply a PointMutator
clone()
    Deep copy of a PointMutator
```

#### 2.6.9 Class SNPMutator

Because there are only two alleles, this mutation model only needs to know the mutation rate from allele 0 to 1 (parameter u) and from 1 to 0 (parameter v).

```
class SNPMutator (u=0, v=0, *args, **kwargs)
```

#### 2.6.10 Class AcgtMutator

This operator assumes alleles 0, 1, 2, 3 as nucleotides A, C, G and T and use a 4 by 4 mutation rate matrix to mutate them. Although a general model needs 12 parameters, less parameters are needed for specific nucleotide mutation models (parameter model). The length and meaning of parameter rate is model dependent. Currently supported models are Jukes and Cantor 1969 model (JC69), Kimura's 2-parameter model (K80), Felsenstein 1981 model (F81), Hasgawa, Kishino and Yano 1985 model (HKY85), Tamura 1992 model (T92), Tamura and Nei 1993 model (TN93), Generalized time reversible model (GTR), and a general model (general) with 12 parameters. Please refer to the simuPOP user's guide for detailed information about each model.

```
class AcgtMutator (rate=[], model='general', *args, **kwargs)
```

#### 2.7 Penetrance

#### 2.7.1 Class BasePenetrance

A penetrance model models the probability that an individual has a certain disease provided that he or she has certain genetic (genotype) and environmental (information field) riske factors. A penetrance operator calculates this probability according to provided information and set his or her affection status randomly. For example, an individual will have probability 0.8 to be affected if the penetrance is 0.8. This class is the base class to all penetrance operators and defines a common interface for all penetrance operators.

A penetrance operator can be applied at any stage of an evolutionary cycle. If it is applied before or after mating, it will set affection status of all parents and offspring, respectively. If it is applied during mating, it will set the affection status of each offspring. You can also apply a penetrance operator to an individual using its applyToIndividual member function.

By default, a penetrance operator assigns affection status of individuals but does not save the actual penetrance value. However, if an information field is specified, penetrance values will be saved to this field for future analysis.

When a penetrance operator is applied to a population, it is only applied to the current generation. You can, however, use parameter *ancGen=-1* to set affection status for all ancestral generations, or a generation index to apply to only ancestral generation younger than *ancGen*. Note that this parameter is ignored if the operator is applied during mating.

Create a base penetrance operator. If ancGen=0 (default), only the current generation will be applied. If ancGen=-1, affection status of all ancestral generations will be set. If a positive number is given, ancestral generations with index <= ancGen will be applied. A penetrance operator can be applied to specified (virtual) subpopulations (parameter subPops) and replicates (parameter reps). If an information field is given, penetrance value will be stored in this information field of each individual.

#### apply (pop)

Set penetrance to all individuals and record penetrance if requested

#### applyToIndividual (ind, gen=0)

Apply the penetrance operator to a single individual *ind* and set his or her affection status. A generation number *gen* is needed if the penetrance model is generation-dependent. This function returns the affection status.

#### clone()

Deep copy of a penetrance operator

# 2.7.2 Class MapPenetrance (Applicable to all ploidy, can be applied directly using function mapPenetrance)

This penetrance operator assigns individual affection status using a user-specified penetrance dictionary.

class MapPenetrance (loci, penetrance, ancGen=0, begin=0, end=-1, step=1, at=[], reps= $ALL\_AVAIL$ , sub- $Pops=ALL\_AVAIL$ , infoFields=[])

Create a penetrance operator that get penetrance value from a dictionary *penetrance* with genotype at *loci* as keys, and *penetrance* as values. For each individual, genotypes at *loci* are collected one by one (e.g. p0\_loc0, p1\_loc0, p0\_loc1, p1\_loc1... for a diploid individual) and are looked up in the dictionary. If a genotype cannot be found, it will be looked up again without phase information (e.g. (1,0) will match key (0,1)). If the genotype still can not be found, a ValueError will be raised. This operator supports sex chromosomes and haplodiploid populations. In these cases, only valid genotypes should be used to generator the dictionary keys.

#### clone()

Deep copy of a map penetrance operator

2.7. Penetrance 43

#### 2.7.3 Class MaPenetrance (Can be applied directly using function maPenetrance)

This operator is called a 'multi-allele' penetrance operator because it groups multiple alleles into two groups: wildtype and non-wildtype alleles. Alleles in each allele group are assumed to have the same effect on individual penetrance. If we denote all wildtype alleles as A, and all non-wildtype alleles a, this operator assign Individual penetrance according to genotype AA, Aa, aa in the diploid case, and A and a in the haploid case.

Creates a multi-allele penetrance operator that groups multiple alleles into a wildtype group (with alleles *wild-type*, default to [0]), and a non-wildtype group. A list of penetrance values is specified through parameter *penetrance*, for genotypes at one or more *loci*. If we denote wildtype alleles using capital letters A, B ... and non-wildtype alleles using small letters a, b ..., the penetrance values should be for

- •genotypes A and a for the haploid single-locus case,
- •genotypes AB, Ab, aB and bb for haploid two=locus cases,
- •genotypes AA, Aa and aa for diploid single-locus cases,
- •genotypes AABB, AABb, AABb, AaBb, AaBb, AaBb, aaBb, aaBb, and aabb for diploid two-locus cases,
- •and in general 2\*\*n for diploid and 3\*\*n for haploid cases if there are n loci.

This operator does not support haplodiploid populations and sex chromosomes.

clone()

Deep copy of a multi-allele penetrance operator

## 2.7.4 Class MlPenetrance (Can be applied directly using function mlPenetrance)

This penetrance operator is created by a list of penetrance operators. When it is applied to an individual, it applies these penetrance operators to the individual, obtain a list of penetrance values, and compute a combined penetrance value from them and assign affection status accordingly. ADDITIVE, multiplicative, and a heterogeneour multi-locus model are supported. Please refer to Neil Rish (1989) "Linkage Strategies for Genetically Complex Traits" for some analysis of these models.

Create a multiple-locus penetrance operator from a list penetrance operator *ops*. When this operator is applied to an individual (parents when used before mating and offspring when used during mating), it applies these operators to the individual and obtain a list of (usually single-locus) penetrance values. These penetrance values are combined to a single penetrance value using

- $Prod(f_i)$ , namely the product of individual penetrance if mode = MULTIPLICATIVE,
- • $sum(f_i)$  if mode = ADDITIVE, and
- •1- $Prod(1 f_i)$  if mode = HETEROGENEITY

0 or 1 will be returned if the combined penetrance value is less than zero or greater than 1.

clone()

Deep copy of a multi-loci penetrance operator

#### 2.7.5 Class PyPenetrance (Can be applied directly using function pyPenetrance)

This penetrance operator assigns penetrance values by calling a user provided function. It accepts a list of loci (parameter loci), and a Python function func which should be defined with one or more of parameters geno, gen, ind,

or names of information fields. When this operator is applied to a population, it passes genotypes at specified loci, generation number, a reference to an individual, and values at specified information fields to respective parameters of this function. The returned penetrance values will be used to determine the affection status of each individual.

```
class PyPenetrance (func, loci=[], ancGen=0, begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, sub-
Pops=ALL_AVAIL, infoFields=[])
```

Create a Python hybrid penetrance operator that passes genotype at specified *loci*, values at specified information fields (if requested), and a generation number to a user-defined function *func*. The return value will be treated as Individual penetrance.

```
clone()
```

Deep copy of a Python penetrance operator

## 2.8 Quantitative Trait

#### 2.8.1 Class BaseQuanTrait

A quantitative trait in simuPOP is simply an information field. A quantitative trait model simply assigns values to one or more information fields (called trait fields) of each individual according to its genetic (genotype) and environmental (information field) factors. It can be applied at any stage of an evolutionary cycle. If a quantitative trait operator is applied before or after mating, it will set the trait fields of all parents and offspring. If it is applied during mating, it will set the trait fields of each offspring.

When a quantitative trait operator is applied to a population, it is only applied to the current generation. You can, however, use parameter *ancGen=-1* to set the trait field of all ancestral generations, or a generation index to apply to only ancestral generation younger than *ancGen*. Note that this parameter is ignored if the operator is applied during mating.

```
class BaseQuanTrait (ancGen=-1, begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, subPops=ALL_AVAIL, in-
foFields=[])
```

Create a base quantitative trait operator. If ancGen=0 (default), only the current generation will be applied. If ancGen=-1, the trait fields (infoFields) of all ancestral generations will be set. If a positive number is given, ancestral generations with index <= ancGen will be applied. A quantitative trait operator can be applied to specified (virtual) subpopulations (parameter subPops) and replicates (parameter reps).

```
apply (pop)
    Set qtrait to all individual
clone()
    Deep copy of a quantitative trait operator
```

## **2.8.2** Class PyQuanTrait (Can be applied directly using function pyQuanTrait)

This quantitative trait operator assigns a trait field by calling a user provided function. It accepts a list of loci (parameter *loci*), and a Python function func which should be defined with one or more of parameters geno, gen, ind, or names of information fields. When this operator is applied to a population, it passes genotypes at specified loci, generation number, a reference to an individual, and values at specified information fields to respective parameters of this function. The return values will be assigned to specified trait fields.

```
 \textbf{class PyQuanTrait} \ (func, \ loci=[], \ ancGen=0, \ begin=0, \ end=-1, \ step=1, \ at=[], \ reps=ALL\_AVAIL, \ sub-Pops=ALL\_AVAIL, \ infoFields=[])
```

Create a Python hybrid quantitative trait operator that passes genotype at specified *loci*, optional values at specified information fields (if requested), and an optional generation number to a user-defined function *func*. The return value will be assigned to specified trait fields (*infoField*). If only one trait field is specified, a number or

2.8. Quantitative Trait 45

a sequence of one element is acceptable. Otherwise, a sequence of values will be accepted and be assigned to each trait field.

clone()

Deep copy of a Python quantitative trait operator

## 2.9 Natural selection

## 2.9.1 Class BaseSelector

This class is the base class to all selectors, namely operators that perform natural selection. It defines a common interface for all selectors.

A selector can be applied before mating or during mating. If a selector is applied to one or more (virtual) subpopulations of a parental population before mating, it sets individual fitness values to all involved parents to an information field (default to *fitness*). When a mating scheme that supports natural selection is applied to the parental population, it will select parents with probabilities that are proportional to individual fitness stored in an information field (default to *fitness*). Individual fitness is considered **relative** fitness and can be any non-negative number. This simple process has some implications that can lead to advanced usages of natural selection in simuPOP:

- It is up to the mating scheme how to handle individual fitness. Some mating schemes do not support natural selection at all.
- A mating scheme performs natural selection according to fitness values stored in an information field. It does
  not care how these values are set. For example, fitness values can be inherited from a parent using a tagging
  operator, or set directly using a Python operator.
- A mating scheme can treat any information field as fitness field. If an specified information field does not exist, or if all individuals have the same fitness values (e.g. 0), the mating scheme selects parents randomly.
- Multiple selectors can be applied to the same parental generation. individual fitness is determined by the last fitness value it is assigned.
- A selection operator can be applied to virtual subpopulations and set fitness values only to part of the individuals.
- individuals with zero fitness in a subpopulation with anyone having a positive fitness value will not be selected to produce offspring. This can sometimes lead to unexpected behaviors. For example, if you only assign fitness value to part of the individuals in a subpopulation, the rest of them will be effectively discarded. If you migrate individuals with valid fitness values to a subpopulation with all individuals having zero fitness, the migrants will be the only mating parents.
- It is possible to assign multiple fitness values to different information fields so that different homogeneous mating schemes can react to different fitness schemes when they are used in a heterogeneous mating scheme.
- You can apply a selector to the offspring generation using the *postOps* parameter of Simulator.evolve, these fitness values will be used when the offspring generation becomes parental generation in the next generation

Alternatively, a selector can be used as a during mating operator. In this case, it caculates fitness value for each offspring which will be treated as **absolute** fitness, namely the probability for each offspring to survive. This process uses the fact that an individual will be discarded when any of the during mating operators returns *False*. It is important to remember that:

- individual fitness needs to be between 0 and 1 in this case.
- This method applies natural selection to offspring instead of parents. These two implementation can be identical or different depending on the mating scheme used.

• Seleting offspring is less efficient than the selecting parents, especially when fitness values are low.

It is worth noting that a selector used as a during-mating operator does not support parameter *subPops*. If you need to apply different selection scheme to different virtual subpopulations, you can use different selectors in a heterogeneous mating scheme.

## 2.9.2 Class MapSelector (Applicable to all ploidy)

This selector assigns individual fitness values using a user-specified dictionary. This operator can be applied to populations with arbitrary number of homologous chromosomes.

```
class MapSelector (loci, fitness, begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, subPops=ALL_AVAIL, in-
foFields=ALL_AVAIL)
```

Create a selector that assigns individual fitness values using a dictionary *fitness* with genotype at *loci* as keys, and fitness as values. For each individual (parents if this operator is applied before mating, and offspring if this operator is applied during mating), genotypes at *loci* are collected one by one (e.g. p0\_loc0, p1\_loc0, p0\_loc1, p1\_loc1... for a diploid individual) and are looked up in the dictionary. If a genotype cannot be found, it will be looked up again without phase information (e.g. (1,0) will match key (0,1)). If the genotype still can not be found, a ValueError will be raised. This operator supports sex chromosomes and haplodiploid populations. In these cases, only valid genotypes should be used to generator the dictionary keys.

```
clone()
```

Deep copy of a map selector

#### 2.9.3 Class MaSelector

This operator is called a 'multi-allele' selector because it groups multiple alleles into two groups: wildtype and non-wildtype alleles. Alleles in each allele group are assumed to have the same effect on individual fitness. If we denote all wildtype alleles as A, and all non-wildtype alleles a, this operator assign individual fitness according to genotype AA, Aa, aa in the diploid case, and A and a in the haploid case.

```
class MaSelector (loci, fitness, wildtype=0, begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, sub-
Pops=ALL_AVAIL, infoFields=ALL_AVAIL)
```

Creates a multi-allele selector that groups multiple alleles into a wildtype group (with alleles *wildtype*, default to [0]), and a non-wildtype group. A list of fitness values is specified through parameter *fitness*, for genotypes at one or more *loci*. If we denote wildtype alleles using capital letters A, B ... and non-wildtype alleles using small letters a, b ..., the fitness values should be for

- •genotypes A and a for the haploid single-locus case,
- •genotypes AB, Ab, aB and bb for haploid two=locus cases,
- •genotypes AA, Aa and aa for diploid single-locus cases,
- •genotypes AABB, AABb, AABb, AaBb, AaBb, Aabb, aaBB, aaBb, and aabb for diploid two-locus cases,
- •and in general 2\*\*n for diploid and 3\*\*n for haploid cases if there are n loci.

2.9. Natural selection 47

This operator does not support haplodiploid populations and sex chromosomes.

```
clone()
```

Deep copy of a MaSelector

#### 2.9.4 Class MlSelector

This selector is created by a list of selectors. When it is applied to an individual, it applies these selectors to the individual, obtain a list of fitness values, and compute a combined fitness value from them. ADDITIVE, multiplicative, and a heterogeneour multi-locus model are supported.

```
class M1Selector (ops, mode=MULTIPLICATIVE, begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, sub-
Pops=ALL_AVAIL, infoFields=ALL_AVAIL)
```

Create a multiple-locus selector from a list selection operator *selectors*. When this operator is applied to an individual (parents when used before mating and offspring when used during mating), it applies these operators to the individual and obtain a list of (usually single-locus) fitness values. These fitness values are combined to a single fitness value using

- $Prod(f_i)$ , namely the product of individual fitness if mode = MULTIPLICATIVE,
- •1- $sum(1 f_i)$  if mode = ADDITIVE, and
- •1- $Prod(1 f_i)$  if mode = HETEROGENEITY

zero will be returned if the combined fitness value is less than zero.

clone()

Deep copy of a MlSelector

## 2.9.5 Class PySelector

This selector assigns fitness values by calling a user provided function. It accepts a list of loci (parameter *loci*) and a Python function func which should be defined with one or more of parameters geno, gen, ind, or names of information fields. When this operator is applied to a population, it passes genotypes at specified loci, generation number, a reference to an individual, and values at specified information fields to respective parameters of this function. The returned penetrance values will be used to determine the fitness of each individual.

```
class PySelector (func, loci=[], begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, subPops=ALL_AVAIL, in-
foFields=ALL AVAIL)
```

Create a Python hybrid selector that passes genotype at specified *loci*, values at specified information fields (if requested) and a generation number to a user-defined function *func*. The return value will be treated as individual fitness.

```
clone()
```

Deep copy of a PySelector

## 2.10 Statistics Calculation

### 2.10.1 Class Stat (Can be applied directly using function stat)

Operator Stat calculates various statistics of the population being applied and sets variables in its local namespace. Other operators or functions can retrieve results from or evalulate expressions in this local namespace after Stat is applied.

class Stat (popSize=False, numOfMales=False, numOfAffected=False, alleleFreq=[], heteroFreq=[], homoFreq=[], genoFreq=[], haploFreq=[], sumOfInfo=[], meanOfInfo=[], varOfInfo=[], maxOfInfo=[],
minOfInfo=[], LD=[], association=[], neutrality=[], structure=[], HWE=[], vars=ALL\_AVAIL, suffix="", output="", begin=0, end=-1, step=1, at=[], reps=ALL\_AVAIL, subPops=ALL\_AVAIL, infoFields=[])

Create a Stat operator that calculates specified statistics of a population when it is applied to this population. This operator is by default applied after mating (parameter *stage*) and can be applied to specified replicates (parameter *rep*) at specified generations (parameter *begin*, *end*, *step*, and *at*). This operator does not produce any output (ignore parameter *output*) after statistics are calculated. Instead, it stores results in the local namespace of the population being applied. Other operators can retrieve these variables or evalulate expression directly in this local namespace. Please refer to operator BaseOperator for a detailed explanation of these common operator parameters.

Stat supports parameter *subPops*. It usually calculate the same set of statistics for all subpopulations (subPops=subPopList()). If a list of (virtual) subpopulations are specified, statistics for only specified subpopulations will be calculated. However, different statistics treat this parameter differently and it is very important to check its reference before you use *subPops* for any statistics.

Calculated statistics are saved as variables in a population's local namespace. These variables can be numbers, lists or dictionaries and can be retrieved using functions Population.vars() or Population.dvars(). A special default dictionary (defdict) is used for dictionaries whose keys are determined dynamically. Accessing elements of such a dictionary with an invalid key will yield value 0 instead of a KeyError. If the same variables are calculated for one or more (virtual) subpopulation, the variables are stored in vars()['subPop'][sp]['var'] where sp is a subpopulation ID (sp) or a tuple of virtual subpopulation ID ((sp, vsp)). Population.vars(sp) and Population.dvars(sp) provide shortcuts to these variables.

Operator *Stat* outputs a number of most useful variables for each type of statistic. For example, alleleFreq calculates both allele counts and allele frequencies and it by default sets variable alleleFreq (dvars().alleleFreq) for all or specified subpopulations. If this does not fit your need, you can use parameter *vars* to output additional parameters, or limit the output of existing parameters. More specifically, for this particular statistic, the available variables are 'alleleFreq', 'alleleNum', 'alleleFreq\_sp' ('alleleFreq' in each subpopulation), and 'alleleNum\_sp' ('alleleNum' in each subpopulation). You can set vars=['alleleNum\_sp'] to output only subpopulation specific allele count. An optional suffix (parameter *suffix*) can be used to append a suffix to default parameter names. This parameter can be used, for example, to calculate and store the same statistics for different subpopulations (e.g. pairwise Fst).

Operator Stat supports the following statistics:

**popSize**: If *popSize=True*, number of individuals in all or specified subpopulations (parameter *subPops*) will be set to the following variables:

- •popSize (default): Number of individuals in all or specified subpopulations. Because *subPops* does not have to cover all individuals, it may not be the actual population size.
- •popSize\_sp: Size of (virtual) subpopulation sp.
- •subPopSize (default): A list of (virtual) subpopulation sizes. This variable is easier to use than accessing popSize from each (virtual) subpopulation.

**numOfMales**: If *numOfMales=True*, number of male individuals in all or specified (virtual) subpopulations will be set to the following variables:

- •numOfMales (default): Total number of male individuals in all or specified (virtual) subpopulations.
- •numOfMales (default): Total number of female individuals in all or specified (virtual) subpopulations.
- •propOfMales: Proportion of male individuals.
- •propOfFemales: Proportion of female individuals.
- •numOfMales\_sp: Number of male individuals in each (virtual) subpopulation.
- •numOfFemales\_sp: Number of female individuals in each (virtual) subpopulation.

- •propOfMales\_sp: Proportion of male individuals in each (virtual) subpopulation.
- •propOfFemales\_sp: Proportion of female individuals in each (virtual) subpopulation.

**numOfAffected**: If *numOfAffected=True*, number of affected individuals in all or specified (virtual) subpopulations will be set to the following variables:

- •numOfAffected (default): Total number of affected individuals in all or specified (virtual) subpopulations.
- •numOfAffected (default): Total number of unaffected individuals in all or specified (virtual) subpopulations.
- •propOfAffected: Proportion of affected individuals.
- •propOfUnaffected: Proportion of unaffected individuals.
- •numOfAffected\_sp: Number of affected individuals in each (virtual) subpopulation.
- •numOfUnaffected\_sp: Number of unaffected individuals in each (virtual) subpopulation.
- •propOfAffected\_sp: Proportion of affected individuals in each (virtual) subpopulation.
- •propOfUnaffected\_sp: Proportion of unaffected individuals in each (virtual) subpopulation.

**alleleFreq**: This parameter accepts a list of loci (by indexes), at which allele frequencies will be calculated. This statistic outputs the following variables, all of which are dictionary (with loci indexes as keys) of default dictionaries (with alleles as keys). For example, alleleFreq[loc][a] returns 0 if allele a does not exist.

- •alleleFreq(default): alleleFreq[loc][a] is the frequency of allele a at locus for all or specified (virtual) subpopulations.
- •alleleNum (default): alleleNum[loc][a] is the number of allele a at locus for all or specified (virtual) subpopulations.
- •alleleFreq\_sp: Allele frequency in each (virtual) subpopulation.
- •alleleNum\_sp: Allele count in each (virtual) subpopulation.

**heteroFreq** and **homoFreq**: These parameters accept a list of loci (by indexes), at which the number and frequency of homozygotes and/or heterozygotes will be calculated. These statistics are only available for diploid populations. The following variables will be outputted:

- •heteroFreq (default for parameter *heteroFreq*): A dictionary of proportion of heterozygotes in all or specified (virtual) subpopulations, with loci indexes as dictionary keys.
- •homoFreq (default for parameter *homoFreq*): A dictionary of proportion of homozygotes in all or specified (virtual) subpopulations.
- •heteroNum: A dictionary of number of heterozygotes in all or specified (virtual) subpopulations.
- •homoNum: A dictionary of number of homozygotes in all or specified (virtual) subpopulations.
- •heteroFreq\_sp: A dictionary of proportion of heterozygotes in each (virtual) subpopulation.
- •homoFreq sp: A dictionary of proportion of homozygotes in each (virtual) subpopulation.
- •heteroNum\_sp: A dictionary of number of heterozygotes in each (virtual) subpopulation.
- •homoNum\_sp: A dictionary of number of homozygotes in each (virtual) subpopulation.

**genoFreq**: This parameter accept a list of loci (by index) at which number and frequency of all genotypes are outputed as a dictionary (indexed by loci indexes) of default dictionaries (indexed by tuples of possible indexes). This statistic is available for all population types with genotype defined as ordered alleles at a locus. The length of genotype equals the number of homologous copies of chromosomes (ploidy) of a population. Genotypes for males or females on sex chromosomes or in haplodiploid populations will have different length. Because genotypes are ordered, (1, 0) and (0, 1) (two possible genotypes in a diploid population) are considered as different genotypes. This statistic outputs the following variables:

- •genoFreq (default): A dictionary (by loci indexes) of default dictionaries (by genotype) of genotype frequencies. For example, genoFreq[1] [(1, 0)] is the frequency of genotype (1, 0) at locus 1.
- •genoNum (default): A dictionary of default dictionaries of genotype counts of all or specified (virtual) subpopulations.
- •genoFreq\_sp: genotype frequency in each specified (virtual) subpopulation.
- •genoFreq\_sp: genotype count in each specified (virtual) subpopulation.

**haploFreq**: This parameter accepts one or more lists of loci (by index) at which number and frequency of haplotypes are outputted as default dictionaries. [(1,2)] can be abbreviated to (1,2). For example, using parameter haploFreq=(1,2,4), all haplotypes at loci 1, 2 and 4 are counted. This statistic saves results to dictionary (with loci index as keys) of default dictionaries (with haplotypes as keys) such as haploFreq[(1,2,4)][(1,1,0)] (frequency of haplotype (1,1,0)) at loci (1,2,3)). This statistic works for all Population types. Number of haplotypes for each individual equals to his/her ploidy number. Haplodiploid populations are supported in the sense that the second homologous copy of the haplotype is not counted for male individuals. This statistic outputs the following variables:

- •haploFreq (default): A dictionary (with tuples of loci indexes as keys) of default dictionaries of haplotype frequencies. For example, haploFreq[(0, 1)][(1,1)] records the frequency of haplotype (1,1) at loci (0, 1) in all or specified (virtual) subpopulations.
- •haploNum (default): A dictionary of default dictionaries of haplotype counts in all or specified (virtual) subpopulations.
- •haploFreq\_sp: Halptype frequencies in each (virtual) subpopulation.
- •haploNum\_sp: Halptype count in each (virtual) subpopulation.

**sumOfinfo**, **warOfInfo**, **warOfInfo** and **minOfInfo**: Each of these five parameters accepts a list of information fields. For each information field, the sum, mean, variance, maximum or minimal (depending on the specified parameter(s)) of this information field at iddividuals in all or specified (virtual) subpopulations will be calculated. The results will be put into the following population variables:

- •sumOfInfo (default for *sumOfInfo*): A dictionary of the sum of specified information fields of individuals in all or specified (virtual) subpopulations. This dictionary is indexed by names of information fields.
- •meanOfInfo (default for *meanOfInfo*): A dictionary of the mean of information fields of all individuals.
- •varOfInfo (default for *varOfInfo*): A dictionary of the sample variance of information fields of all individuals.
- •maxOfInfo (default for *maxOfInfo*): A dictionary of the maximum value of information fields of all individuals.
- •minOfInfo (default for *minOfInfo*): A dictionary of the minimal value of information fields of all individuals.
- •sumOfInfo\_sp: A dictionary of the sum of information fields of individuals in each subpopulation.
- •meanOfInfo\_sp: A dictionary of the mean of information fields of individuals in each subpopulation.
- •varOfInfo\_sp: A dictionary of the sample variance of information fields of individuals in each subpopulation.
- •maxOfInfo\_sp: A dictionary of the maximum value of information fields of individuals in each subpopulation.
- •minOfInfo\_sp: A dictionary of the minimal value of information fields of individuals in each subpopulation.

**LD**: Parameter LD accepts one or a list of loci pairs (e.g. LD=[[0,1], [2,3]]) with optional primary alleles at both loci (e.g. LD=[0,1,0,0]). For each pair of loci, this operator calculates linkage disequilibrium

and optional association statistics between two loci. When primary alleles are specified, signed linkage disequilibrium values are calculated with non-primary alleles are combined. Otherwise, absolute values of diallelic measures are combined to yield positive measure of LD. Association measures are calculated from a m by n contigency of haplotype counts (m=n=2 if primary alleles are specified). Please refer to the simuPOP user's guide for detailed information. This statistic sets the following variables:

- LD (default) Basic LD measure for haplotypes in all or specified (virtual) subpopulations. Signed if primary alleles are specified.
- •LD\_prime (default) Lewontin's D' measure for haplotypes in all or specified (virtual) subpopulations. Signed if primary alleles are specified.
- •R2 (default) Correlation LD measure for haplotypes in all or specified (virtual) subpopulations.
- •LD\_ChiSq ChiSq statistics for a contigency table with frequencies of haplotypes in all or specified (virtual) subpopulations.
- •LD\_ChiSq\_p Single side p-value for the ChiSq statistic. Degrees of freedom is determined by number of alleles at both loci and the specification of primary alleles.
- •CramerV Normalized ChiSq statistics.
- •LD\_sp Basic LD measure for haplotypes in each (virtual) subpopulation.
- •LD\_prime\_sp Lewontin's D' measure for haplotypes in each (virtual) subpopulation.
- •R2\_sp R2 measure for haplotypes in each (virtual) subpopulation.
- •LD\_ChiSq\_sp ChiSq statistics for each (virtual) subpopulation.
- •LD\_ChiSq\_p\_sp p value for the ChiSq statistics for each (virtual) subpopulation.
- •CramerV\_sp Cramer V statistics for each (virtual) subpopulation.

association: Parameter association accepts a list of loci. At each locus, one or more statistical tests will be performed to test association between this locus and individual affection status. Currently, simuPOP provides the following tests:

- •An allele-based Chi-square test using alleles counts. This test can be applied to loci with more than two alleles, and to haploid populations.
- •A genotype-based Chi-square test using genotype counts. This test can be applied to loci with more than two alleles (more than 3 genotypes) in diploid populations. aA and Aa are considered to be the same genotype.
- •A genotype-based Cochran-Armitage trend test. This test can only be applied to diallelic loci in diploid populations. A codominant model is assumed.

This statistic sets the following variables:

- •Allele\_ChiSq A dictionary of allele-based Chi-Square statistics for each locus, using cases and controls in all or specified (virtual) subpopulations.
- •Allele\_ChiSq\_p (default) A dictionary of *p-values* of the corresponding Chi-square statistics.
- •Geno\_ChiSq A dictionary of genotype-based Chi-Square statistics for each locus, using cases and controls in all or specified (virtual) subpopulations.
- •Geno\_ChiSq\_p A dictionary of *p-values* of the corresponding genotype-based Chi-square test.
- •Armitage\_p A dictionary of *p-values* of the Cochran-Armitage tests, using cases and controls in all or specified (virtual) subpopulations.
- •Allele\_ChiSq\_sp A dictionary of allele-based Chi-Square statistics for each locus, using cases and controls from each subpopulation.
- •Allele\_ChiSq\_p\_sp A dictionary of p-values of allele-based Chi-square tests, using cases and controls from each (virtual) subpopulation.

- •Geno\_ChiSq\_sp A dictionary of genotype-based Chi-Square tests for each locus, using cases and controls from each subpopulation.
- $\bullet \texttt{Geno\_ChiSq\_p\_sp} \ A \ dictionary \ of \ p-values \ of \ genotype-based \ Chi-Square \ tests, using \ cases \ and \ controls \ from \ each \ subpopulation.$
- •Armitage\_p\_sp A dictionary of *p-values* of the Cochran- Armitage tests, using cases and controls from each subpopulation.

**neutrality**: This parameter performs neutrality tests (detection of natural selection) on specified loci. It currently only outputs Pi, which is the average number of pairwise difference between loci. This statistic outputs the following variables:

- •Pi Mean pairwise difference between all sequences from all or specified (virtual) subpopulations.
- •Pi\_sp Mean paiewise difference between all sequences in each (virtual) subpopulation.

**structure**: Parameter structure accepts a list of loci at which statistics that measure population structure are calculated. This parameter currently supports the following statistics:

- •Weir and Cockerham's Fst (1984). This is the most widely used estimator of Wright's fixation index and can be used to measure Population differentiation. However, this method is designed to estimate Fst from samples of larger populations and might not be appropriate for the calculation of Fst of large populations.
- •Nei's Gst (1973). The Gst estimator is another estimator for Wright's fixation index but it is extended for multi-allele (more than two alleles) and multi-loci cases. This statistics should be used if you would like to obtain a *true* Fst value of a large Population.
- •F st (default) The WC84 Fst statistic estimated for all specified loci.
- •F\_is The WC84 Fis statistic estimated for all specified loci.
- •F\_it The WC84 Fit statistic estimated for all specified loci.
- •f\_st A dictionary of locus level WC84 Fst values.
- •f\_is A dictionary of locus level WC84 Fis values.
- •f\_it A dictionary of locus level WC84 *Fit* values.
- •G\_st Nei's Gst statistic estimated for all specified loci.
- •q\_st A dictionary of Nei's Gst statistic estimated for each locus.

**HWE**: Parameter HWE accepts a list of loci at which exact two-side tests for Hardy-Weinberg equilibrium will be performed. This statistic is only available for diallelic loci in diploid populations. It outputs the following variables:

- •HWE (default) A dictionary of p-values of HWE tests using genotypes in all or specified (virtual) subpopulations
- •HWE\_sp A dictionary of p-values of HWS tests using genotypes in each (virtual) subpopulation.

```
apply (pop)
    Apply the Stat operator
clone()
    Deep copy of a Stat operator
```

## 2.11 Tagging operators

## 2.11.1 Class IdTagger (Can be applied directly using function tagID)

An IdTagger gives a unique ID for each individual it is applies to. These ID can be used to uniquely identify an individual in a multi-generational population and be used to reliably reconstruct a Pedigree.

To ensure uniqueness across populations, a single source of ID is used for this operator. individual IDs are assigned consecutively starting from 1. Value 1 instead of 0 is used because most software applications use 0 as missing values for parentship. If you would like to reset the sequence or start from a different number, you can call the reset (startID) function of any IdTagger.

An IdTagger is usually used during-mating to assign ID to each offspring. However, if it is applied directly to a population, it will assign unique IDs to all individuals in this population. This property is usually used in the preops parameter of function Simulator.evolve to assign initial ID to a population.

```
class IdTagger (begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, subPops=ALL_AVAIL, output="", in-
foFields="ind_id")
```

Create an IdTagger that assign an unique ID for each individual it is applied to. The IDs are created sequentially and are stored in an information field specified in parameter *infoFields* (default to ind\_id). This operator is considered a during-mating operator but it can be used to set ID for all individuals of a population when it is directly applied to the population.

```
apply (pop)
    Set an unique ID to all individuals with zero ID.
clone()
    Deep copy of an IdTagger
reset (startID=1)
```

Reset the global individual ID number so that IdTaggers will start from id (default to 1) again.

## 2.11.2 Class InheritTagger

An inheritance tagger passes values of parental information field(s) to the corresponding fields of offspring. If there are two parental values from parents of a sexual mating event, a parameter *mode* is used to specify how to assign offspring information fields.

```
class InheritTagger (mode=PATERNAL, begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, sub-
Pops=ALL_AVAIL, output="", infoFields=[])
```

Creates an inheritance tagger that passes values of parental information fields (parameter *infoFields*) to the corresponding fields of offspring. If there is only one parent, values at the specified information fields are copied directly. If there are two parents, parameter *mode* specifies how to pass them to an offspring. More specifically,

- •mode=MATERNAL Passing the value from mother.
- •mode=PATERNAL Passing the value from father.
- •mode=MEAN Passing the average of two values.
- •mode=MAXIMUM Passing the maximum value of two values.
- •mode=MINIMUM Passing the minimum value of two values.
- •mode=SUMMATION Passing the summation of two values.
- •mode=MULTIPLICATION Passing the multiplication of two values.

An RuntimeError will be raised if any of the parents does not exist. This operator does not support parameter *subPops* and does not output any information.

```
clone()
    Deep copy of a InheritTagger
```

#### 2.11.3 Class SummaryTagger

A summary tagger summarize values of one or more parental information field to another information field of an offspring. If mating is sexual, two sets of parental values will be involved.

class SummaryTagger (mode=MEAN, begin=0, end=-1, step=1, at=[], reps=ALL\_AVAIL, subPops=ALL\_AVAIL, output="", infoFields=[])

Creates a summary tagger that summarize values of one or more parental information field (*infoFields*[:-1]) to an offspring information field (*infoFields*[-1]). A parameter *mode* specifies how to pass summarize parental values. More specifically,

- •mode=MEAN Passing the average of values.
- •mode=MAXIMUM Passing the maximum value of values.
- •mode=Minumum Passing the minimum value of values.
- •mode=SUMMATION Passing the sum of values.
- •mode=MULTIPLICATION Passing the multiplication of values.

This operator does not support parameter *subPops* and does not output any information.

clone()

Deep copy of a Summary Tagger

#### 2.11.4 Class ParentsTagger

This tagging operator records the indexes of parents (relative to the parental generation) of each offspring in specified information fields (default to father\_idx and mother\_idx). Only one information field should be specified if an asexsual mating scheme is used so there is one parent for each offspring. Information recorded by this operator is intended to be used to look up parents of each individual in multi-generational Population.

```
class ParentsTagger (begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, subPops=ALL_AVAIL, output="", in-
foFields=["father_idx", "mother_idx"])
```

Create a parents tagger that records the indexes of parents of each offspring when it is applied to an offspring during-mating. If two information fields are specified (parameter *infoFields*, with default value ['father\_idx', 'mother\_idx']), they are used to record the indexes of each individual's father and mother. Value -1 will be assigned if any of the parent is missing. If only one information field is given, it will be used to record the index of the first valid parent (father if both parents are valid). This operator ignores parameters *stage*, *output*, and *subPops*.

clone()

Deep copy of a ParentsTagger

## 2.11.5 Class PedigreeTagger

This tagging operator records the ID of parents of each offspring in specified information fields (default to father\_id and mother\_id). Only one information field should be specified if an asexsual mating scheme is used so there is one parent for each offspring. Information recorded by this operator is intended to be used to record full pedigree information of an evolutionary process.

```
class PedigreeTagger (idField="ind_id", output="", begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, sub-
Pops=ALL_AVAIL, infoFields=["father_id", "mother_id"])
```

Create a pedigree tagger that records the ID of parents of each offspring when it is applied to an offspring during-mating. If two information fields are specified (parameter *infoFields*, with default value ['father\_id', 'mother\_id']), they are used to record the ID of each individual's father and mother stored in the *idField* 

(default to ind\_id) field of the parents. Value -1 will be assigned if any of the parent is missing. If only one information field is given, it will be used to record the ID of the first valid parent (father if both pedigree are valid).

This operator by default does not send any output but will output the ID of offspring, father, and mother if a valid output stream is specified. The output will be in the format of off\_id father\_id mother\_id. father\_id or mother\_id will be ignored if only one parent is involved. This operator ignores parameter stage, and subPops.

```
clone()
```

Deep copy of a PedigreeTagger

## 2.11.6 Class PyTagger

A Python tagger takes some information fields from both parents, pass them to a user provided Python function and set the offspring individual fields with the return values.

Create a hybrid tagger that provides an user provided function *func* with values of specified information fields (determined by parameter names of this function) of parents and assign corresponding information fields of offspring with its return value. If more than one parent are available, maternal values are passed after paternal values. For example, if a function func (A, B) is passed, this operator will send two tuples with parental values of information fields 'A' and 'B' to this function and assign its return values to fields 'A' and 'B' of each offspring. The return value of this function should be a list, although a single value will be accepted if only one information field is specified. This operator ignores parameters *stage*, *output* and *subPops*.

```
clone()
```

Deep copy of a PyTagger

#### 2.12 Terminator

#### 2.12.1 Class TerminateIf

This operator evaluates an expression in a population's local namespace and terminate the evolution of this population, or the whole Simulator, if the return value of this expression is True. Termination caused by an operator will stop the execution of all operators after it. The generation at which the population is terminated will be counted in the *evolved generations* (return value from Simulator::evolve) if termination happens after mating.

Create a terminator with an expression *condition*, which will be evaluated in a population's local namespace when the operator is applied to this population. If the return value of *condition* is True, the evolution of the population will be terminated. If *stopAll* is set to True, the evolution of all replicates of the simulator will be terminated. If this operator is allowed to write to an *output* (default to ""), the generation number, proceeded with an optional *message*.

```
apply(pop)
```

Apply an operator to population pop directly, without checking its applicability.

#### clone()

Deep copy of a TerminateIf terminator

## 2.13 The Python operator

### 2.13.1 Class PyOperator

An operator that calls a user-defined function when it is applied to a population (pre- or post-mating) or offsprings (during-mating). The function can have have parameters pop when the operator is applied pre- or post-mating, pop, off, dad, mom when the operator is applied during-mating. An optional parameter can be passed if parameter param is given. In the during-mating case, parameters pop, dad and mom can be ignored if offspringOnly is set to True.

Create a pure-Python operator that calls a user-defined function when it is applied. If this operator is applied before or after mating, your function should have form func (pop) or func (func, param) where pop is the population to which the operator is applied, param is the value specified in parameter *param*. param will be ignored if your function only accepts one parameter.

If this operator is applied during mating, your function should be in one of the forms func (off), func (off, param), func (pop, off, dad, mom) or func (pop, off, dad, mom, param where off is the offspring of dad and mom. This operator will pass appropriate parameters to the user-defined function depending on the number of accepted parameters.

This operator does not support parameters *output*, *subPops* and *infoFields*. If certain output is needed, it should be handled in the user defined function *func*. Because the status of files used by other operators through parameter *output* is undetermined during evolution, they should not be open or closed in this Python operator.

```
apply(pop)
```

Apply the PyOperator operator to population *pop*. Calling this function is equivalent to call *func* with parameter *pop* and optional parameter *param*.

## 2.14 Miscellaneous operators

#### 2.14.1 Class NoneOp

This operator does nothing when it is applied to a population. It is usually used as a placeholder when an operator is needed syntactically.

#### 2.14.2 Class Dumper

This operator dumps the content of a population in a human readable format. Because this output format is not structured and can not be imported back to simuPOP, this operator is usually used to dump a small population to a terminal for demonstration and debugging purposes.

```
class Dumper (genotype=True, structure=True, ancGen=0, width=1, max=100, loci=[], output=">", begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, subPops=ALL_AVAIL, infoFields=[])

Create a operator that dumps the genotype structure (if structure is True) and genotype (if genotype is True)
```

to an *output* ( default to standard terminal output). Because a population can be large, this operator will only output the first 100 (parameter *max*) individuals of the present generation (parameter *ancGen*). All loci will be outputed unless parameter *loci* are used to specify a subset of loci. If a list of (virtual) subpopulations are specified, this operator will only output individuals in these outputs. Please refer to class BaseOperator for a detailed explanation for common parameters such as *output* and *stage*.

```
apply (pop)
     Apply a Dumper operator to population pop.
clone()
     Deep copy of a Dumper operator.
```

## 2.14.3 Class SavePopulation

An operator that save populations to specified files.

```
class SavePopulation (output="", begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, subPops=ALL_AVAIL, in-
foFields=[])
```

Create an operator that saves a population to *output* when it is applied to the population. This operator supports all output specifications (", 'filename', 'filename' prefixed by one or more '>' characters, and '!expr') but output from different operators will always replace existing files (effectively ignore '>' specification). Parameter *subPops* is ignored. Please refer to class BaseOperator for a detailed description about common operator parameters such as *stage* and *begin*.

```
apply (pop)
    Apply operator to population pop.
clone()
    Deep copy of a SavePopulation operator.
```

#### 2.14.4 Class IfElse

This operator accepts an expression that will be evaluated when this operator is applied. A list of if-operators will be applied when the expression returns True. Otherwise a list of else-operators will be applied. If a value is passed directly, it will be considered as a fixed condition upon which one of *ifOps* or *elseOps* will be called.

```
class IfElse (cond, ifOps=[], elseOps=[], output=">", begin=0, end=-1, step=1, at=[], reps=ALL_AVAIL, sub-
Pops=ALL_AVAIL, infoFields=[])
```

Create a conditional operator that will apply operators *ifOps* if condition *cond* is met and *elseOps* otherwise. If a Python expression is given to parameter *cond*, the expression will be evalulated in each population's local namespace when this operator is applied. If a fixed value is given, the condition when the operator is created always holds. The applicability of *ifOps* and *elseOps* are controlled by parameters *begin*, *end*, *step*, *at* and *rep* of both the IfElse operator and individual operators but *ifOps* and *elseOps* operators does not support negative indexes for replicate and generation numbers.

```
apply (pop)
Apply the IfElse operator to population pop.
```

#### 2.14.5 Class Pause

This operator pauses the evolution of a simulator at given generations or at a key stroke. When a simulator is stopped, you can go to a Python shell to examine the status of an evolutionary process, resume or stop the evolution.

 $\textbf{class Pause} (stopOnKeyStroke=False, prompt=True, output=">", begin=0, end=-1, step=1, at=[], reps=ALL\_AVAIL, subPops=ALL\_AVAIL, infoFields=[])$ 

Create an operator that pause the evolution of a population when it is applied to this population. If *stopOn-KeyStroke* is False (default), it will always pause a population when it is applied, if this parameter is set to True, the operator will pause a population if \*any\* key has been pressed. If a specific character is set, the operator will stop when this key has been pressed. This allows, for example, the use of several pause operators to pause different populations.

After a population has been paused, a message will be displayed (unless *prompt* is set to False) and tells you how to proceed. You can press 's' to stop the evolution of this population, 'S' to stop the evolution of all populations, or 'p' to enter a Python shell. The current population will be available in this Python shell as "pop\_X\_Y" when X is generation number and Y is replicate number. The evolution will continue after you exit this interactive Python shell.

**Note** Ctrl-C will be intercepted even if a specific character is specified in parameter *stopOnKeyStroke*. apply (*pop*)

Apply the Pause operator to one population

#### 2.14.6 Class TicToc

This operator, when called, output the difference between current and the last called clock time. This can be used to estimate execution time of each generation. Similar information can also be obtained from turnOnDebug("DBG\_PROFILE"), but this operator has the advantage of measuring the duration between several generations by setting step parameter.

class TicToc (output=">", begin=0, end=-1, step=1, at=[], reps=ALL\_AVAIL, subPops=ALL\_AVAIL, infoFields=[])

Create a TicToc operator that outputs the elapsed since the last time it was applied, and the overall time since the first time this operator is applied.

# 2.15 Function form of operators

#### 2.15.1 Function dump

```
dump (pop, *args, **kwargs)
Apply operator Dumper to population pop.
```

#### 2.15.2 Function initSex

```
initSex (pop, *args, **kwargs)
Apply operator InitSex to population pop.
```

#### 2.15.3 Function initInfo

```
initInfo (pop, *args, **kwargs)
Apply operator InitInfo to population pop.
```

## 2.15.4 Function initByFreq

```
initByFreq (pop, *args, **kwargs)
Apply operator InitByFreq to population pop.
```

## 2.15.5 Function initByValue

initByValue (pop, \*args, \*\*kwargs)

Apply operator InitByValue to population pop.

## 2.15.6 Function pyEval

pyEval (pop, \*args, \*\*kwargs)

Evaluate statements *stmts* (optional) and expression *expr* in population *pop*'s local namespace and return the result of *expr*. If *exposePop* is given, population *pop* will be exposed in its local namespace as a variable with a name specified by *exposePop*. Unlike its operator counterpart, this function returns the result of *expr* rather than writting it to an output.

## 2.15.7 Function pyExec

pyExec (pop, \*args, \*\*kwargs)

Execute stmts in population pop's local namespace.

#### 2.15.8 Function infoEval

infoEval (pop, \*args, \*\*kwargs)

Evaluate *expr* for each individual, using information fields as variables. Please refer to operator InfoEval for details.

#### 2.15.9 Function infoExec

infoExec (pop, \*args, \*\*kwargs)

Execute *stmts* for each individual, using information fields as variables. Please refer to operator InfoExec for details.

## 2.15.10 Function migrate

migrate (pop, \*args, \*\*kwargs)

Function form of operator Migrator.

#### 2.15.11 Function resizeSubPops

resizeSubPops (pop, \*args, \*\*kwargs)

Resize subpopulations *subPops* of population *pop* into new sizes *size*. Individuals will be added or removed accordingly. Please refer to the operator form of this function (ResizeSubPops) for details

#### 2.15.12 Function mergeSubPops

mergeSubPops (pop, \*args, \*\*kwargs)

Merge subpopulations *subPops* of population *pop* into a single subpopulation. Please refer to the operator form of this funciton (MergeSubPops) for details

## 2.15.13 Function splitSubPops

#### splitSubPops (pop, \*args, \*\*kwargs)

Split subpopulations (*subPops*) of population *pop* according to either *sizes* or *proportions* of the resulting subpopulations, or an information field. Please refer to the operator form of this function (splitSubPop) for details.

#### 2.15.14 Function matrixMutate

matrixMutate(pop, \*args, \*\*kwargs)
Function form of operator MatrixMutator

## 2.15.15 Function snpMutate

snpMutate (pop, \*args, \*\*kwargs)
Function form of operator SNPMutator

## 2.15.16 Function acgtMutate

acgtMutate (pop, \*args, \*\*kwargs)
Function form of operator AcqtMutator

#### 2.15.17 Function kAlleleMutate

**kAlleleMutate** (pop, \*args, \*\*kwargs)
Function form of operator KAlleleMutator

#### 2.15.18 Function stepwqiseMutate

stepwqiseMutate(pop, \*args, \*\*kwargs)
Function form of operator StepwiseMutator

## 2.15.19 Function pyMutate

pyMutate (pop, \*args, \*\*kwargs)
Function form of operator PyMutator

#### 2.15.20 Function mixedMutate

mixedMutate (pop, \*args, \*\*kwargs)
Function form of operator MixedMutator

#### 2.15.21 Function contextMutate

contextMutate (pop, \*args, \*\*kwargs)
Function form of operator ContextMutator

## 2.15.22 Function pointMutate

pointMutate(pop, \*args, \*\*kwargs)

Function form of operator PointMutator

#### 2.15.23 Function stat

stat (pop, \*args, \*\*kwargs)

Apply operator Stat with specified parameters to population pop. Resulting statistics could be accessed from the local namespace of pop using functions pop.vars() or pop.dvars()

#### 2.15.24 Function tagID

tagID (pop, reset=False, \*args, \*\*kwargs)

Apply operator IdTagger to population pop to assign a unique ID to all individuals in the population. Individuals ID will starts from a system wide index. You can reset this start ID using parameter reset which can be True (reset to 1) or a non-negative number (start from this number).

#### 2.15.25 Function mapPenetrance

mapPenetrance (pop, loci, penetrance, ancGen=-1, \*args, \*\*kwargs)

Apply opertor MapPenetrance to population pop. Unlike the operator form of this operator that only handles the current generation, this function by default assign affection status to all generations.

#### 2.15.26 Function maPenetrance

maPenetrance (pop, loci, penetrance, wildtype=0, ancGen=-1, \*args, \*\*kwargs)

Apply opertor MaPenetrance to population pop. Unlike the operator form of this operator that only handles the current generation, this function by default assign affection status to all generations.

#### 2.15.27 Function mlPenetrance

mlPenetrance (pop, ops, mode, ancGen=-1, \*args, \*\*kwargs)

Apply opertor MapPenetrance to population pop. Unlike the operator form of this operator that only handles the current generation, this function by default assign affection status to all generations.

#### 2.15.28 Function pyPenetrance

pyPenetrance (pop, func, loci=[], ancGen=-1, \*args, \*\*kwargs)

Apply opertor MapPenetrance to population pop. Unlike the operator form of this operator that only handles the current generation, this function by default assign affection status to all generations.

## 2.15.29 Function pyQuanTrait

pyQuanTrait (pop, func, loci=[], ancGen=-1, \*args, \*\*kwargs)

Apply opertor PyQuanTrait to population pop. Unlike the operator form of this operator that only handles the current generation, this function by default assign affection status to all generations.

# **Chapter 3**

# **Utility Modules**

## 3.1 Module simuOpt

Module "simuOpt" provides a function "simuOpt.setOptions" to control which simuPOP module to load, and how it is loaded, and a class "simuOpt.simuOpt" that helps users manage script options.

When simuPOP is loaded, it checkes a few environmental variables ("SIMUOPTIMIZED", "SIMUALLELETYPE", and "SIMUDEBUG") to determine which simuPOP module to load, and how to load it. More options can be set using the "simuOpt.setOptions" function. For example, you can suppress the banner message when simuPOP is loaded and require a minimal revision of simuPOP for your script. simuPOP recognize the following commandline arguments

"-optimized" Load the optimized version of a simuPOP module.

"-gui=TruelFalselwxPythonlTkinter" Whether or not use a graphical toolkit and which one to use. "-gui=False" is usually used to run a script in batch mode (do not start a parameter input dialog and use interactive user input if a parameter can not be determined from command line or a configuration file, and it does not use its default value ("useDefault" not set). Please refer to parameter "gui" for "simuOpt.setOptions" for details.

class "params.SimuParam" provides a powerful way to handle commandline arguments. Briefly speaking, a "Simu-Param" object can be created from a list of parameter specification dictionaries. The parameters are then become attributes of this object. A number of functions are provided to determine values of these parameters using commandline arguments, a configuration file, or a parameter input dialog (using "Tkinter" or "wxPython"). Values of these parameters can be accessed as attributes, or extracted as a list or a dictionary. Note that the "SimuParam.getParam" function automatically handles the following commandline arguments.

"-h" or "-help" Print usage message.

"-config=configFile" Read parameters from a configuration file \*configFile\*.

### 3.1.1 Function setOptions

**setOptions** (alleleType=None, optimized=None, gui=None, quiet=None, debug=None, revision=None)
Set options before simuPOP is loaded to control which simuPOP module to load, and how the module should be loaded.

alleleType: Use the standard, binary or long allele version of the simuPOP module if alleleType is set to 'short', 'binary', or 'long' respectively. If this parameter is not set, this function will try to get its value from environmental variable SIMUALLELETYPE. The standard (short) module will be used if the environmental variable is not defined.

optimized: Load the optimized version of a module if this parameter is set to True and the standard version if it is set to False. If this parameter is not set (None), the optimized version will be used if environmental

- variable SIMUOPTIMIZED is defined. The standard version will be used otherwise.
- gui: Whether or not use graphical user interfaces, and which graphical toolkit to use. If this parameter is None (default), this function will check environmental variable SIMUGUI for a value, and assume True if such an option is unavailable.
- gui=True: allows simuPOP to use wxPython-based dialogs if wxPython is available, and use Tkinter-based dialogs if Tkinter is available.
- gui='Tkinter': Use Tkinter based dialogs even if wxPython is available.
- gui='wxPython': Use wxPython based dialogs. Usually not needed.
- gui=False: Do not use any graphical toolkit. Run the script in batch mode.
- This option is usually left to None so that the same script can be ran in both GUI and batch mode using commandline option --gui.
- quiet: If set to True, suppress the banner message when a simuPOP module is loaded.
- debug: A list of debug code (as string) that will be turned on when simuPOP is loaded. If this parameter is not set, a list of comma separated debug code specified in environmental variable SIMUDEBUG, if available, will be used. Note that setting debug=[] will remove any debug code that might have been by variable SIMUDEBUG.
- *revision:* A number indicating the required revision number for the simuPOP module to be loaded. simuPOP will fail to load if the installed simuPOP is older than the required revision. Please check simuPOP ChangeLog for the revision number of distributed versions.

#### 3.1.2 Class SimuParam

class SimuParam provides a uniform interface for simuPOP scripts to handle parameters. It allows users to get parameters from command line options, a configuration file, a parameter input dialog (*tkInter* or *wxPython*) or from interative input. This class provides parameter validation, conversion and and some utility functions to print, save and restore parameters.

A SimuParam object accepts a parameter specification list that consists of dictionaries with pre-defined keys. Each item defines an option in terms of command line option, entry name in a configuration file, label in a parameter input dialog, acceptable types, validation rules and a default value. The following keys are currently supported:

- arg: Short command line option name. For example 'c' checks the presence of argument -c. If a value is expected, a comma should be appened to the option name. For example, 'p:' matches command line option -p=100 or -p=100. An options that does not expect a value is displayed in the parameter input dialog as an on/off switch.
- longarg: Long command line option name. For example 'version' checks the presence of argument --version. A equal character should be appended to the option name if a value is expected. For example, 'mu=' matches command line option --mu=0.001 or --mu 0.001. This item defines the name of an option and cannot be ignored. An options that does not expect a value is displayed in the parameter input dialog as an on/off switch.
- *label:* The label of the input field in a parameter input dialog. It will also be used as the prompt for this option during interactive parameter input. **Options without a label will not be displayed in the parameter input dialog and will not be saved to a configuration file.** A typical example of such an option is --version.
- default: Default value for this parameter. It is used as the default value in the parameter input dialog, and as the option value when a user presses Enter directly during interactive parameter input. A default value is required for all options.
- useDefault: Use default value without asking, if the value can not be determined from GUI, command line option or config file. This is usually used for options that rarely need to be changed. Setting useDefault to such options simplifies user input.
- description: A long description of this parameter. This description will be put into the usage information, and as parameter tooltip in the parameter input dialog. This string will be reformatted when it is written to a usage

string (remove newlines and extra spaces and re-indent), with the exception that lines with 'l' as the first non-space/tab character will be outputed as is without the leading 'l' symbol.

- allowedTypes: A list of acceptable types of this option. class SimuParam will try to convert user input to these types. For example, if allowedTypes is types.ListType or types.TupleType and the user's input is a scalar, the input will be converted to a list automatically. An option will not be accepted if such conversion fails. If this item is not specified, the type of the default value will be used. If only one type is acceptable, a single value can be used as input (ignore []).
- *validate:* A function to validate the parameter. The function will be applied to user input. The option will not be accepted if this function returns False. This module defines a large number of such validation functions but user defined functions are also acceptable.
- chooseOneOf: If specified, a list of specified values will be displayed in the parameter input dialog and users are allowed to choose one of them.
- *chooseFrom:* If specified, a list of specified values will be displayed in the parameter input dialog and users are allowed to choose one or more of them.

separator: This item specifies a separator (group header) in the parameter input dialog. All other fields are ignored.

Not all keys need to be specified in each option description. Missing values are handled using some internal rules. For example, items without a label will not be displayed on the parameter dialog. This will effectively *hide* a parameter although users who know this parameter can set it using command line options.

The SimuParam. SimuParam class defines a number of functions to collect, validate, and manipulate parameters using this parameter specification list.

As a shortcut to create a SimuParam object with a number of attributes, a SimuParam object can be created with additional key=value pairs that could be assessed as attributes. This is used to create a SimuParam object in which *parameters* are assigned directly.

### class SimuParam (options=[], doc=", details=", \*\*kwargs)

Create a SimuParam oject using a list of parameter specification dictionaries *options*. Additional *doc* and *details* can be specified which will be displayed as script summary (on the top of a parameter input dialog) and script introduction (the first part of a help message), respectively. Additional attributes could be assigned to a SimuParam object as keyword arguments. Note that it is customary to use module document (the first string object in a Python script) as *details*, using parameter details=\_\_doc\_\_.

#### addOption (pos=-1, \*\*kwargs)

Append an entry to the parameter specification list. Dictionary entries should be specified as keyword arguments such as longarg='option='. More specifically, you can specify parameters arg, longarg (required), label, allowedTypes, useDefault, default (required), description, validate, chooseOneOf, chooseFrom and separator. This option will have a name specified by longarg (without optional trailing =) and an initial default value specified by default.

An optional parameter pos can be given to specify an index before which this option will be inserted.

#### asDict()

Return parameters as a dictionary.

#### asList()

Return parameters as a list.

#### **getParam** (gui=None, nCol=None, configFile=None, args=None, checkArgs=True)

Get parameters from commandline option, configuration file, a parameter input dialog and from interactive user input.

gui: Whether or not use a dialog and which graphical toolkit to use. Global gui setting is used by default but you can also set this parameter to True, False, Tkinter or wxPython to override the global setting.

- *nCol*: Number of columns in the parameter input dialog. This is usual determine automatically depending on the number of options.
- *configFile:* Configuration file from which to load values of parameters. If unspecified, it will be determined from command line option --config.
- args: Command line arguments are obtained from sys.argv unless a list of options are provided in this argument.
- *checkArgs:* This function by default checks if all commandline arguments have been processed, you can set chekArgs to False if some of the arguments are intended to be processed separately.

#### guiGetParam (nCol=None, gui=None)

Get parameter from a Tkinter or wxPython dialog. The parameter will try to arrange parameters optimaly but you can also set the number of columns using parameter nCol. If both GUI toolkits are available, wxPython will be used unless gui is set to Tkinter. If none of the toolkits are available, this function will raise an ImportError.

If SimuParam.valueValidFile or SimuParam.valueValidDir is used to validate a parameter, double click the text input box of this parameter will open a file or directory browse dialog.

### loadConfig (file, params=[])

Load configuration from a file. If a list of parameters are specified in *params*, only these parameters will be processed.

### processArgs (args=None, params=[])

Try to get parameters from a list of arguments *args* (default to sys.argv). If -h or --help is in *args*, this function prints out a usage message and returns False. If a list of parameters are specified in *params*, only these parameters will be processed.

### saveConfig (file, params=[])

Write a configuration file to *file*. This file can be later read with command line option -c or --config. All parameters with a label entry are saved unless a list of parameters are specified in *params*. In addition to parameter definitions, command lines options to specify the same set of parameters are saved to the configuration file.

### termGetParam (params=[])

Get parameters from interactive user input. By default, all parameters are processed unless one of the following conditions is met:

- 1.Parameter without a label
- 2. Parameter with useDefault set to True
- 3. Parameter that have been determined from command line options or a configuration file
- 4. Parameter that have been determined by a previous call of this function.

If a list of parameters are given in *params*, these parameters are processed regardless the mentioned conditions.

```
usage (usage='usage: %prog [-opt [arg] | -opt [=arg]] ...')
```

Reutn the usage message from the option description list. '%prog' in parameter *usage* will be replaced by os.path.basename(sys.argv[0]).

### 3.1.3 Function param

#### param(\*\*kwargs)

A simple wrapper that allows the specification of a parameter using a function instead of a dictionary. Please refer to class simuOpt.SimuParam for allowed keyword arguments and their meanings.

### 3.1.4 Function valueNot

#### valueNot (t)

Return a function that returns true if passed option does not passes validator t

#### 3.1.5 Function valueOr

### valueOr(t1, t2)

Return a function that returns true if passed option passes validator t1 or t2

### 3.1.6 Function valueAnd

#### valueAnd(t1, t2)

Return a function that returns true if passed option passes validator t1 and t2

### 3.1.7 Function valueOneOf

#### valueOneOf(t)

Return a function that returns true if passed option is one of the values list in t

#### 3.1.8 Function valueTrueFalse

#### valueTrueFalse()

Return a function that returns true if passed option is True or False

#### 3.1.9 Function valueBetween

### valueBetween (a, b)

Return a function that returns true if passed option is between value a and b (a and b included)

### 3.1.10 Function valueGT

#### valueGT(a)

Return a function that returns true if passed option is greater than a

### 3.1.11 Function valueGE

### valueGE(a)

Return a function that returns true if passed option is greater than or equal to a

### 3.1.12 Function valueLT

#### valueLT(a)

Return a function that returns true if passed option is less than a

### 3.1.13 Function valueLE

#### valueLE(a)

Return a function that returns true if passed option is less than or equal to a

### 3.1.14 Function valueEqual

#### valueEqual(a)

Return a function that returns true if passed option equals a

### 3.1.15 Function valueNotEqual

#### valueNotEqual(a)

Return a function that returns true if passed option does not equal a

#### 3.1.16 Function valueIsNum

### valueIsNum()

Return a function that returns true if passed option is a number (int, long or float)

### 3.1.17 Function valueIsList

#### valueIsList()

Return a function that returns true if passed option is a list (or tuple)

#### 3.1.18 Function valueValidDir

### valueValidDir()

Return a function that returns true if passed option val if a valid directory

### 3.1.19 Function valueValidFile

#### valueValidFile()

Return a function that returns true if passed option val if a valid file

### 3.2 Module simuPOP.utils

This module provides some commonly used operators and format conversion utilities.

### 3.2.1 Class Trajectory

A Trajectory object contains frequencies of one or more loci in one or more subpopulations over several generations. It is usually returned by member functions of class TrajectorySimulator or equivalent global functions simulateForwardTrajectory and simulateBackwardTrajectory.

The Trajectory object provides several member functions to facilitate the use of Trajectory-simulation techniques. For example, Trajectory.func() returns a trajectory function that can be provided directly to a

ControlledOffspringGenerator; Trajectory.mutators() provides a list of PointMutator that insert mutants at the right generations to initialize a trajectory.

For more information about Trajectory simulation techniques and related controlled random mating scheme, please refer to the simuPOP user's guide, and Peng et al (PLoS Genetics 3(3), 2007).

#### class Trajectory (endGen, nLoci)

Create a Trajectory object of alleles at *nLoci* loci with ending generation *endGen*. *endGen* is the generation when expected allele frequencies are reached after mating. Therefore, a trajectory for 1000 generations should have endGen=999.

#### freq(gen, subPop)

Return frequencies of all loci in subpopulation *subPop* at generation *gen* of the simulated Trajectory. Allele frequencies are assumed to be zero if *gen* is out of range of the simulated Trajectory.

#### func()

Return a Python function that returns allele frequencies for each locus at specified loci. If there are multiple subpopulations, allele frequencies are arranged in the order of loc0\_sp0, loc1\_sp0, ..., loc0\_sp1, loc1\_sp1, ... and so on. The returned function can be supplied directly to the freqFunc parameter of a controlled random mating scheme (ControlledRandomMating) or a homogeneous mating scheme that uses a controlled offspring generator (ControlledOffspringGenerator).

### mutators (loci, inds=0, allele=1, \*args, \*\*kwargs)

Return a list of PointMutator operators that introduce mutants at the beginning of simulated trajectories. These mutators should be added to the ops parameter of Simulator.evolve function to introduce a mutant at the beginning of a generation with zero allele frequency before mating, and a positive allele frequency after mating. A parameter loci is needed to specify actual loci indexes in the real forward simulation. Other than default parameters inds=0 and allele=1, additional parameters could be passed to point mutator as keyward parameters.

### plot (filename=None, \*\*kwargs)

Plot simulated Trajectory using R through a Python module rpy. The function will return silently if module plotter cannot be imported.

This function will use different colors to plot trajectories at different loci. The trajectories are plotted from generation 0 to *endGen* even if the trajectories are short. The y-axis ranges from 0 to 1 and is labeled Allele frequency. If a valid *filename* is given, the figure will be saved to *filename* in a format specified by file extension. Currently supported formats/extensions are eps, jpg, bmp, tif, png and pdf. The availability of formats may be limited by your version of R.

This function makes use of the derived keyword parameter feature of module plotter. Allowed prefixes are par, plot, lines and dev\_print. Allowed repeating suffix are loc and sp. For example, you could use parameter plot\_ylim to reset the default value of ylim in R function plot.

### 3.2.2 Class TrajectorySimulator

A Trajectory Simulator takes basic demographic and genetic (natural selection) information of an evolutionary process of a diploid population and allow the simulation of Trajectory of allele frequencies of one or more loci. Trajectories could be simulated in two ways: forward-time and backward-time. In a forward-time simulation, the simulation starts from certain allele frequency and simulate the frequency at the next generation using given demographic and genetic information. The simulation continues until an ending generation is reached. A Trajectory is successfully simulated if the allele frequency at the ending generation falls into a specified range. In a backward-time simulation, the simulation starts from the ending generation with a desired allele frequency and simulate the allele frequency at previous generations one by one until the allele gets lost (allele frequency equals zero).

The result of a trajectory simulation is a trajectory object which can be used to direct the simulation of a special random mating process that controls the evolution of one or more disease alleles so that allele frequencies are consistent across

replicate simulations. For more information about Trajectory simulation techniques and related controlled random mating scheme, please refer to the simuPOP user's guide, and Peng et al (PLoS Genetics 3(3), 2007).

#### class TrajectorySimulator (N, nLoci=1, fitness=None, logger=None)

Create a trajectory Simulator using provided demographic and genetic (natural selection) parameters. Member functions *simuForward* and *simuBackward* can then be used to simulate trajectories within certain range of generations. This class accepts the following parameters

- N: Parameter N accepts either a constant number for population size (e.g. N=1000), a list of subpopulation sizes (e.g. N=[1000, 2000]), or a demographic function that returns Population or subpopulation sizes at each generation. During the evolution, multiple subpopulations can be merged into one, and one population can be split into several subpopulations. The number of subpopulation is determined by the return value of the demographic function. Note that N should be considered as the population size at the end of specified generation.
- *nLoci:* Number of unlinked loci for which trajectories of allele frequencies are simulated. We assume a diploid population with diallelic loci. The Trajectory represents frequencies of a
- fitness: Parameter fitness can be None (no selection), a list of fitness values for genotype with 0, 1, and 2 disease alleles (AA, Aa, and aa) at one or more loci; or a function that returns fitness values at each generation. When multiple loci are involved (nLoci), fitness can be a list of 3 (the same fitness values for all loci), a list of 3\*nLoci (different fitness values for each locus) or a list of 3\*\*nLoci (fitness value for each combination of genotype). The fitness function should accept generation number and a subpopulation index. The latter parameter allows, and is the only way to specify different fitness in each subpopulation.
- *logger:* A logging object (see Python module logging) that can be used to output intermediate results with debug information.

#### simuBackward (endGen, endFreq, minMutAge=None, maxMutAge=None, maxAttempts=1000)

Simulate trajectories of multiple disease susceptibility loci using a forward time approach. This function accepts allele frequencies of alleles of multiple unlinked loci (endFreq) at the end of generation endGen. Depending on the number of loci and subpopulations, parameter beginFreq can be a number (same frequency for all loci in all subpopulations), or a list of frequencies for each locus (same frequency in all subpopulations), or a list of frequencies for each locus in each subpopulation in the order of loc0\_sp0, loc1\_sp0, ..., loc0\_sp1, loc1\_sp1, ... and so on.

This simulator will simulate a trajectory generation by generation and restart if the disease allele got fixed (instead of lost), or if the length simulated Trajectory does not fall into *minMutAge* and *maxMutAge* (ignored if None is given). This simulator will return None if no valid Trajectory is found after maxAttempts attemps.

#### simuForward (beginGen, endGen, beginFreq, endFreq, maxAttempts=10000)

Simulate trajectories of multiple disease susceptibility loci using a forward time approach. This function accepts allele frequencies of alleles of multiple unlinked loci at the beginning generation (freq) at generation begingen, and expected *range* of allele frequencies of these alleles (endFreq) at the end of generation endGen. Depending on the number of loci and subpopulations, these parameters accept the following inputs:

- *beginGen:* Starting generation. The initial frequecies are considered as frequencies at the *beginning* of this generation.
- endGen: Ending generation. The ending frequencies are considerd as frequencies at the end of this generation.
- beginFreq: The initial allele frequency of involved loci in all subpopulations. It can be a number (same frequency for all loci in all subpopulations), or a list of frequencies for each locus (same frequency in all subpopulations), or a list of frequencies for each locus in each subpopulation in the order of loc0\_sp0, loc1\_sp0, ..., loc0\_sp1, loc1\_sp1, ... and so on.
- endFreq: The range of acceptable allele frequencies at the ending generation. The ranges can be specified for all loci in all subpopulations, for all loci (allele frequency in the whole population is considered), or for all loci in all subpopulations, in the order of loc0\_sp0, loc1\_sp0, .... loc0\_sp1, ... and so on.

This simulator will simulate a trajectory generation by generation and restart if the resulting frequencies do not fall into specified range of frequencies. This simulator will return None if no valid Trajectory is found after maxAttempts attemps.

### 3.2.3 Function simulateForwardTrajectory

simulateForwardTrajectory (N, beginGen, endGen, beginFreq, endFreq, nLoci=1, fitness=None, maxAttempts=10000, logger=None)

Given a demographic model (N) and the fitness of genotype at one or more loci (fitness), this function simulates a trajectory of one or more unlinked loci (nLoci) from allele frequency freq at generation beginGen forward in time, until it reaches generation endGen. A Trajectory object will be returned if the allele frequency falls into specified ranges (endFreq). None will be returned if no valid Trajectory is simulated after maxAttempts attempts. Please refer to class Trajectory, TrajectorySimulator and their member functions for more details about allowed input for these parameters.

### 3.2.4 Function simulateBackwardTrajectory

simulateBackwardTrajectory (N, endGen, endFreq, nLoci=1, fitness=None, minMutAge=None, maxMutAge=None, maxAttempts=1000, logger=None)

Given a demographic model (N) and the fitness of genotype at one or more loci (fitness), this function simulates a trajectory of one or more unlinked loci (nLoci) from allele frequency freq at generation endGen backward in time, until all alleles get lost. A Trajectory object will be returned if the length of simulated Trajectory with minMutAge and maxMutAge (if specified). None will be returned if no valid Trajectory is simulated after maxAttempts attempts. Please refer to class Trajectory, TrajectorySimulator and their member functions for more details about allowed input for these parameters.

### 3.2.5 Function migrIslandRates

#### migrIslandRates(r, n)

migration rate matrix

```
x m/(n-1) m/(n-1) \dots

m/(n-1) x \dots

\dots

\dots

m/(n-1) m/(n-1) x

where x = 1-m
```

#### 3.2.6 Function migrHierarchicalIslandRates

### migrHierarchicalIslandRates (r1, r2, n)

Return the migration rate matrix for a hierarchical island model where there are different migration rate within and across groups of islands.

- r1: Within group migration rates. It can be a number or a list of numbers for each group of the islands.
- *r2:* Across group migration rates which is the probability that someone will migrate to a subpopulation outside of his group. A list of r2 could be specified for each group of the islands.
- n: Number of islands in each group. E.g. n=[5, 4] specifies two groups of islands with 5 and 4 islands each.

For individuals in an island, the probability that it remains in the same island is 1-r1-r2 (r1, r2 might vary by island groups), that it migrates to another island in the same group is r1 and migrates to another island outside of the group is r2. migrate rate to a specific island depends on the size of group.

### 3.2.7 Function migrSteppingStoneRates

```
migrSteppingStoneRates (r, n, circular=False)
```

migration rate matrix, circular stepping stone model (X=1-m)

or non-circular

### 3.2.8 Class SimuProgress

The SimuProgress class defines a progress bar. This class will use a text-based progress bar that outputs progressing dots (.) with intermediate numbers (e.g. 5 for 50%) under a non-GUI mode (gui=False). In the GUI mode, a Tkinter or wxPython progress dialog will be used (gui=Tkinter or gui=wxPython). The default mode is determined by the global gui mode of simuPOP (see also simuOpt.setOptions).

This class is usually used as follows:

#### 3.2.9 Function viewVars

update (count)

```
viewVars (var, gui=None)
```

Update the progreebar.

list a variable in tree format, either in text format or in a: wxPython window.

var: A dictionary variable to be viewed. Dictionary wrapper objects returned by Population.dvars() and Simulator.dvars() are also acceptable.

gui: If gui is False or 'Tkinter', a text presentation (use the pprint module) of the variable will be printed to the screen. If gui is 'wxPython' and wxPython is available, a wxPython windows will be used. The default mode is determined by the global gui mode (see also simuOpt.setOptions).

#### 3.2.10 Function saveCSV

```
saveCSV (pop, filename=", fields=[], loci=[], header=True, shift=1, combine=None, sexCode={1: '1', 2: '2'}, affectionCode={False: '2', True: '1'}, **kwargs)
Save a simuPOP population pop in csv format.
```

pop: A simuPOP population object. If a string is given, it will be loaded.

filename: Output filename.

fileds: Information fields to be outputted.

*loci*: If a list of loci is given, only genotype at these loci will be written.

header: Whether or not a header should be written. These headers will include information fields, sex (if sexCode is not None), affection status (if affectionCode is not None) and loci names. If genotype at a locus needs more than one column, 1, 2 etc will be appended to locus names.

genotype: list of loci to output, default to all.

combine: how to combine the markers. Default to None. A function can be specified, that takes the form:

```
def func(markers):
    return markers[0]+markers[1]
```

*shift:* since alleles in simuPOP is 0-based, shift=1 is usually needed to output alleles starting from allele 1. This parameter is ignored if combine is used.

# 3.3 Module simuPOP.plotter

This module defines several utility functions and Python operators that make use of the Python rpy module (http://rpy.sourceforge.net) to plot expressions and information fields of evolving populations using a popular statistical analysis language R (http://www.r-project.org). Note that rpy2, the successor of rpy, is currently not supported.

Each operator calls a sequence of R functions to draw and save figures. A special parameter passing mechanism is used so that you can specify arbitrary parameters to these functions. For example, you can use parameter "par\_mfrow=[2,2]" to pass "mfrow=[2,2]" to function "par", and use "lty\_rep=[1,2]" to pass "lty=1" and "lty=2" to specify different line types for different replicates. The help message of each class will describe which and in what sequence these R functions are called to help you figure out which parameters are allowed.

#### 3.3.1 Function newDevice

#### newDevice()

Create a new graphics window and return its device number in R. This function essentially calls getOption('device')() in R.

### 3.3.2 Function saveFigure

```
saveFigure (file=None, **kwargs)
```

Save current figure into file. File format and graphics device are determined by file extension. Supported file formats include pdf, png, bmp, jpg (jpeg), tif (tiff), and eps, which correspond to R devices pdf, png, bmp, jpeg, tiff and postscript. A postscript device will be used if there is no file extension or the

file extension is not recognizable. Additional keyword parameters will be passed to the underlying dev.print function.

### 3.3.3 Class DerivedArgs

This class implements the derived keyword argument handling mechanism that is used by all classes defined in this module. It is provided for users who would like to use this mechanism for their own rpy-related operators.

An derived keyword argument is an argument that is prefixed with a function name and/or suffixed by an iterator name. The former specifies to which underlying R function this parameter will be passed to; the latter allows the users to specify a list of values that will be passed, for example, to lines representing different replicates. For example, parameter  $par_mar=[1]*4$  will pass mar=[1]\*4 to R function par, and  $lty_rep=[1, 2, 3]$  will pass lty=1, lty=2 and lty=3 to different replicates.

Values provided to derived arguments are usually passed unchanged, but with one exception: string value with a leading! mark will be evaluated against the current population before it is returned. For example, main='!"Allele frequency at generation %d" % gen' will return main="Allele frequency at generation 100" at generation 100.

```
class DerivedArgs (defaultFuncs=[], allFuncs=[], suffixes=[], defaultParams={}, **kwargs) defaultFunc: Default functions. Parameters without a prefix will be passed to these functions.
```

allFuncs: Allowed functions. This should be all the R functions called in your class.

suffixes: A list of allowed suffixes.

defaultParams: Default parameters in a dictionary. E.g. {'plot\_type': 'l'} will pass type='l' to the plot function unless users provides another value.

kwargs: User specified parameters. These parameters will overwide default values in defaultParams.

```
addDefault (**kwargs)
```

Add keyword parameters kwargs if they have not been defined.

```
getArgs (func, pop, **kwargs)
```

Get all single format parameters from keyword parameters. Additional keyword arguments can be used to specify suffix and its index. (e.g. rep=1 will return the second element of par\_rep). Unrecognized keyword arguments are handled as default value that will be used if a parameter is not defined. E.g. getArgs('line', pop, rep=1, pch=4) will get parameters for replicate 1 and add pch=4 if pch is not defined.

```
getLegendArgs (func, pop, args, keys, values, **kwargs)
```

Get argument values for legend drawing purposes. For example,

```
getMultiArgs('lines', pop, ['lty', 'pch'], 'rep', [0,1,2])
```

will get parameter for lty and pch for all rep. If there are more keys (e.g. ['rep', 'dim']), values should be a list of of lists (e.g., [(0, 0), (0, 1), (0, 2), (1, 0), (1, 1), (1, 2)]). Default values could be passed as additional keyword arguments.

### 3.3.4 Class VarPlotter

This class defines a Python operator that uses R to plot the current and historical values of a Python expression (expr), which are evaluated (against each population's local namespace) and saved during evolution. The return value of the expression can be a number or a sequence, but should have the same type and length across all replicates and generations. Histories of each value (or each item in the returned sequence) of each replicate form a line, with generation numbers as its x-axis. Number of lines will be the number of replicates multiplied by dimension of the expression. Although complete histories are usually saved, you can use parameter win to save histories only within the last win generations.

A figure will be draw at the end of the last replicate (except for the first generation where no line could be drawn) unless the current generation is less than update generations away from the last generation at which a figure has been drawn. Lines for multiple replicates or dimensions could be plotted in the same figure (by default), or be seperated to subplots by replicates (byRep), by each dimension of the results (byDim), or by both. These figure could be saved to files in various formats if parameter saveAs is specified. File format is determined by file extension. After the evolution, the graphic device could be left open (leaveOpen).

Besides parameters mentioned above, arbitrary keyword parameters could be specified and be passed to the underlying R drawing functions plot and lines. These parameters could be used to specify line type (lty), color (col), title (main), limit of x and y axes (xlim and ylim) and many other options (see R manual for details). As a special case, multiple values can be passed to each replicate and/or dimension if the name of a parameter ends with \_rep, \_dim, or \_repdim For example, lty\_rep=range(1, 5) will pass parameters lty=1, ... lty=4 to four replicates. You can also pass parameters to specific R functions such as par, plot, lines, legend, dev\_print by prefixing parameter names with a function name. For example, dev\_print\_width=300 will pass width=300 to function dev.print() when you save your figures using this function. In addition, if the value of a parameter is a string starting with!, the evaluated result of the remaining string will be used as parameter value. Further customization of your figures could be achieved by writing your own hook functions that will be called before and after a figure is drawn, and after each plot call.

This opertor calls R functions par, plot, lines, legend, and dev.print. Functions plot and lines are the default destination for keyword arguments and the ones that accept list parameters to customize lines by replicate and/or dimension.

*expr*: expression that will be evaluated at each replicate's local namespace when the operator is applied. Its value can be a number or a list (or tuple) but the type and length of the return value should be consistent for all replicates and at all generations.

win: Window of generations. If given, only values from generation -win to -1 will be plotted.

update: Update the figure after specified generations. For example, you can evalulate an expression and save its values at every 10 generations (parameter step=10) but only draw a figure after every 50 generations (parameter update=50.

byRep: Separate values at different replicates to different subplots.

byDim: Separate items from sequence results of expr to different subplots. If both byRep and byDim are True, the subplots will be arranged by variable and then replicates.

saveAs: Save figures in files saveAs\_gen.ext (e.g. figure\_10.eps if saveAs='figure.eps'). If ext is given, a corresponding device will be used. Otherwise, a default postscript driver will be used. Currently supported formats include .pdf, .png, .bmp, .jpg, and .tif. The default filename could be overridden by derived argument dev\_print\_file.

*leaveOpen:* Whether or not leave the plot open when plotting is done. Default to False functions. If this option is set to True, you will have to close the graphic device explicitly using function r.dev\_off(). Note that leaving the device open allows further manipuation of the figures outside of this operator.

*legend:* labels of the lines. This operator will look for keyword parameters such as col, lty, lwd, and pch and call the legend function to draw a legend. If figure has multiple lines for both replicates and dimensions, legends should be given to each dimension, and then each replicate.

*preHook:* A function that, if given, will be called before the figure is draw. The r object from the plotter module will be passed to this function.

*postHook:* A function that, if given, will be called after the figure is drawn. The r object from the plotter module will be passed to this function.

plotHook: A function that, if given, will be called after each plot function. The r object from the plotter module, generation list, data being plotted, replicate number (if applicable) and dimension index (if applicable) will be passed as keyword arguments r, gen, data, rep (optional) and dim (optional).

kwargs: Additional keyword arguments that will be interpreted and sent to underlying R functions. These arguments could have prefixes (destination function names) plot\_, lines\_, par\_, legend\_ and dev\_print\_, and suffixes (list parameters) \_rep, \_dim, and \_repdim. Arguments without prefixes are sent to functions plot and lines. String values with a leading! will be replaced by its evaluated result against the current population.

#### 3.3.5 Class ScatterPlotter

This class defines a Python operator that uses R to plot individuals in a Population, using values at two information fields as their x- and y-axis.

Arbitrary keyword parameters could be specified and be passed to the underlying R drawing functions plot and points. These parameters could be used to specify point type (pch), color (col), title (main), limit of x and y axes (xlim and ylim) and many other options (see R manual for details). You can also pass parameters to specific R functions such as par, plot, points, legend, pdf by prefixing parameter names with a function name. For example, par\_mar=[1]\*4 will pass par=[1]\*4 to function par() which is called before a figure is drawn. (Note that the function to save a figure is dev.print so parameters such as dev\_print\_width should be used.) Further customization of your figures could be achieved by writing your own hook functions that will be called before and after a figure is drawn.

The power of this operator lies in its ability to differentiate individuals from different (virtual) subpopulations. If you specify IDs of (virtual) subpopulations (VSPs) in parameter <code>subPops</code>, only individuals from these VSPs will be displayed. Points from these subpopulations will be drawn with different shapes and colors. You can also customize these points using list parameters with suffix <code>\_sp</code>. For example, if you have defined two VSPs by sex and <code>set subPops=[(0, 0), (0, 1)], col\_sp=['blue', 'red']</code> will color male individuals with blue and female individuals with red. In addition, if the value of a parameter is a string starting with!, the evaluated result of the remaining string will be used as parameter value.

This opertor calls R functions par, plot, points, legend, and dev.print. Functions plot and points are the default destination for keyword arguments and the ones that accept list parameters to customize lines by (virtual) subpopulation.

- *subPops:* A list of subpopulations and virtual subpopulations. Only individuals from these subpopulations will be plotted. Default to subpopulation indexes.
- saveAs: Save figures in files saveAs\_gen\_rep.ext (e.g. figure\_10\_0.eps if saveAs='figure.eps'). If ext is given, a corresponding device will be used. Otherwise, a default postscript driver will be used. Currently supported formats include .pdf, .png, .bmp, .jpg, and .tif. The default filename could be overriden by derived argument dev\_print\_file.
- *leaveOpen:* Whether or not leave the plot open when plotting is done. Default to False functions. If this option is set to True, you will have to close the graphic device explicitly using function r.dev\_off(). Note that leaving the device open allows further manipuation of the figures outside of this operator.
- legend: labels of the points. It must match the specified subpopulations.
- *preHook:* A function that, if given, will be called before the figure is draw. The r object from the plotter module will be passed to this function.
- *postHook:* A function that, if given, will be called after the figure is drawn. The r object from the plotter module will be passed to this function.
- kwargs: Additional keyword arguments that will be interpreted and sent to underlying R functions. These arguments could have prefixes (destination function names) plot\_, points\_, par\_, legend\_ and dev\_print\_, and suffixes (list parameters) \_sp. Arguments without prefixes are sent to functions plot

and points. String values with a leading! will be replaced by its evaluated result against the current population.

#### 3.3.6 Class InfoPlotter

This operator uses a R function such as hist and qqplot to plot properties of one or more information fields of individuals in one or more (virtual) subpopulations. Separate subplots are used for different information fields and subpopulations.

This operator essentially gets values of information fields and sends them to a R function such as hist. The resulting figures could be customized by additional keyword parameters and various hook functions. For example, a qqline function could be called in a plotHook function to add a QQ line to a qqnorm plot. The plotHook can be used to draw the whole (sub)plot if no R function is specified for parameter func.

Besides regular keyword parameters, keyword parameters ending in \_sp, \_fld or \_spfld are expected to have multiple values which will be used for differnt subpopulations, information fields, and their combinations. You can also specify which function the keyword should be sent by prefixing a function name to the parameter name. For example, pch\_fld=[1, 2] will use different symbols for different information fields, and par\_mar=[1] \*4 will send parameter mar=[1] \*4 to function par. In addition, if the value of a parameter is a string starting with!, the evaluated result of the remaining string will be used as parameter value.

This opertor calls R functions par, dev.print, and a user-specified function. Additional keyword arguments without function prefix will be sent to this function.

- class InfoPlotter (func=None, infoFields=[], saveAs=", leaveOpen=False, preHook=None, postHook=None, plotHook=None, begin=0, end=-1, step=1, at=[], reps=True, subPops=[], \*\*kwargs) func: Name of the R function that will be called to draw figures from values of given information fields. No R function will be called if it is not specified. In this case, a plotHook can be used to plot passed values.
- infoFields: Information fields whose values will be sent to the specified plotting function.
- *subPops:* A list of subpopulations and virtual subpopulations. Each subpopulation will be plotted in a separate subplot.
- saveAs: Save figures in files saveAs\_gen\_rep.ext (e.g. figure\_10\_0.eps if saveAs='figure.eps'). If ext is given, a corresponding device will be used. Otherwise, a default postscript driver will be used. Currently supported formats include .pdf, .png, .bmp, .jpg, and .tif. The default filename could be overriden by derived argument dev print file.
- *leaveOpen:* Whether or not leave the plot open when plotting is done. Default to False functions. If this option is set to True, you will have to close the graphic device explicitly using function r.dev\_off(). Note that leaving the device open allows further manipuation of the figures outside of this operator.
- *preHook:* A function that, if given, will be called before the figure is draw. The r object from the plotter module will be passed to this function.
- *postHook:* A function that, if given, will be called after the figure is drawn. The r object from the plotter module will be passed to this function.
- plotHook: A function that, if given, will be called after each specified plot function. The r object from the plotter module, data being plotted, name of the information field and index of subpopulation (in parameter subPops, if applicable) will be passed with keywords r, data, field and subPop (optional) respectively.
- kwargs: Additional keyword arguments that will be interpreted and sent to underlying R functions. These arguments could have prefixes (destination function names) par\_, dev\_print\_ and the function you specify (parameter func), and suffixes (list parameters) \_sp, \_fld, and \_spfld. Arguments without prefixes are sent to the user specified function. String values with a leading! will be replaced by its evaluated result against the current population.

### 3.3.7 Class HistPlotter

A InfoPlotter that uses R function hist to draw histogram of individual information fields of specified (virtual) subpopulations. Please see InfoPlotter for details.

class HistPlotter (\*args, \*\*kwargs)

### 3.3.8 Class OOPlotter

A InfoPlotter that uses R function qqnorm to draw qq plot of individual information fields of specified (virtual) subpopulations. Please see InfoPlotter for details.

class QQPlotter (\*args, \*\*kwargs)

### 3.3.9 Class BoxPlotter

This operator draws boxplots of one or more information fields of individuals in one or more (virtual) subpopulations of a population. Although a InfoPlotter with func=boxplot could be used to plot boxplots for each information field and/or subpopulation, this class allows multiple whiskers to share one plot. How the whiskers are oraganized is controlled by parameters byField and bySubPop.

This operator essentially gets values of information fields and sends them to boxplots. Individual ownerships (subpopulation or field) are also passed so that multiple whiskers could be drawn in the same plot. The resulting figures could be customized by additional keyword parameters and various hook functions.

Besides regular keyword parameters, keyword parameters ending in \_sp, \_fld or \_spfld are expected to have multiple values which will be used for differnt subpopulations, information fields, and their combinations. You can also specify which function the keyword should be sent by prefixing a function name to the parameter name. For example, pch\_fld=[1, 2] will use different symbols for different information fields, and par\_mar=[1] \*4 will send parameter mar=[1] \*4 to function par. In addition, if the value of a parameter is a string starting with!, the evaluated result of the remaining string will be used as parameter value.

This opertor calls R functions par, boxplot and dev.print. Keyword parameters without function prefix will be passed to boxplot.

- - *infoFields*: Information fields whose values will be sent to R function boxplot.
- *subPops:* A list of subpopulations and virtual subpopulations. Separate whiskers will be drawn for individuals in these subpopulations.
- *byField:* If multiple information fields are specified, separate the whiskers different subplots if this parameter is True.
- *bySubPop:* If multiple (virtual) subpopulations are specified, separate the whiskers to different subplots if this parameter is True.
- saveAs: Save figures in files saveAs\_gen\_rep.ext (e.g. figure\_10\_0.eps if saveAs=' figure.eps').
  If ext is given, a corresponding device will be used. Otherwise, a default postscript driver will be used.
  Currently supported formats include .pdf, .png, .bmp, .jpg, and .tif. The default filename could be overriden by derived argument dev\_print\_file.
- *leaveOpen:* Whether or not leave the plot open when plotting is done. Default to False functions. If this option is set to True, you will have to close the graphic device explicitly using function r.dev\_off(). Note that leaving the device open allows further manipuation of the figures outside of this operator.
- *preHook:* A function that, if given, will be called before the figure is draw. The r object from the plotter module will be passed to this function.

postHook: A function that, if given, will be called after the figure is drawn. The r object from the plotter module will be passed to this function.

plotHook: A function that, if given, will be called after each specified plot function. The r object from the plotter module, current field and subpopulation will be passed with keywords r, field and subPop if applicable.

kwargs: Additional keyword arguments that will be interpreted and sent to underlying R functions. These arguments could have prefixes (destination function names) plot\_, boxplot\_, par\_, and dev\_print\_, and suffixes (list parameters) \_sp, \_fld and \_spfld. Arguments without prefixes are sent to function boxplot. String values with a leading! will be replaced by its evaluated result against the current population.

## 3.4 Module simuPOP.sampling

This module provides classes and functions that could be used to draw samples from a simuPOP population. These functions accept a list of parameters such as "subPops" ((virtual) subpopulations from which samples will be drawn) and "numOfSamples" (number of samples to draw) and return a list of populations. Both independent individuals and dependent individuals (Pedigrees) are supported.

Independent individuals could be drawn from any Population. pedigree information is not necessary and is usually ignored. Unique IDs are not needed either although such IDs could help you identify samples in the parent Population.

Pedigrees could be drawn from multi-generational populations or age-structured populations. All individuals are required to have a unique ID (usually tracked by operator "IdTagger" and are stored in information field "ind\_id"). Parents of individuals are usually tracked by operator "PedigreeTagger" and are stored in information fields "father\_id" and "mother\_id". If parental information is tracked using operator "ParentsTagger" and information fields "father\_idx" and "mother\_idx", a function "sampling.indexToID" can be used to convert index based pedigree to ID based Pedigree. Note that "ParentsTagger" can not be used to track Pedigrees in age-structured populations because they require parents of each individual resides in a parental generation.

All sampling functions support virtual subpopulations through parameter "subPops", although sample size specification might vary. This feature allows you to draw samples with specified properties. For example, you could select only female individuals for cases of a female-only disease, or select individuals within certain age-range. If you specify a list of (virtual) subpopulations, you are usually allowed to draw certain number of individuals from each subpopulation.

### 3.4.1 Class BaseSampler

A sampler extracts individuals from a simuPOP population and return them as separate populations. This base class defines the common interface of all sampling classes, including how samples prepared and returned.

#### class BaseSampler (subPops=ALL AVAIL)

Create a sampler with parameter subPops, which will be used to prepare population for sampling. subPops should be a list of (virtual) subpopulations from which samples are drawn. The default value is ALL\_AVAIL, which means all available subpopulations of a Population.

#### drawSample (pop)

Draw and return a sample.

### drawSamples (pop, numOfSamples)

Draw multiple samples and return a list of populations.

#### prepareSample (pop, rearrange)

Prepare passed population object for sampling according to parameter subPops. If samples are drawn from the whole population, a Population will be trimmed if only selected (virtual) subpopulations are

used. If samples are drawn separately from specified subpopulations, Population pop will be rearranged (if rearrange==True) so that each subpoulation corresponds to one element in parameter subPops.

### 3.4.2 Class RandomSampler

A sampler that draws individuals randomly.

#### class RandomSampler (sizes, subPops=ALL\_AVAIL)

Creates a random sampler with specified number of individuals.

```
drawSample (input_pop)
```

Draw a random sample from passed population.

```
drawSamples (pop, numOfSamples)
```

Draw multiple samples and return a list of populations.

```
prepareSample (pop, rearrange)
```

Prepare passed population object for sampling according to parameter subPops. If samples are drawn from the whole population, a Population will be trimmed if only selected (virtual) subpopulations are used. If samples are drawn separately from specified subpopulations, Population pop will be rearranged (if rearrange==True) so that each subpoulation corresponds to one element in parameter subPops.

### 3.4.3 Function drawRandomSample

### drawRandomSample (pop, sizes, subPops=ALL\_AVAIL)

Draw sizes random individuals from a population. If a single sizes is given, individuals are drawn randomly from the whole population or from specified (virtual) subpopulations (parameter subPops). Otherwise, a list of numbers should be used to specify number of samples from each subpopulation, which can be all subpopulations if subPops=ALL\_AVAIL (default), or from each of the specified (virtual) subpopulations. This function returns a population with all extracted individuals.

### 3.4.4 Function drawRandomSamples

```
drawRandomSamples (pop, sizes, numOfSamples=1, subPops=ALL_AVAIL)
```

Draw numOfSamples random samples from a population and return a list of populations. Please refer to function drawRandomSample for more details about parameters sizes and subPops.

### 3.4.5 Class CaseControlSampler

A sampler that draws affected and unaffected individuals randomly.

```
class CaseControlSampler (cases, controls, subPops=ALL AVAIL)
```

Ceates a case-control sampler with specified number of cases and controls.

```
drawSample (input_pop)
```

Draw a case control sample

```
drawSamples (pop, numOfSamples)
```

Draw multiple samples and return a list of populations.

#### prepareSample (input\_pop)

Find out indexes all affected and unaffected individuales.

### 3.4.6 Function drawCaseControlSample

#### drawCaseControlSample (pop, cases, controls, subPops=ALL\_AVAIL)

Draw a case-control samples from a population with cases affected and controls unaffected individuals. If single cases and controls are given, individuals are drawn randomly from the whole Population or from specified (virtual) subpopulations (parameter subPops). Otherwise, a list of numbers should be used to specify number of cases and controls from each subpopulation, which can be all subpopulations if subPops=ALL\_AVAIL (default), or from each of the specified (virtual) subpopulations. This function returns a population with all extracted individuals.

### 3.4.7 Function drawCaseControlSamples

drawCaseControlSamples (pop, cases, controls, numOfSamples=1, subPops=ALL AVAIL)

Draw numOfSamples case-control samples from a population with cases affected and controls unaffected individuals and return a list of populations. Please refer to function drawCaseControlSample for a detailed descriptions of parameters.

### 3.4.8 Class PedigreeSampler

The base class of all pedigree based sampler.

class PedigreeSampler (families, subPops=ALL\_AVAIL, idField='ind\_id', fatherField='father\_id', mother-Field='mother id')

Creates a pedigree sampler with parameters

families: number of families. This can be a number or a list of numbers. In the latter case, specified families are drawn from each subpopulation.

*subPops:* A list of (virtual) subpopulations from which samples are drawn. The default value is ALL\_AVAIL, which means all available subpopulations of a population.

drawSample (input\_pop)

Randomly select Pedigrees

drawSamples (pop, numOfSamples)

Draw multiple samples and return a list of populations.

family (id)

Get the family of individual with id.

prepareSample (pop, loci=[], infoFields=[], ancGen=-1)

Prepare self.pedigree, some pedigree sampler might need additional loci and information fields for this sampler.

### 3.4.9 Class AffectedSibpairSampler

A sampler that draws a nuclear family with two affected offspring.

Initialize an affected sibpair sampler.

drawSample (input\_pop)

Randomly select Pedigrees

drawSamples (pop, numOfSamples)

Draw multiple samples and return a list of populations.

```
family (id)
```

Return id, its spouse and their children

```
prepareSample (input_pop)
```

Find the father or all affected sibpair families

### 3.4.10 Function drawAffectedSibpairSample

```
drawAffectedSibpairSample (pop, families, subPops=ALL_AVAIL, idField='ind_id', father-
Field='father id', motherField='mother id')
```

Draw affected sibpair samples from a population. If a single families is given, affected sibpairs and their parents are drawn randomly from the whole population or from specified (virtual) subpopulations (parameter subPops). Otherwise, a list of numbers should be used to specify number of families from each subpopulation, which can be all subpopulations if subPops=ALL\_AVAIL (default), or from each of the specified (virtual) subpopulations. This function returns a population that contains extracted individuals.

### 3.4.11 Function drawAffectedSibpairSamples

drawAffectedSibpairSamples (pop, families, numOfSamples=1, subPops=ALL\_AVAIL, idField='ind\_id', fatherField='father id', motherField='mother id')

Draw numOfSamples affected sibpair samples from population pop and return a list of populations. Please refer to function drawAffectedSibpairSample for a description of other parameters.

### 3.4.12 Class NuclearFamilySampler

A sampler that draws nuclear families with specified number of affected parents and offspring.

```
class NuclearFamilySampler (families, numOffspring, affectedParents=0, affectedOffspring=0, sub-
Pops=ALL_AVAIL, idField='ind_id', fatherField='father_id', mother-
Field='mother id')
```

Creates a nuclear family sampler with parameters

*families:* number of families. This can be a number or a list of numbers. In the latter case, specified families are drawn from each subpopulation.

numOffspring: number of offspring. This can be a fixed number or a range [min, max].

affected Parents: number of affected parents. This can be a fixed number or a range [min, max].

affectedOffspring: number of affected offspring. This can be a fixed number of a range [min, max].

*subPops:* A list of (virtual) subpopulations from which samples are drawn. The default value is ALL\_AVAIL, which means all available subpopulations of a population.

```
drawSample (input_pop)
```

Randomly select Pedigrees

#### drawSamples (pop, numOfSamples)

Draw multiple samples and return a list of populations.

#### family (id)

Return id, its spouse and their children

### 3.4.13 Function drawNuclearFamilySample

Draw nuclear families from a population. Number of offspring, number of affected parents and number of affected offspring should be specified using parameters numOffspring, affectedParents and affectedOffspring, which can all be a single number, or a range [a, b] (b is incldued). If a single families is given, Pedigrees are drawn randomly from the whole population or from specified (virtual) subpopulations (parameter subPops). Otherwise, a list of numbers should be used to specify numbers of families from each subpopulation, which can be all subpopulations if subPops=ALL\_AVAIL (default), or from each of the specified (virtual) subpopulations. This function returns a population that contains extracted individuals.

### 3.4.14 Function drawNuclearFamilySamples

drawNuclearFamilySamples (pop, families, numOffspring, affectedParents=0, affectedOffspring=0, numOf-Samples=1, subPops=ALL\_AVAIL, idField='ind\_id', fatherField='father\_id', motherField='mother\_id')

Draw numOfSamples affected sibpair samplesa from population pop and return a list of populations. Please refer to function drawNuclearFamilySample for a description of other parameters.

### 3.4.15 Class ThreeGenFamilySampler

A sampler that draws three-generation families with specified pedigree size and number of affected individuals.

families: number of families. This can be a number or a list of numbers. In the latter case, specified families are drawn from each subpopulation.

numOffspring: number of offspring. This can be a fixed number or a range [min, max].

pedSize: number of individuals in the Pedigree. This can be a fixed number or a range [min, max].

numAfffected: number of affected individuals in the Pedigree. This can be a fixed number or a range [min, max]

*subPops:* A list of (virtual) subpopulations from which samples are drawn. The default value is ALL\_AVAIL, which means all available subpopulations of a population.

drawSample (input\_pop)

Randomly select Pedigrees

drawSamples (pop, numOfSamples)

Draw multiple samples and return a list of populations.

family(id)

Return id, its spouse, their children, children's spouse and grandchildren

### 3.4.16 Function drawThreeGenFamilySample

Draw three-generation families from a population. Such families consist of grant parents, their children, spouse of these children, and grand children. Number of offspring, total number of individuals, and total number of affected individuals in a pedigree should be specified using parameters numOffspring, pedSize and numOfAffected, which can all be a single number, or a range [a, b] (b is incldued). If a single

families is given, Pedigrees are drawn randomly from the whole Population or from specified (virtual) subpopulations (parameter subPops). Otherwise, a list of numbers should be used to specify numbers of families from each subpopulation, which can be all subpopulations if subPops=ALL\_AVAIL (default), or from each of the specified (virtual) subpopulations. This function returns a population that contains extracted individuals.

### 3.4.17 Function drawThreeGenFamilySamples

drawThreeGenFamilySamples (pop, families, numOffspring, pedSize, numOfAffected=0, numOfSamples=1, subPops=ALL\_AVAIL, idField='ind\_id', fatherField='father\_id', mother-Field='mother id')

Draw numOfSamples three-generation pedigree samples from population pop and return a list of populations. Please refer to function drawThreeGenFamilySample for a description of other parameters.

### 3.4.18 Class CombinedSampler

A combined sampler accepts a list of sampler objects, draw samples and combine the returned sample into a single population. An id field is required to use this sampler, which will be used to remove extra copies of individuals who have been drawn by different samplers.

```
class CombinedSampler (samplers=[], idField='ind_id')
samplers: A list of samplers
```

drawSamples (pop, numOfSamples)

Draw multiple samples and return a list of populations.

```
prepareSample (pop, rearrange)
```

Prepare passed population object for sampling according to parameter subPops. If samples are drawn from the whole population, a Population will be trimmed if only selected (virtual) subpopulations are used. If samples are drawn separately from specified subpopulations, Population pop will be rearranged (if rearrange==True) so that each subpoulation corresponds to one element in parameter subPops.

### 3.4.19 Function drawCombinedSample

```
drawCombinedSample (pop, samplers, idField='ind id')
```

Draw different types of samples using a list of samplers. A Population consists of all individuals from these samples will be returned. An idField that stores an unique ID for all individuals is needed to remove duplicated individuals who are drawn multiple numOfSamples from these samplers.

### 3.4.20 Function drawCombinedSamples

```
drawCombinedSamples (pop, samplers, numOfSamples=1, idField='ind_id')
```

Draw combined samples numOfSamples numOfSamples and return a list of populations. Please refer to function drawCombinedSample for details about parameters samplers and idField.

## 3.5 Module simuPOP.gsl

This module exposes the following GSL (GUN Scientific Library) functions used by simuPOP to the user interface. Although more functions may be added from time to time, this module is not intended to become a complete wrapper for GSL. Please refer to the GSL reference manual (http://www.gnu.org/software/gsl/manual/html\_node/) for details about these functions. Note that random number generation functions are wrapped into the simuPOP.RNG class.

- gsl\_cdf\_gaussian\_P(x, sigma)
- gsl\_cdf\_gaussian\_Q(x, sigma)
- gsl\_cdf\_gaussian\_Pinv(P, sigma)
- gsl\_cdf\_gaussian\_Qinv(Q, sigma)
- gsl\_cdf\_ugaussian\_P(x)
- gsl\_cdf\_ugaussian\_Q(x)
- gsl\_cdf\_ugaussian\_Pinv(P)
- gsl\_cdf\_ugaussian\_Qinv(Q)
- gsl\_cdf\_exponential\_P(x, mu)
- gsl\_cdf\_exponential\_Q(x, mu)
- gsl\_cdf\_exponential\_Pinv(P, mu)
- gsl\_cdf\_exponential\_Qinv(Q, mu)
- gsl\_cdf\_chisq\_P(x, nu)
- gsl\_cdf\_chisq\_Q(x, nu)
- gsl\_cdf\_chisq\_Pinv(P, nu)
- gsl\_cdf\_chisq\_Qinv(Q, nu)
- gsl\_cdf\_gamma\_P(x, a, b)
- gsl\_cdf\_gamma\_Q(x, a, b)
- gsl\_cdf\_gamma\_Pinv(P, a, b)
- gsl\_cdf\_gamma\_Qinv(Q, a, b)

absIndIndex() (Population method), 5 absLocusIndex() (GenoStruTrait method), 2 acgtMutate() (in module), 61 AcgtMutator (class in), 42 add() (Simulator method), 12 addChrom() (Population method), 7 addChromFrom() (Population method), 7 addDefault() (DerivedArgs method), 74 addIndFrom() (Population method), 8 addInfoFields() (Population method), 8 addLoci() (Population method), 8 addLociFrom() (Population method), 8 addOption() (SimuParam method), 65 affected() (Individual method), 4 affectedSibpairSampler (class in), 81 AffectionSplitter (class in), 14 allele() (Individual method), 3 alleleName() (GenoStruTrait method), 3 alleleNames() (GenoStruTrait method), 3 AlphaParentsChooser (class in), 19 ancestor() (Population method), 7 ancestralGens() (Population method), 7 apply() (BaseOperator method), 28–35, 39, 42, 43, 45, 47, 53, 54, 56–59	chromByName () (GenoStruTrait method), 2 chromEnd () (GenoStruTrait method), 2 chromLocusPair () (GenoStruTrait method), 2 chromName () (GenoStruTrait method), 2 chromNames () (GenoStruTrait method), 2 chromType () (GenoStruTrait method), 2 chromTypes () (GenoStruTrait method), 2 class  AffectionSplitter, 13 AlphaParentsChooser, 19 BaseMutator, 39 BaseOperator, 27 BasePenetrance, 43 BaseQuanTrait, 45 BaseSelector, 46 BaseVspSplitter, 13 CloneGenoTransmitter, 35 CombinedSplitter, 15 ContextMutator, 41 ControlledOffspringGenerator, 20 Dumper, 57 GenoStruTrait, 1 GenoTransmitter, 35 GenotypeSplitter, 15 HaplodiploidGenoTransmitter, 36 HeteroMating, 17 HomoMating, 16
applyToIndividual() (BasePenetrance method),	IdTagger, 53
43 asDict() (SimuParam method), 65	IfElse, 58 Individual, 3
asList() (SimuParam method), 65	InfoEval, 31
, (,,	InfoExec, 31
В	InfoSplitter, 14
BaseMutator (class in ), 39	InheritTagger, 54
BaseOperator (class in ), 27	InitByFreq, 29
BasePenetrance (class in ), 43	InitByValue, 29
BaseQuanTrait (class in ), 45	InitInfo, 29
BaseSampler(class in), 79	InitSex, 28
BaseSelector (class in ), 47	KAlleleMutator, 40
BaseVspSplitter (class in ), 13	MaPenetrance, 44
BoxPlotter (class in ), 78	MapPenetrance, 43
	MapSelector, 47
C	MaSelector, 47
CaseControlSampler (class in ), 80	MatrixMutator, 39
chromBegin() (GenoStruTrait method), 2	MendelianGenoTransmitter, 36

MergeSubPops, 34 Migrator, 32 MitochondrialGenoTransmitter, 37 MixedMutator, 41 MlPenetrance, 44 MlSelector, 48	ContextMutator (class in ), 41 ControlledOffspringGenerator (class in ), 21 ControlledRandomMating (class in ), 23 copyChromosome() (GenoTransmitter method), 35 copyChromosomes() (GenoTransmitter method), 35
NoneOp, 57	D
OffspringGenerator, 20	DerivedArgs (class in ), 74
ParentsTagger, 55	describe() (HomoMating method), 17–21, 24
Pause, 58	done () (SimuProgress method), 72
Pedigree, 10	drawAffectedSibpairSample() (in module), 82
Pedigree Tagger, 55	<pre>drawAffectedSibpairSamples() (in module )</pre>
PointMutator, 42	82
PolyParentsChooser, 19	drawCaseControlSample() (in module), 81
Population, 4	drawCaseControlSamples() (in module), 81
ProductSplitter, 16	drawCombinedSample() (in module), 84
ProportionSplitter, 14	drawCombinedSamples() (in module), 84
PyEval, 30	drawNuclearFamilySample() (in module), 83
PyExec, 31	<pre>drawNuclearFamilySamples() (in module), 83</pre>
PyMutator, 41	drawRandomSample() (in module), 80
PyOperator, 57	drawRandomSamples() (in module), 80
PyOutput, 30	drawSample() (BaseSampler method), 79-83
PyParentsChooser, 19	drawSamples() (BaseSampler method), 79-84
PyPenetrance, 44	drawThreeGenFamilySample() (in module),83
PyQuanTrait, 45	drawThreeGenFamilySamples() (in module), 84
PySelector, 48	dump () (in module), 59
PyTagger, 56	Dumper (class in ), 57
RandomParentChooser, 18	
RandomParentsChooser, 18	E
RangeSplitter, 14	evaluate () (PyEval method), 30
Recombinator, 37	evolve() (Simulator method), 12
ResizeSubPops, 34	extract() (Simulator method), 12
RNG, 23	extractIndividuals()(Population method), 8
SavePopulation, 58	extractSubPops() (Population method), 8
SelfingGenoTransmitter, 36	F
SequentialParentChooser, 17	family() (PedigreeSampler method), 81–83
SequentialParentsChooser, 18	freq() (Trajectory method), 69
SexSplitter, 13	func () (Trajectory method), 69
Simulator, 11	rune () (Trajectory method), 0)
SplitSubPops, 33	G
Stat, 48	GenoStruTrait (class in ), 1
StepwiseMutator, 40	GenoTransmitter (class in ), 35
SummaryTagger, 55	genotype() (Individual method), 3, 7
TerminateIf, 56	GenotypeSplitter (class in ), 15
TicToc, 59	getArgs() (DerivedArgs method), 74
clearChromosome() (GenoTransmitter method), 35	getLegendArgs() (DerivedArgs method), 74
clone () (Population method), 9, 10, 12, 13, 17–21, 28–	getParam() (SimuParam method), 65
48, 53–56, 58	getRNG() (in module), 25
CloneGenoTransmitter (class in), 35	guiGetParam()(SimuParam method),66
CloneMating (class in), 21	
closeOutput() (in module), 24	H
CombinedSampler (class in), 84	HaplodiploidGenoTransmitter (class in), 36
CombinedSplitter (class in ), 15 contextMutate() (in module), 61	HaplodiploidMating (class in ), 22 HeteroMating (class in ), 17

HistPlotter (class in ), 78	maPenetrance() (in module), 62
HomoMating (class in ), 16	MapPenetrance (class in ), 43
	mapPenetrance() (in module), 62
I	MapSelector (class in ), 47
IdTagger (class in ), 54	MaSelector (class in ), 47
IfElse (class in ), 58	mating scheme, 16
ind() (Population method), 6	matrixMutate() (in module), 61
indByID () (Population method), 6, 10	MatrixMutator (class in ), 39
indInfo() (Population method), 9	MendelianGenoTransmitter (class in), 36
Individual (class in), 1, 3	MergeSubPops (class in), 34
individuals () (Population method), 7	mergeSubPops () (Population method), 8, 60
<pre>individualsWithRelatives()</pre> (Pedigree	migrate() (in module), 60
method), 10	Migrator (class in), 32, 33
info() (Individual method), 4	migrHierarchicalIslandRates() (in module)
InfoEval (class in), 31	71
infoEval() (in module), 60	migrIslandRates() (in module),71
InfoExec (class in), 32	migrSteppingStoneRates() (in module), 72
infoExec() (in module), 60	MitochondrialGenoTransmitter (class in), 37
infoField() (GenoStruTrait method), 3	mixedMutate() (in module), 61
infoFields() (GenoStruTrait method), 3	MixedMutator (class in), 41
infoldx() (GenoStruTrait method), 3	MlPenetrance (class in), 44
InfoPlotter (class in ), 77	mlPenetrance() (in module), 62
InfoSplitter (class in), 14	
InheritTagger (class in), 54	MlSelector (class in ), 48
InitByFreq (class in ), 29	module
initByFreq() (in module), 59	AcgtMutator, 42
InitByValue (class in ), 29	AffectedSibpairSampler, 81
initByValue() (in module), 60	AlphaMating, 22
initialize() (GenoTransmitter method), 35, 36, 38	BaseSampler, 79
initialize () (Genormal smitter inethod), 33, 36, 36 initialize If Needed () (Base Operator method),	BoxPlotter, 78
· · · · · · · · · · · · · · · · · · ·	CaseControlSampler, 80
28	CloneMating, 21
initializer, 28	CombinedSampler, 84
InitInfo (class in), 29	ControlledRandomMating, 23
initInfo() (in module), 59	DerivedArgs, 74
InitSex (class in), 28	HaplodiploidMating, 22
initSex() (in module), 59	HistPlotter, 78
K	InfoPlotter, 77
kAlleleMutate() (in module), 61	MonogamousMating, 22
KAlleleMutator (class in ), 40	NuclearFamilySampler, 82
RAITETEMULATOR (Class III), 40	PedigreeSampler, 81
L	PolygamousMating, 22
loadConfig() (SimuParam method), 66	QQPlotter, 78
loadPopulation() (in module), 24	RandomMating, 21
locateRelatives() (Pedigree method), 11	RandomSampler, 80
lociByNames() (GenoStruTrait method), 2	RandomSelection, 21
lociDist () (GenoStruTrait method), 2	ScatterPlotter, 76
lociNames() (GenoStruTrait method), 2	SelfMating, 23
lociPos() (GenoStruTrait method), 2	SimuParam, 64
locusByName () (GenoStruTrait method), 2	SimuProgress, 72
	SNPMutator, 42
locusName () (GenoStruTrait method), 2	ThreeGenFamilySampler, 83
locusPos() (GenoStruTrait method), 2	Trajectory, 68
M	TrajectorySimulator, 69
MaPenetrance (class in ), 44	VarPlotter, 74
riar directarioe (ciaso in ), TT	

WithArgs, 23	PyPenetrance (class in ), 45
moduleInfo() (in module), 24	pyPenetrance() (in module), 62
MonogamousMating (class in ), 22	PyQuanTrait (class in ), 45
Mutation, 38	<pre>pyQuanTrait() (in module), 62</pre>
mutators () (Trajectory method), 69	PySelector (class in ), 48
N	PyTagger (class in ), 56
name () (BaseVspSplitter method), 13-16, 24	Q
newDevice() (in module), 73	QQPlotter (class in ), 78
NoneOp (class in ), 57	quantitative trait, 45
NuclearFamilySampler (class in), 82	
numChrom() (GenoStruTrait method), 2	R
numLoci() (GenoStruTrait method), 2	randBinomial() (RNG method), 24
numParents() (Pedigree method), 10	randChisq() (RNG method), 24
numRep() (Simulator method), 12	randExponential() (RNG method), 24
numSubPop() (Population method), 5	randGamma() (RNG method), 24
numVirtualSubPop() (Population method), 6, 13-	randGeometric() (RNG method), 24
16	randInt() (RNG method), 24
	randMultinomial() (RNG method), 24
0	randNormal() (RNG method), 24
OffspringGenerator (class in ), 20	RandomMating (class in ), 22
n.	RandomParentChooser (class in ), 18
P	RandomParentsChooser (class in ), 18
param() (in module), 66	RandomSampler (class in ), 80
ParentsTagger (class in), 55	RandomSelection (class in ), 21
Pause (class in), 59	randPoisson() (RNG method), 24
Pedigree (class in), 1, 10	randUniform() (RNG method), 24
PedigreeSampler (class in ), 81	RangeSplitter (class in ), 15
PedigreeTagger (class in ), 55	rate() (Migrator method), 33
penetrance, 42	recodeAlleles() (Population method), 8
ploidy() (GenoStruTrait method), 1	Recombinator (class in ), 37
ploidyName () (GenoStruTrait method), 1	removeIndividuals()(Population method), 8
plot () (Trajectory method), 69	removeInfoFields() (Population method), 9
pointMutate() (in module), 62	removeLoci() (Population method), 9
PointMutator (class in), 42	removeSubPops() (Population method), 9
PolygamousMating (class in ), 22 PolyParentsChooser (class in ), 19	reset () (IdTagger method), 54
pop() (Simulator method), 12	resize() (Population method), 9
popSize() (Population method), 6	ResizeSubPops (class in), 34
Population (class in ), 1, 5	resizeSubPops() (in module), 60
populations () (Simulator method), 13	RNG (class in ), 23
prepareSample () (BaseSampler method), 79–82, 84	S
processArgs() (SimuParam method), 66	save() (Population method), 10
ProductSplitter (class in ), 16	saveConfig() (SimuParam method), 66
ProportionSplitter (class in), 14	saveCSV() (in module), 73
push () (Population method), 7	saveFigure() (in module), 73
PyEval (class in ), 30	SavePopulation (class in), 58
pyEval() (in module), 60	ScatterPlotter (class in ), 76
PyExec (class in ), 31	seed() (RNG method), 24
pyExec() (in module), 60	selection, 46
pyMutate() (in module), 61	SelfingGenoTransmitter (class in), 36
PyMutator (class in), 41	SelfMating (class in ), 23
PyOperator (class in ), 57	SequentialParentChooser (class in ), 17
PyOutput (class in), 30	SequentialParentsChooser (class in), 17
PyParentsChooser (class in ), 19	setAffected() (Individual method), 4
<u> </u>	** \

setAllele() (Individual method), 3	mapPenetrance, 62
setAncestralDepth() (Population method), 7	matrixMutate, 61
setGenotype() (Individual method), 4, 7	mergeSubPops, 60
setIndInfo() (Population method), 9	migrate, 60
setInfo() (Individual method), 4	mixedMutate, 61
setInfoFields() (Population method), 9	mlPenetrance, 62
setOptions() (in module), 63	pointMutate, 61
setRNG() (RNG method), 23, 25	pyEval, 60
setSeed() (RNG method), 24	pyExec, 60
setSex() (Individual method), 4	pyMutate, 61
setSubPopByIndInfo() (Population method), 9	pyPenetrance, 62
setSubPopName() (Population method), 6	pyQuanTrait, 62
setVirtualSplitter() (Population method), 6	resizeSubPops, 60
sex () (Individual method), 4	snpMutate, 61
sexChar() (Individual method), 4	splitSubPops, 60
SexSplitter (class in ), 13	stat, 62
simuBackward() (TrajectorySimulator method), 70	stat, 02 stepwqiseMutate, 61
· · · · · · · · · · · · · · · · · · ·	* *
simuForward() (TrajectorySimulator method), 70	tagID, 62
<pre>simulateBackwardTrajectory() (in module ),</pre>	simuPOP.plotter, 73
71	newDevice, 73
simulateForwardTrajectory() (in module),71	saveFigure, 73
Simulator (class in), 1, 12	simuPOP.sampling, 79
simuOpt, 63	drawAffectedSibpairSample, 82
param, 66	drawAffectedSibpairSamples, 82
setOptions, 63	drawCaseControlSample, 80
valueAnd, 67	drawCaseControlSamples, 81
valueBetween, 67	drawCombinedSample, 84
valueEqual, 68	drawCombinedSamples, 84
valueGE, 67	drawNuclearFamilySample, 82
valueGT, 67	drawNuclearFamilySamples, 83
valueIsList, 68	drawRandomSample, 80
valueIsNum, 68	drawRandomSamples, 80
valueLE, 67	drawThreeGenFamilySample, 83
valueLT, 67	drawThreeGenFamilySamples, 84
valueNot, 66	simuPOP.utils, 68
valueNotEqual, 68	migrHierarchicalIslandRates, 71
valueOneOf, 67	migrIslandRates, 71
valueOr, 67	migrSteppingStoneRates, 71
valueTrueFalse, 67	saveCSV, 73
valueValidDir, 68	simulateBackwardTrajectory, 71
valueValidFile, 68	simulateForwardTrajectory, 71
SimuParam (class in ), 65	viewVars, 72
simuPOP	SimuProgress (class in ), 72
acgtMutate, 61	snpMutate() (in module), 61
contextMutate, 61	SNPMutator (class in ), 42
dump, 59	splitSubPop() (Population method), 9
infoEval, 60	SplitSubPops (class in), 33
infoExec, 60	splitSubPops() (in module), 61
initByFreq, 59	Stat (class in), 49
initByValue, 59	stat () (in module ), 62
initInfo, 59	StepwiseMutator (class in ), 40
initSex, 59	stepwqiseMutate() (in module), 61
kAlleleMutate, 61	subPopBegin() (Population method), 6
maPenetrance, 62	subPopByName () (Population method), 6
mai chettanee, 02	subtoppy name () (ropulation method), 0

```
subPopEnd() (Population method), 6
subPopIndPair() (Population method), 6
subPopName () (Population method), 6
subPopNames() (Population method), 6
subPopSize() (Population method), 6
subPopSizes () (Population method), 6
SummaryTagger (class in), 55
tagID() (in module), 62
termGetParam() (SimuParam method), 66
TerminateIf (class in), 56
ThreeGenFamilySampler (class in), 83
TicToc (class in), 59
totNumLoci() (GenoStruTrait method), 3
traceRelatives() (Pedigree method), 11
Trajectory (class in), 69
TrajectorySimulator (class in), 70
transmitGenotype() (MendelianGenoTransmitter
        method), 36, 38
turnOffDebug() (in module), 25
turnOnDebug() (in module), 25
U
update() (SimuProgress method), 72
updateInfoFieldsFrom() (Population method), 9
usage () (SimuParam method), 66
useAncestralGen() (Population method), 7
\mathbf{V}
valueAnd() (in module), 67
valueBetween () (in module), 67
valueEqual() (in module), 68
valueGE() (in module), 67
valueGT() (in module), 67
valueIsList() (in module), 68
valueIsNum() (in module), 68
valueLE() (in module), 68
valueLT() (in module), 67
valueNot() (in module), 67
valueNotEqual() (in module), 68
valueOneOf() (in module), 67
valueOr() (in module), 67
valueTrueFalse() (in module), 67
valueValidDir() (in module), 68
valueValidFile() (in module), 68
VarPlotter (class in), 75
vars () (Population method), 10, 13
viewVars() (in module), 72
WithArgs (class in), 23
```