

In-depth
course

Bo Peng,
Ph.D.

Loading
simuPOP

Population

Individual

Operator

Mating
scheme

Simulator

Forward-time simulations using simuPOP, an in-depth course

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simuPOP workshop

School of Public Health, Department of Biostatistics
University of Alabama Birmingham

outline

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simuPOP provides six types of modules

① Possible allele states:

short $0 \sim 2^8 - 1$

long $0 \sim 2^{16} - 1$

binary 0 and 1

② Debug information and runtime validation

standard with debug information and runtime
validation

optimized without debug information and runtime
validation

Note: A Message Passing Interface (parallel) version of
simuPOP is under development.

Loading appropriate module

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1 Use `simuOpt.setOptions`

```
>>> from simuOpt import setOptions
>>> setOptions(alleleType='long', optimized=False, quiet=False)
>>> from simuPOP import *
simuPOP : Copyright (c) 2004-2006 Bo Peng
Developmental Version (Jun 12 2007) for Python 2.3.4
[GCC 3.4.6 20060404 (Red Hat 3.4.6-8)]
Random Number Generator is set to mt19937 with random seed 0x3c5edc074c65ce00
This is the standard long allele version with 65536 maximum allelic states.
For more information, please visit http://simupop.sourceforge.net,
or email simupop-list@lists.sourceforge.net (subscription required).
>>>
```

2 Set environment variables (system dependent)

- `SIMUALLELETYPE` = short/long/binary
- `SIMUOPTIMIZED` for optimized version

3 Command line argument of scripts using the `simuOpt` module (`--optimized`)

Standard modules

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Perform strict runtime check. Produce proper debug information if anything goes wrong.

```
>>> pop = population(10, loci=[2])
>>> pop.locusPos(10)
Traceback (most recent call last):
  File "course.py", line 1, in ?
    #!/usr/bin/env python
IndexError: src/genoStru.h:428 absolute locus index (10) out of range of 0 - 1
>>> pop.individual(20).setAllele(1, 0)
Traceback (most recent call last):
  File "course.py", line 1, in ?
    #!/usr/bin/env python
IndexError: src/population.h:452 individual index (20) is out of range of 0 ~ 9
>>>
```

Optimized modules

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No runtime check. Improper usages may crash simuPOP.

```
% setenv SIMUOPTIMIZED
% python
Python 2.3.4 (#1, Jan 9 2007, 16:40:09)
[GCC 3.4.6 20060404 (Red Hat 3.4.6-3)] on linux2
Type "help", "copyright", "credits" or "license" for more information.
>>> from simuPOP import *
simuPOP : Copyright (c) 2004-2006 Bo Peng
Developmental Version (May 21 2007) for Python 2.3.4
[GCC 3.4.6 20060404 (Red Hat 3.4.6-3)]
Random Number Generator is set to mt19937 with random seed 0x2f04b9dc5ca0fc00
This is the optimied short allele version with 256 maximum allelic states.
For more information, please visit http://simupop.sourceforge.net,
or email simupop-list@lists.sourceforge.net (subscription required).
>>> pop = population(10, loci=[2])
>>> pop.locusPos(10)
1.2731974748756028e-313
>>> pop.individual(20).setAllele(1, 0)
Segmentation fault
```

Random Number Generator

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simuPOP uses RNG from the GNU Scientific Library

```
>>> rng().name()
'mt19937'
>>> rng().seed()
4350156213991099904
>>> r = ListAllRNG()
>>> print r[:5]
('gfsr4', 'mt19937', 'mt19937_1999', 'mt19937_1998', 'r250')
>>> SetRNG('taus2', 1234)
>>> rng().name()
'taus2'
>>> rng().seed()
1234
>>> rng().randUniform01()
0.82989443955011666
>>>
```

Note: simuPOP depends on system clock to set random seed under windows.

Debug information

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Several ways to turn on/off debug information

- Set environment variable `SIMUDEBUG`
- Use function `TurnOnDebug`, `TurnOffDebug`
- Use operator `turnOnDebug`, `turnOffDebug` to turn on/off debug at specific generations

Debug information (cont.)

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```
>>> TurnOnDebug(DBG_POPULATION)
>>> ind = population(10, loci=[5]).individual(1)
Constructor of population is called
Destructor of population is called
>>> # This line may crash simuPOP
>>> print ind.allele(2)
0
```

```
>>> # Show all debug code
```

```
>>> ListDebugCode()
```

| Debug code | On/Off |
|------------------|--------|
| DBG_ALL | 0 |
| DBG_GENERAL | 1 |
| DBG_UTILITY | 0 |
| DBG_OPERATOR | 0 |
| DBG_SIMULATOR | 0 |
| DBG_INDIVIDUAL | 0 |
| DBG_OUTPUTTER | 0 |
| DBG_MUTATOR | 0 |
| DBG_RECOMBINATOR | 0 |
| DBG_INITIALIZER | 0 |
| DBG_POPULATION | 1 |

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```
>>> help(population.addInfoFields)
Help on method population_addInfoFields:

population_addInfoFields(...) unbound simuPOP_la.population method
    Description:

        add one or more information fields to a population

    Usage:

        x.addInfoFields(fields, init=0)

    Arguments:

        fields:          new information fields. If one or more of the
                        fields already exist, they will simply be re-
                        initialized.
        init:            initial value for the new fields.

>>>
```

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Structure of a population

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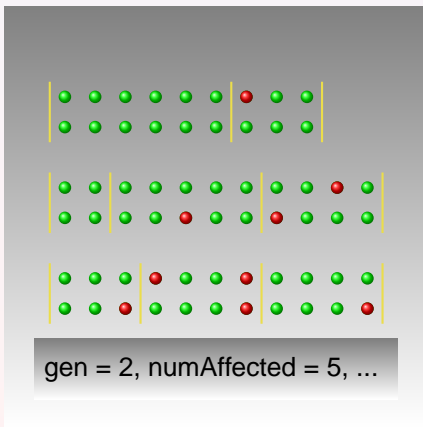
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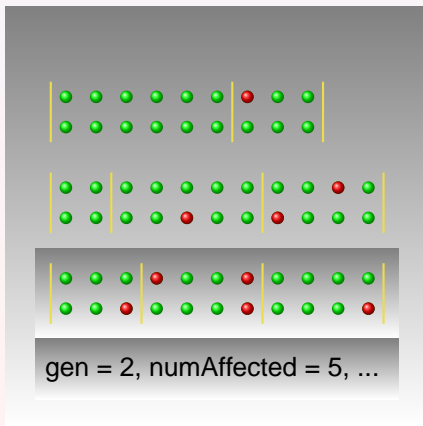
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- Unaffected
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Current generation

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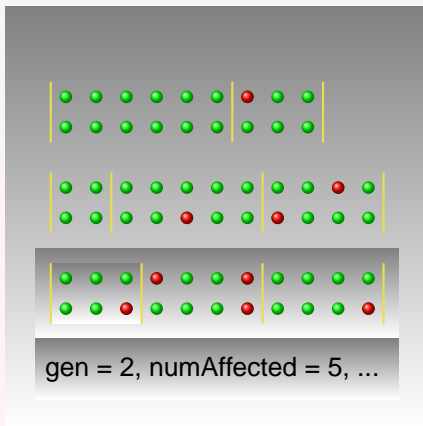
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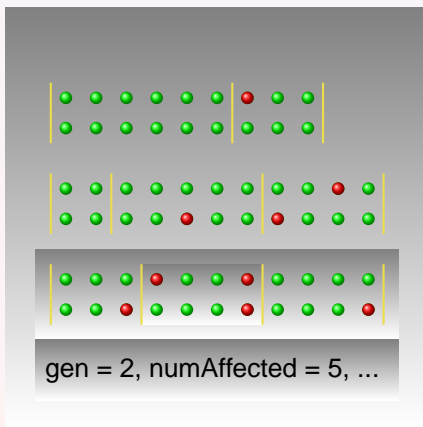
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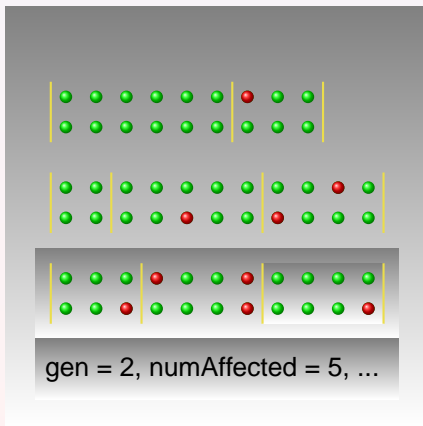
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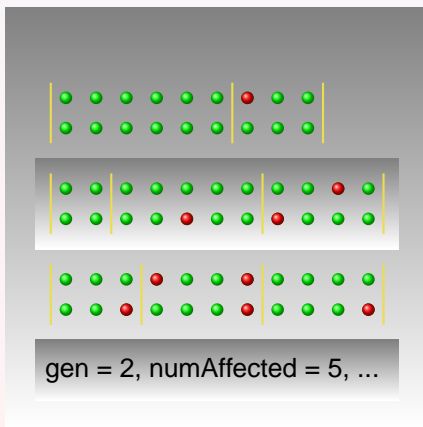
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Ancestral generation 1

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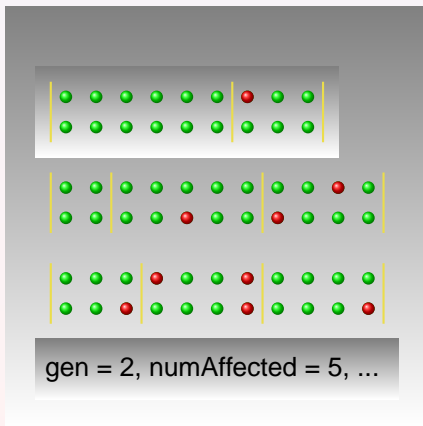
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- Unaffected
- Affected



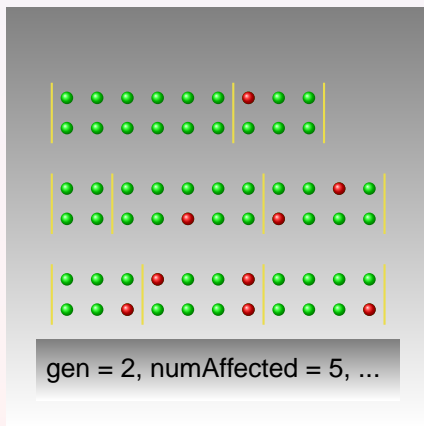
Ancestral generation 2

Ancestral generation 1

Current generation

Structure of a population

- Unaffected
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Ancestral generation 2

Ancestral generation 1

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All individuals have the same genotypic structure, which refers to

- Ploidy (diploid, haploid, triploid, ...)
- Number of chromosomes
- Number of loci on each chromosome
- Name and position of loci
- Name of information fields
- Allele names
- Existence of sex chromosome

Create a population

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```
>>> pop = population(size=10, loci=[2, 3])
>>> Dump(pop)
Ploidy:                2
Number of chrom:       2
Number of loci:        2 3
Maximum allele state:   65535
Loci positions:
                1 2
                1 2 3

Loci names:
                loc1-1 loc1-2
                loc2-1 loc2-2 loc2-3

population size:        10
Number of subPop:       1
Subpop sizes:          10
Number of ancestral populations: 0
individual info:
sub population 0:
    0: MU    0  0    0  0  0 |    0  0    0  0  0
    1: MU    0  0    0  0  0 |    0  0    0  0  0
    2: MU    0  0    0  0  0 |    0  0    0  0  0
    3: MU    0  0    0  0  0 |    0  0    0  0  0
```

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```
>>> pop = population(subPop=[200, 300], loci=[3, 2],
...     maxAllele=3, ploidy=4,
...     lociPos=[[1, 3, 5], [2.5, 4]],
...     alleleNames=['A', 'C', 'T', 'G'])
>>> pop.numLoci(0)
3
>>> pop.totNumLoci()
5
>>> pop.locusPos(4)
4.0
>>> pop.subPopSize(1)
300
>>> pop.popSize()
500
>>> pop.ploidyName()
'tetraploid'
>>> pop.individual(1).allele(1, 2)
0
>>>
```

Create a population with subpopulations

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```
>>> pop = population(subPop=[2, 5, 6], loci=[2])
>>> print pop.popSize()
13
>>> print pop.subPopSizes()
(2, 5, 6)
>>> print pop.subPopSize(1)
5
>>> Dump(pop, infoOnly=True)
Ploidy:                2
Number of chrom:       1
Number of loci:        2
Maximum allele state:  65535
Loci positions:
                        1 2
Loci names:
                        loc1-1 loc1-2
population size:       13
Number of subPop:      3
Subpop sizes:         2 5 6
Number of ancestral populations: 0
>>>
```


Mating is within subpopulation only

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```
>>> pop = population(subPop=[5, 6], loci=[2])
>>> simu = simulator(pop, randomMating())
>>> simu.evolve(
...     preOps = [
...         initByFreq(alleleFreq=[0.2, 0.8], subPop=[0]),
...         initByFreq([0, 0, 0, 0.5, 0.5], subPop=[1])
...     ],
...     ops = [
...         dumper(alleleOnly=True, indRange=[[0, 3], [5, 7]]),
...         recombinator(rate=0.1) ],
...     end = 1
... )
```

Mating is within subpopulation only (cont.)

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```
individual info:
sub population 0:
  0: MU    1  1 |    1  1
  1: FU    0  1 |    1  1
  2: FU    1  1 |    1  1
sub population 1:
  5: FU    4  4 |    4  3
  6: MU    4  4 |    4  4
End of individual info.
```

No ancestral population recorded.

```
individual info:
sub population 0:
  0: FU    1  1 |    0  1
  1: FU    1  1 |    1  1
  2: MU    1  1 |    0  1
sub population 1:
  5: MU    4  4 |    4  3
  6: FU    4  4 |    4  3
End of individual info.
```

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```
>>> pop = population(subPop=[5, 10], loci=[5])
>>> InitByFreq(pop, [.6, .3, .1])
>>> Stat(pop, alleleFreq=[1], genoFreq=[2])
>>> print pop.dvars().alleleFreq[1][0]
0.7
>>> from simuUtil import ListVars
>>> ListVars(pop.dvars(), useWxPython=False)
grp : -1
rep : -1
alleleNum :
  [1]
    [0]      21
    [1]       8
    [2]       1
genoFreq :
  [2]
    [0]
      0 :      0.266666666667
      1 :      0.4
      2 :      0.266666666667
    [1]
      1 :      0.0666666666667
genoNum :
  [2]
    [0]
      0 :      4.0
      1 :      6.0
      2 :      4.0
    [1]
      1 :      1.0
alleleFreq :
```

Population variables (cont.)

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```
subPop
[0]
  alleleNum :
    [1]
      [0] 6
      [1] 3
      [2] 1
  genoNum :
    [2]
      [0]
        1 : 3.0
        2 : 2.0
  genoFreq :
    [2]
      [0]
        1 : 0.6
        2 : 0.4
  alleleFreq :
    [1]
      [0] 0.6
      [1] 0.3
      [2] 0.1
[1]
  alleleNum :
    [1]
      [0] 15
```

Population manipulation

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```
>>> # make a copy of pop
>>> pop = population(1000, loci=[2,3])
>>> pop1 = pop.clone()
>>> # remove loci 2, 3, 4
>>> pop.removeLoci(keep=[0, 1])
>>> # pop2 will have 3 chromosomes, with loci 2, 3, 2
>>> pop2 = MergePopulationsByLoci(pops=[pop, pop1])
>>> # randomly assign alleles using given allele frequencies
>>> InitByFreq(pop2, [0.8, .2])
>>> # assign affection status using a penetrance model
>>> MapPenetrance(pop2, locus=1,
...               penetrance={'0-0': 0.05, '0-1': 0.2, '1-1': 0.8})
>>> # draw case control sample
>>> (sample,) = CaseControlSample(pop2, cases=5, controls=5)
>>> # save sample in Merlin QTDT format
>>> from simuUtil import SaveQTDT
>>> SaveQTDT(sample, output='sample', affectionCode=['U', 'A'],
...          fields=['affection'])
```

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```
>>> # have a look at the sample in Merlin-QTDT Format
>>> print open('sample.map').read()
CHROMOSOME MARKER POSITION
1      loc1-1  1.000000
1      loc1-2  2.000000
2      loc1-1_1      1.000000
2      loc1-2_1      2.000000
3      loc2-1  1.000000
3      loc2-2  2.000000
3      loc2-3  3.000000

>>> print open('sample.dat').read()
A      affection
M      loc1-1
M      loc1-2
M      loc1-1_1
M      loc1-2_1
M      loc2-1
M      loc2-2
M      loc2-3
```

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```
>>> print open('sample.ped').read()
1 1 0 0 2 A 1 1 1 2 2 1 1 1 1 1 1 1 2 1
2 1 0 0 1 A 1 1 1 1 1 1 1 1 1 1 1 1 1
3 1 0 0 2 A 1 2 2 1 1 1 1 1 1 1 2 1 1
4 1 0 0 1 A 1 1 1 2 1 1 1 1 1 1 1 1 1
5 1 0 0 2 A 2 1 2 2 1 1 1 1 1 1 1 1 1
6 1 0 0 1 U 1 1 1 1 1 1 2 2 1 1 1 1 2
7 1 0 0 1 U 1 1 1 1 1 1 1 1 1 1 1 1 1
8 1 0 0 2 U 1 1 1 2 1 1 1 2 2 1 1 1 2
9 1 0 0 2 U 1 1 1 1 1 1 1 1 1 1 2 1 1
10 1 0 0 1 U 1 2 1 2 1 1 1 1 2 1 2 1 1
>>>
```

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- Structure of individual
- Individual object
- Information fields

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Assume ploidy = 2, maxAllele = 1

| 0 | 1 | 2 | 3 | 4 | 5 | 6 |
|---|---|---|---|---|---|---|
| 0 | 1 | 1 | 1 | 0 | 0 | 1 |
| 0 | 0 | 1 | 1 | 1 | 0 | 1 |

| 0 | 1 | 2 | 3 | 4 | 5 |
|---|---|---|---|---|---|
| 0 | 1 | 0 | 0 | 0 | 1 |
| 1 | 0 | 1 | 1 | 0 | 0 |

Male

● Affected

fitness | father_idx | ...

Structure of individual

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Assume ploidy = 2, maxAllele = 1

| 0 | 1 | 2 | 3 | 4 | 5 | 6 |
|---|---|---|---|---|---|---|
| 0 | 1 | 1 | 1 | 0 | 0 | 1 |
| 0 | 0 | 1 | 1 | 1 | 0 | 1 |

Chromosome 0

| 0 | 1 | 2 | 3 | 4 | 5 |
|---|---|---|---|---|---|
| 0 | 1 | 0 | 0 | 0 | 1 |
| 1 | 0 | 1 | 1 | 0 | 0 |

Male

● Affected

fitness | father_idx | ...

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Assume ploidy = 2, maxAllele = 1

| 0 | 1 | 2 | 3 | 4 | 5 | 6 |
|---|---|---|---|---|---|---|
| 0 | 1 | 1 | 1 | 0 | 0 | 1 |
| 0 | 0 | 1 | 1 | 1 | 0 | 1 |

Chromosome 0

| 0 | 1 | 2 | 3 | 4 | 5 |
|---|---|---|---|---|---|
| 0 | 1 | 0 | 0 | 0 | 1 |
| 1 | 0 | 1 | 1 | 0 | 0 |

Chromosome 1

Male

● Affected

fitness | father_idx | ...

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Assume ploidy = 2, maxAllele = 1

| 0 | 1 | 2 | 3 | 4 | 5 | 6 |
|---|---|---|---|---|---|---|
| 0 | 1 | 1 | 1 | 0 | 0 | 1 |
| 0 | 0 | 1 | 1 | 1 | 0 | 1 |

Chromosome 0

| 0 | 1 | 2 | 3 | 4 | 5 |
|---|---|---|---|---|---|
| 0 | 1 | 0 | 0 | 0 | 1 |
| 1 | 0 | 1 | 1 | 0 | 0 |

Chromosome 1

Male

Sex

● Affected

| | | |
|---------|------------|-----|
| fitness | father_idx | ... |
|---------|------------|-----|

Structure of individual

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Population

Individual

Structure of
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Individual object
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Simulator

Assume ploidy = 2, maxAllele = 1

| 0 | 1 | 2 | 3 | 4 | 5 | 6 |
|---|---|---|---|---|---|---|
| 0 | 1 | 1 | 1 | 0 | 0 | 1 |
| 0 | 0 | 1 | 1 | 1 | 0 | 1 |

Chromosome 0

| 0 | 1 | 2 | 3 | 4 | 5 |
|---|---|---|---|---|---|
| 0 | 1 | 0 | 0 | 0 | 1 |
| 1 | 0 | 1 | 1 | 0 | 0 |

Chromosome 1

Male

Sex

● Affected

Affection status

fitness

father_idx

...

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Simulator

Assume ploidy = 2, maxAllele = 1

| 0 | 1 | 2 | 3 | 4 | 5 | 6 |
|---|---|---|---|---|---|---|
| 0 | 1 | 1 | 1 | 0 | 0 | 1 |
| 0 | 0 | 1 | 1 | 1 | 0 | 1 |

Chromosome 0

| 0 | 1 | 2 | 3 | 4 | 5 |
|---|---|---|---|---|---|
| 0 | 1 | 0 | 0 | 0 | 1 |
| 1 | 0 | 1 | 1 | 0 | 0 |

Chromosome 1

Male

Sex

● Affected

Affection status

fitness

father_idx

...

Information
fields

Individual

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```
>>> pop = population(subPop=[100, 200], loci=[2, 3])
>>> # the first individual
>>> ind1 = pop.individual(0)
>>> # the second individual in the second subpop
>>> ind2 = pop.individual(1, 1)
>>> # genotypic strcuture
>>> print ind1.numLoci(1)
3
>>> print ind1.numChrom()
2
>>> # an editable allele list
>>> alleles = ind1.arrGenotype(0)
>>> alleles[:] = range(ind1.totNumLoci())
>>> print ind1.arrGenotype(0)
[0, 1, 2, 3, 4]
>>> # ploidy 1, index 4
>>> ind1.setAllele(3, 4, 1)
>>> print ind1.allele(4, 1)
3
>>>
```

Information fields

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Pieces of information that can be attached to each individual, e.g.

- `fitness`: fitness of each individual, calculated by selectors
- `father_idx`, `mother_idx`: index of parents in the parental generation
- `old_index`: index of an individual in the population where it is sampled

Or, self-defined

- birthday
- geographic location
- ...

Information fields

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```
>>> pop = population(100, loci=[5, 8],  
...                 infoFields=['father_idx', 'mother_idx'])  
>>> simu = simulator(pop, randomMating(numOffspring=2))  
>>> simu.evolve(ops=[parentsTagger()], end=5)  
True  
>>> ind = simu.population(0).individual(0)  
>>> ind1 = simu.population(0).individual(1)  
>>> print ind.info('father_idx'), ind.info('mother_idx')  
48.0 40.0  
>>> print ind1.info('father_idx'), ind1.info('mother_idx')  
48.0 40.0  
>>>  
>>>
```

Iterate through a population

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Population

Individual

Structure of individual
Individual object
Information fields

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Simulator

```
>>> pop = population(subPop=[5, 8], loci=[5],
...   infoFields=['penetrance'])
>>> InitByFreq(pop, [.6, .3, .1])
>>> MaPenetrance(pop, locus=2, penetrance=[0.05, 0.2, 0.5],
...   wildtype=[0], infoFields=['penetrance'])
>>> # iterate through all individuals in subPop 1
>>> for ind in pop.individuals(1):
...     print 'Aff: %d Fit: %.3f Geno: %d %d' % \
...           (ind.affected(), ind.info('penetrance'), \
...            ind.allele(2, 0), ind.allele(2, 1))
...
Aff: 1 Fit: 0.200 Geno: 0 1
Aff: 0 Fit: 0.200 Geno: 0 2
Aff: 0 Fit: 0.200 Geno: 1 0
Aff: 0 Fit: 0.200 Geno: 1 0
Aff: 0 Fit: 0.200 Geno: 2 0
Aff: 0 Fit: 0.050 Geno: 0 0
Aff: 0 Fit: 0.050 Geno: 0 0
Aff: 0 Fit: 0.500 Geno: 1 1
>>>
```

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- Replicate and replicate group
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Stage of an operator

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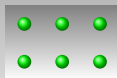
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Parental
generation

Stage of an operator

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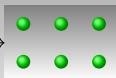
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Pre-mating
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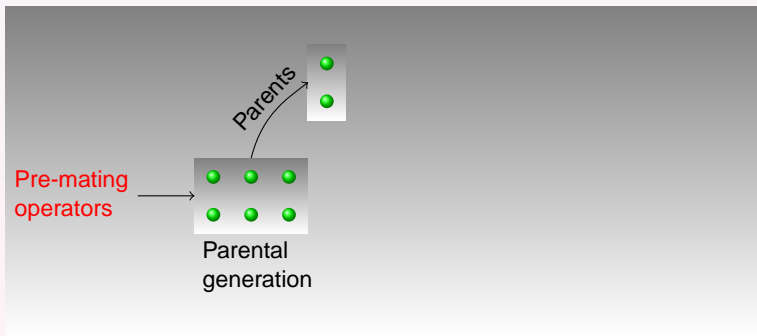
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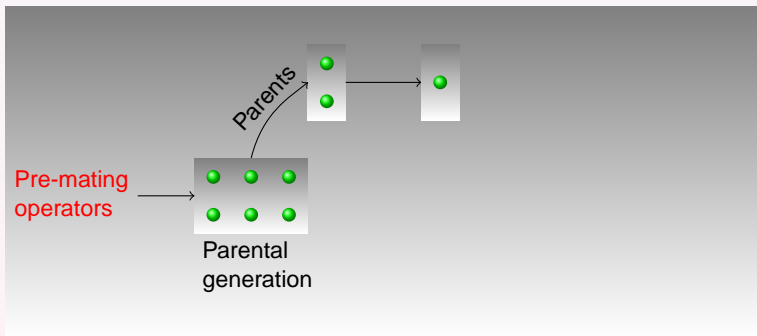
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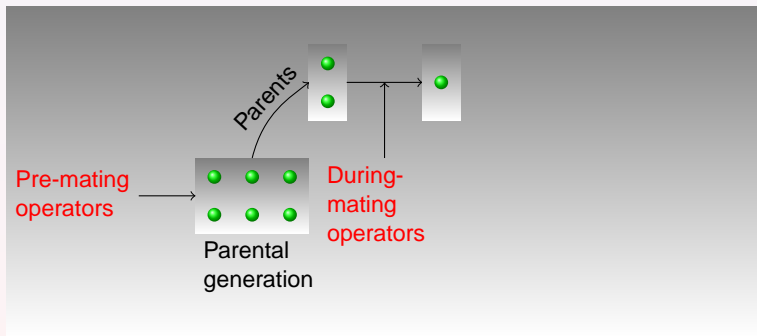
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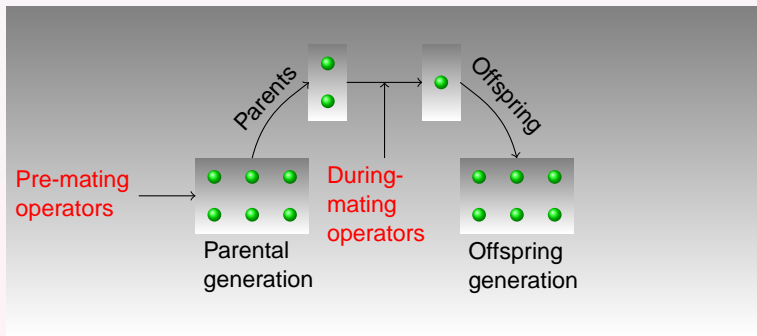
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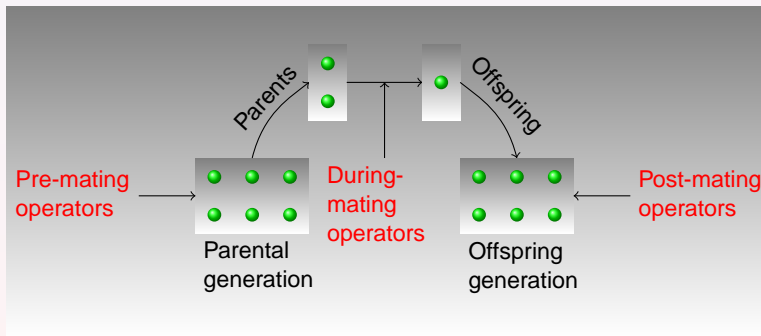
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Pre-, During- and PostMating operators

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```
>>> simu = simulator(
...     population(subPop=[20, 80], loci=[3]),
...     randomMating())
>>> simu.evolve(
...     preOps = [initByFreq([0.2, 0.8])],
...     ops = [
...         kamMutator(maxAllele=10, rate=0.00005, atLoci=[0,2]),
...         recombinator(rate=0.001),
...         dumper(stage=PrePostMating),
...         stat(alleleFreq=[1]),
...     ],
...     dryrun=True
... )
```

Dryrun mode: display calling sequence

Apply pre-evolution operators

```
Replicate 0
- <simuPOP::initByFreq> end at 1
```

Start evolution

```
Replicate 0
Pre-mating operators
- <simuPOP::dumper> at all generations
Start mating
- <simuPOP::recombination> at all generations
```

Apply post-mating operators

```
- <simuPOP::k-allele model mutator K=10> at all generations
- <simuPOP::dumper> at all generations
- <simuPOP::statistics> at all generations
```

True

```
>>>
```

Applicable generations

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```
>>> simu = simulator(
...     population(10000, loci=[3]),
...     randomMating())
>>> eval1 = r"'Gen: %3d Freq: %f\n' % (gen, alleleFreq[1][0])"
>>> eval2 = r"'Last Gen: %3d Freq: %s\n' % (gen, alleleFreq[1])"
>>> simu.evolve(
...     preOps = [initByFreq([0.3, 0.7])],
...     ops = [
...         recombinator(rate=0.01, begin=10, end=30),
...         stat(alleleFreq=[1], step=10),
...         pyEval(eval1, step=10),
...         pyEval(eval2, at=[-1])
...     ],
...     end = 50
... )
Gen: 0 Freq: 0.304200
Gen: 10 Freq: 0.290700
Gen: 20 Freq: 0.285300
Gen: 30 Freq: 0.288750
Gen: 40 Freq: 0.283750
Gen: 50 Freq: 0.284100
Last Gen: 50 Freq: [0.28410000000000002, 0.71589999999999998]
True
>>>
```

Applicable replicates

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```
>>> simu = simulator(
...     population(100, loci=[3]),
...     randomMating(),
...     rep=5, grp=[1,1,2,2,2])
>>> simu.evolve(
...     preOps = [initByFreq([0.5, 0.5])],
...     ops = [
...         stat(alleleFreq=[1]),
...         recombinator(rate=0.01, grp=1),
...         recombinator(rate=0.01, grp=2),
...         pyEval(r"'%.2f ' % alleleFreq[1][0]", grp=1),
...         pyEval(r"'\\n'", rep=REP_LAST),
...     ],
...     end=5
... )
0.47 0.52
0.49 0.56
0.51 0.60
0.52 0.62
0.56 0.60
0.52 0.62
True
>>>
```

Output

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Simulator

```
>>> simu = simulator(
...     population(100, loci=[3]),
...     randomMating(),
...     rep=5, grp=[1,1,2,2,2])
>>> simu.evolve(
...     preOps = [initByFreq([0.5, 0.5])],
...     ops = [
...         stat(alleleFreq=[1]),
...         pyEval(r"'%.2f ' % alleleFreq[1][0]",
...             output='>>out'),
...         pyEval(r"\n", rep=REP_LAST, output='>>out'),
...         pyEval(r"'%.2f ' % alleleFreq[1][0]",
...             outputExpr=">>out%d' % grp"),
...     ],
...     end=2
... )
True
>>> print open('out').read()
0.56 0.55 0.46 0.47 0.54
0.56 0.55 0.42 0.55 0.57
0.58 0.56 0.40 0.57 0.56

>>> print open('out1').read()
0.56 0.55 0.56 0.55 0.58 0.56
>>> print open('out2').read()
0.46 0.47 0.54 0.42 0.55 0.57 0.40 0.57 0.56
>>>
```

Python operator

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A **Python operator** is an operator that calls a user-provided Python function when it is applied to a population. A **hybrid operator** performs its main function at the C++ level, and a **pure Python operator** depends on this user-provided function for its functionality.

A hybrid operator

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A (weird) selector with fitness

| | BB | Bb | bb |
|----|----|------|------|
| AA | 1. | 1.01 | 1.02 |
| Aa | 1. | 0.99 | 0.98 |
| aa | 1. | 1.01 | 1.02 |

```
>>> def mySelector(geno, gen):
...     if geno[0] + geno[1] == 0:
...         return (1, 1.01, 1.02)[geno[2] + geno[3]]
...     elif geno[0] + geno[1] == 1:
...         return (1, 0.99, 0.98)[geno[2] + geno[3]]
...     else:
...         return (1, 1.01, 1.02)[geno[2] + geno[3]]
... 
```

Note: This operator can be more efficiently implemented using other non-Python operators.

A hybrid operator (cont.).

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```
>>> expr = r'"%.3f %.3f\n" % (alleleFreq[0][0], alleleFreq[1][0])'
>>> simu = simulator(
...     population(10000, loci=[1,1],
...     infoFields=['fitness']),
...     randomMating(),
... )
>>> simu.evolve(
...     preOps = [initByFreq([0.3, 0.7])],
...     ops = [
...         pySelector(loci=[0, 1], func=mySelector),
...         stat(alleleFreq=[0, 1], step=20),
...         pyEval(expr, step=20)
...     ],
...     end = 100
... )
0.294 0.298
0.252 0.278
0.184 0.246
0.134 0.232
0.078 0.215
0.047 0.209
True
>>>
```

A pure Python operator

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```
>>> from random import normalvariate
>>> def trait(ind):
...     return [ind.info('trait') + normalvariate(0, 1)]
...
>>> def avgTrait(pop):
...     t = sum(pop.indInfo('trait', False))/pop.popSize()
...     pop.dvars().trait = t
...     print 'Average trait at gen %4d : %.4f' % (pop.gen(), t)
...     return True
...
>>> simu = simulator(
...     population(100, infoFields=['trait']),
...     randomMating()
... )
>>> simu.evolve(
...     ops = [
...         pyIndOperator(func=trait, infoFields=['trait']),
...         pyOperator(func=avgTrait, step=100),
...     ],
...     end = 500
... )
Average trait at gen    0 : -0.0216
Average trait at gen  100 : -0.7387
Average trait at gen  200 : -0.6641
Average trait at gen  300 :  0.0523
Average trait at gen  400 : -0.4510
Average trait at gen  500 : -0.7781
True
>>>
```

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Mating scheme

- Demographic model
- Number of offspring

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Mating schemes

- Population offspring subpopulation from corresponding parental subpopulation
- Can change subpopulation size
- Select parents according to their `fitness` value (information field)
- Can produce more than one offspring

Demographic model

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Demographic model

Number of offspring

Simulator

```
>>> def lin_inc(gen, oldsize=[]):
...     return [10+gen]*5
...
>>> simu = simulator(
...     population(subPop=lin_inc(1), loci=[1]),
...     randomMating(newSubPopSizeFunc=lin_inc)
... )
>>> simu.evolve(
...     ops = [
...         stat(popSize=True),
...         pyEval(r'"%d %d\n"%(gen, subPop[0]["popSize"])'),
...     ],
...     end=5
... )
0 10
1 11
2 12
3 13
4 14
5 15
True
>>>
```

Number of offspring

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Individual

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Demographic
model

Number of
offspring

Simulator

```
>>> simu = simulator(  
...     population(size=10000, loci=[1]),  
...     randomMating(),  
... )  
>>> simu.evolve(  
...     preOps = [initByFreq([0.1, 0.9])],  
...     ops = [ ], end=100  
... )  
True  
>>> simu.setMatingScheme(randomMating(numOffspring=2))  
>>> simu.addInfoFields(['father_idx', 'mother_idx'])  
>>> simu.setAncestralDepth(1)  
>>> simu.step(ops=[parentsTagger()])  
True  
>>> pop = simu.getPopulation(0)  
>>> MaPenetrance(pop, locus=0, penetrance=[0.05, 0.1, 0.5])  
>>> AffectedSibpairSample(pop, size=100)  
[<simuPOP::population of size 200>]  
>>>
```

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Populations

6 Simulator

- What a simulator does
- Simulator operations
- Populations

Simulator

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Populations

A simulator manages

- Replicates of a population
- A mating scheme
- Many operators

and evolve the populations.

Populations

A set of navigation icons typically found in Beamer presentations, including symbols for back, forward, search, and other slide controls.

simulator populations

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Populations

```
>>> # get a reference to the first replicate
>>> pop = simu.population(0)
>>> pop.individual(0).setAllele(1, 0)
>>> print simu.population(0).individual(0).allele(0)
1
>>> # get a real copy
>>> pop = simu.getPopulation(0)
>>> pop.individual(0).setAllele(1, 1)
>>> print simu.population(0).individual(0).allele(1)
0
>>>
```