fishSim-vignette

Shane M Baylis

2024-05-09

fishSim is a package for demographic simulation and exploration of kin relationships. It includes functions to build populations and move, mate, kill, age, and switch the sex of individuals within those populations or defined subpopulations. It doesn't include any one-line functions that define and run an entire simulation. Instead, users will have to build their own for-loop over years, with each year containing mating, mortality, ageing, sampling, and/or movement events as needed. With a little planning, this makes fishSim very adaptable. Importantly, fishSim is individual-based and retains parentage information for all individuals, allowing full reconstruction of kin relationships to arbitrary depth.

In addition to population simulation features, fishSim includes a set of convenience functions allowing the user to check the scenario population growth rate, find simulation scenarios with null population growth (PoNG()), selectively archive subsets of the population for increased computational speed. For a given population, fishSim also includes functions to look up pairs of animals, compare their sets of ancestors, and classify them into kin categories based on their nearest shared ancestor(s), or show patterns of shared ancestors for members of a pair.

fishSim is developed in response to the demands of close-kin mark-recapture projects. 'typical' use-cases therefore involve an understanding of both demography and kin relationships. This vignette will cover two use scenarios - one relatively simple one, with:

- age-specific (but not sex-specific) fecundity,
- constant adult survival,
- a single population with no subdivisions (i.e., one 'stock'),
- no sex-switching, and
- first-year survival set by PoNG(), giving a flat population size through time,
- one-shot sampling of animals from the population

... and a one designed to show off the bells and whistles, with:

- age-specific, sex-specific fecundity with within-season mating exhaustion for females,
- age-specific, sex-specific survival,
- three subpopulations ('stocks') with markovian movement between subpopulations,
- male-to-female sex-switching,
- a growing population,
- lethal sampling, occurring through time during the simulation.

In the 'bells-and-whistles' scenario, we will also cover archiving tools. For both scenarios, we will take a brief look at relationship patterns between pairs of animals.

1 The relatively-simple scenario

1.1 Setup

In order to simulate a population, we need an object to hold that population's data, and the population will need some founding members. Our data object will have one line per individual, so let's call it indiv.

```
library(fishSim)
indiv <- makeFounders(stocks = c(1))</pre>
head(indiv)
#>
                                     Me Sex
                                                 Dad
                                                          Mum BirthY DeathY Stock AgeLast SampY
#> 1 86a0776d15924b6ca80713feda80515f
                                                                                 1
                                                                                          5
                                           M founder founder
                                                                  -4
                                                                          NA
                                                                                               NA
                                                                                          9
#> 2 ac139d5375d6401b949fcdac8366b407
                                          F founder founder
                                                                  -8
                                                                          NA
                                                                                 1
                                                                                               NA
#> 3 6d1bb397c9894955b48db9f79951811a
                                          F founder founder
                                                                  -7
                                                                          NA
                                                                                          8
                                                                                               NA
                                                                                 1
#> 4 b4d575b187da4320a11c4b0b12d51989
                                                                  -2
                                                                          NA
                                                                                          3
                                                                                               NA
                                          M founder founder
#> 5 0d797ae03e844ab4a330525ad259126d
                                                                  -3
                                                                                 1
                                           M founder founder
                                                                          NA
                                                                                          4
                                                                                               NA
#> 6 a2b7f771ced54c0d8b8b7f33be6c01c0
                                          M founder founder
                                                                  -8
                                                                          NA
                                                                                               NA
```

Now, what's here? indiv has one line per individual, and each individual has an ID code (indiv\$Me), a sex (indiv\$Sex), a father's ID code (indiv\$Dad - but which is 'founder' here, because founding animals can't really be said to have parents), a mother's ID code (indiv\$Mum - ditto), a birth year indiv\$BirthY, a death year (indiv\$DeathY - NA for any animals that are still alive), a stock membership (indiv\$Stock), an age in years (indiv\$AgeLast), and a flag indicating whether the individual has been sampled (indiv\$SampY).

The age structure, sex ratio, and stock memberships of founders can all be specified in the makeFounders() call. We've only changed one of the default values - instead of the default 3 stocks, we're going to have a single panmictic founder population. The other defaults give us 1000 founders, with an even sex ratio, with an age-structure that implies 70% annual survival, but with a hard age-limit of 20 years.

1.2 Mating

Having set up our population, we can now get its members to breed, get older, switch sex and die, using the mate() (or altMate()), birthdays(), sexSwitch(), and mort() functions. If we had more than one stock, we could also get individuals to move between stocks with markovian movement probabilities, using move(). Let's look at those.

```
nrow(indiv)
#> [1] 1000
indiv <- mate(indiv, year = 1)</pre>
nrow(indiv) ## 200 newborns
#> \[ 11 \] 1200
tail(indiv) ## newborns are added to the end
                                       Me Sex
                                                                             Da.d.
#> 1195 3e631d70c1934fc79d7860b5ded3da97
                                             F e787cbb9cd594747b70c958ebb9dabc6
#> 1196 597599f81b304ac49baef8a3f8a835fb
                                             F 3ebeecc4d9954b608244b10d2cb8d9ec
#> 1197 64b66af3497849ae96f6e19dcd18a25c
                                             F 3ebeecc4d9954b608244b10d2cb8d9ec
#> 1198 1a0d21abfdc44329a8df9e86b6671a44
                                             M 3ebeecc4d9954b608244b10d2cb8d9ec
#> 1199 322d789f57f6483c8deae20bc8552378
                                             F 3571b121767f45b4ae689be7397457d4
#> 1200 66631c9ae30043c2b12f2cea6c278ff1
                                             F 396917a6fb884b7da37876800a2114a9
                                      Mum BirthY DeathY Stock AgeLast SampY
#> 1195 eba809e065ae4727b3493c9228ebcd85
                                                1
                                                      NA
                                                              1
                                                                      0
                                                                           NA
                                                                           NA
#> 1196 fdadc1170c404854b2daa6c1260946c7
                                                1
                                                      NA
                                                              1
                                                                      0
#> 1197 fdadc1170c404854b2daa6c1260946c7
                                                1
```

Here are some newborns, generated using the default mate() settings. Unlike founders, these newborns all have a father's ID and a mother's ID, are all aged 0, and all have a birth year of equal to the year argument. There are 200 newborns, because mate() generates new members as a proportion of the extant population size (i.e., we specify fecundity for the population, not the individuals), and that proportion (argument fecundity) is 0.2 by default. Each individual was born in a clutch, and each clutch contained a Poisson-distributed number of clutch-members, the default mean ('batchSize') of 0.5. mate() simply kept producing newborns by mating together random male/female pairs until nrow(indiv) * 0.2 new offspring were produced.

Alternatively, we can mate our population using altMate(), which specifies individual maturities by age, and a probability distribution of number of offspring per mature female. Let's generate some new founders and try that.

```
indiv <- makeFounders(stocks = c(1))</pre>
nrow(indiv) ## 1000 founders
#> [1] 1000
indiv <- altMate(indiv, firstBreed = 2, batchSize = 0.9, year = 1)</pre>
tail(indiv)
#>
                                       Me Sex
                                                                             Dad
#> 3011 0501b6a8f79f4a539ceda4943e46fa09
                                            F fa8469f55c4a487a827a6dab11148467
#> 3021 33e20d9f4bd74b74b496cf8db3c15744
                                            F b78a7ee89d474e3e95fa84a39938d689
#> 3031 e4715c1f27a94607b5961ad5909b98ab
                                            F 3a35382c08964f46a86011e1abb4921e
#> 3041 bebb9e8fcc21493f9b40924ff60b2b29
                                            F a6221563538a42ecaac4ea8b1dd68e92
#> 3051 d16a66806d6c4b2d90527fde8a38499e
                                             M a6221563538a42ecaac4ea8b1dd68e92
#> 3061 9869dc97351d4a20ad3629cf44f5a283
                                            F a6221563538a42ecaac4ea8b1dd68e92
#>
                                      Mum BirthY DeathY Stock AgeLast SampY
#> 3011 427a8852759a407caf409794d743b4fd
                                                1
                                                      NA
                                                             1
                                                                      0
                                                                           NA
#> 3021 47063c0534ea4619838db6b10dedc448
                                                1
                                                      NA
                                                              1
                                                                      0
                                                                           NA
#> 3031 37b574472e2c4a69a15da19df79e0033
                                                                      0
                                                1
                                                      NA
                                                              1
                                                                           NA
#> 3041 785f60b3e0bb4ec0a72247dd7cc0df61
                                                      NA
                                                                      0
                                                                           NA
                                                1
#> 3051 785f60b3e0bb4ec0a72247dd7cc0df61
                                                      NA
                                                              1
                                                                      0
                                                                           NA
                                                1
#> 3061 785f60b3e0bb4ec0a72247dd7cc0df61
                                                                           NA
```

In this call to altMate(), females became sexually mature at 2 years of age (firstBreed = 2), and each sexually-mature female produced a Poisson-distributed number of offspring with mean set by batchSize. It is possible to specify age-specific or sex-specific fecundities, set paternity within-clutch to be single or multiple, to exhaust fathers within each breeding season (females, in this system, always breed to exhaustion each season), and to set a sex ratio for offspring by additional arguments to altMate(), and these options can also be set in mate().

1.3 Mortality

Now, let's kill some of the population. Mortality probabilities can be flat, age-specific or stock-specific (and with a little extra effort, sex- or age:stock:sex-specific too), or we can randomly kill animals such that the population is reduced to a certain size, and we can set an age past which no animal will survive. For now, let's set a flat 20% mortality rate (i.e., the probability of death is equal for all animals).

```
nrow(indiv)
#> [1] 1306
indiv <- mort(indiv, year = 1, type = "flat", mortRate = 0.2)</pre>
nrow(indiv)
#> [1] 1306
head(indiv, n = 15)
#>
                                     Me Sex
                                                 Dad
                                                          Mum BirthY DeathY Stock AgeLast SampY
#> 1
      7a8a72c7311249fcbd98010b20025b64
                                           F founder founder
                                                                   0
                                                                          1
                                                                                 1
                                                                                         1
                                                                                         2
#> 2 8a8a91f958ac4c1196eb28793b42236f
                                           M founder founder
                                                                  -1
                                                                         NA
                                                                                 1
                                                                                              NA
#> 3 384819bd9ccb43f398bc2a48e73b0282
                                           F founder founder
                                                                   0
                                                                          1
                                                                                 1
                                                                                         1
                                                                                              NA
#> 4 e32cba63e581412db9e88c229d5f2fd4
                                           M founder founder
                                                                  -2
                                                                                         3
                                                                         NA
                                                                                 1
                                                                                              NA
#> 5 762dee4d347a4a97bd17faaa01b901a0
                                           M founder founder
                                                                  -1
                                                                         NA
                                                                                         2
                                                                                 1
                                                                                              NA
#> 6 ee4fe9f4692249a0a1faf16cac01d6b4
                                           F founder founder
                                                                                         3
                                                                  -2
                                                                          1
                                                                                              NA
#> 7 821315a9de034811a452eb3fc927cc00
                                           F founder founder
                                                                  -1
                                                                         NA
                                                                                         2
                                                                                              NA
                                                                                 1
#> 8 ace66336a4934ed38e790038988f1833
                                           M founder founder
                                                                  -2
                                                                         NA
                                                                                 1
                                                                                         3
                                                                                              NA
#> 9 7ca9adb5416648e382afa26f79999870
                                           F founder founder
                                                                   0
                                                                         NA
                                                                                 1
                                                                                         1
                                                                                              NA
#> 10 f1803647f3e14ae38aa4932348a9bdaa
                                           F founder founder
                                                                  -2
                                                                         NA
                                                                                         3
                                                                                              NA
                                                                                         5
#> 11 b4350b9c6d204ed4bb07fc0de0e92247
                                           F founder founder
                                                                         NA
                                                                                              NA
                                                                                 1
                                                                  -4
#> 12 a7a99d3d9022429c8c039e23ec3da473
                                           F founder founder
                                                                         NA
                                                                                         1
                                                                                              NA
                                                                   0
                                                                   0
                                           F founder founder
#> 13 f57ebaf8431f44ff985ea8425ece0b99
                                                                         NA
                                                                                 1
                                                                                         1
                                                                                              NA
                                           F founder founder
                                                                  -3
                                                                          1
#> 14 616dd629f6554f49ba81a6852c2c8a35
                                                                                 1
                                                                                              NA
#> 15 3e47b9b1dd5044f796c79e13464a6c04
                                           F founder founder
                                                                   0
                                                                                              NA
```

Mortality does not remove dead animals from 'indiv' - we will need to refer to them later - it just updates their death year to the value given in year. In general, though, animals with a non-NA value for death year will not move, mate, switch sex, or have birthdays.

1.4 Birthdays

On the topic of birthdays: that's the final thing that must be done before we can put this all together and run a full (albeit basic) demographic simulation: we need to be able to increase the age of our animals, and that is what the birthdays() function is for. It's very simple: it takes all living members of the population, and increments their age by 1.

```
tail(indiv)
#>
                                       Me Sex
                                                                             Dad
#> 3011 0501b6a8f79f4a539ceda4943e46fa09
                                            F fa8469f55c4a487a827a6dab11148467
#> 3021 33e20d9f4bd74b74b496cf8db3c15744
                                            F b78a7ee89d474e3e95fa84a39938d689
#> 3031 e4715c1f27a94607b5961ad5909b98ab
                                            F 3a35382c08964f46a86011e1abb4921e
#> 3041 bebb9e8fcc21493f9b40924ff60b2b29
                                             F a6221563538a42ecaac4ea8b1dd68e92
#> 3051 d16a66806d6c4b2d90527fde8a38499e
                                            M a6221563538a42ecaac4ea8b1dd68e92
  3061 9869dc97351d4a20ad3629cf44f5a283
#>
                                             F a6221563538a42ecaac4ea8b1dd68e92
                                      Mum BirthY DeathY Stock AgeLast SampY
#> 3011 427a8852759a407caf409794d743b4fd
                                                1
                                                       1
                                                             1
                                                                      0
                                                                           NA
#> 3021 47063c0534ea4619838db6b10dedc448
                                                      NA
                                                                      0
                                                1
                                                             1
                                                                           NA
#> 3031 37b574472e2c4a69a15da19df79e0033
                                                1
                                                      NA
                                                             1
                                                                      0
                                                                           NA
#> 3041 785f60b3e0bb4ec0a72247dd7cc0df61
                                                1
                                                      NA
                                                                      0
                                                                           NA
                                                             1
#> 3051 785f60b3e0bb4ec0a72247dd7cc0df61
                                                1
                                                      NA
                                                              1
                                                                      0
                                                                           NA
#> 3061 785f60b3e0bb4ec0a72247dd7cc0df61
                                                1
                                                      NA
                                                             1
                                                                      0
                                                                           NA
indiv <- birthdays(indiv)</pre>
tail(indiv)
                                       Me Sex
                                                                             Dad
```

```
#> 3011 0501b6a8f79f4a539ceda4943e46fa09
                                           F fa8469f55c4a487a827a6dab11148467
#> 3021 33e20d9f4bd74b74b496cf8db3c15744
                                           F b78a7ee89d474e3e95fa84a39938d689
#> 3031 e4715c1f27a94607b5961ad5909b98ab
                                           F 3a35382c08964f46a86011e1abb4921e
#> 3041 bebb9e8fcc21493f9b40924ff60b2b29
                                           F a6221563538a42ecaac4ea8b1dd68e92
#> 3051 d16a66806d6c4b2d90527fde8a38499e
                                           M a6221563538a42ecaac4ea8b1dd68e92
                                           F a6221563538a42ecaac4ea8b1dd68e92
#> 3061 9869dc97351d4a20ad3629cf44f5a283
#>
                                     Mum BirthY DeathY Stock AgeLast SampY
#> 3011 427a8852759a407caf409794d743b4fd
                                               1
                                                      1
                                                            1
#> 3021 47063c0534ea4619838db6b10dedc448
                                                     NA
                                                                    1
                                               1
                                                            1
                                                                         NA
#> 3031 37b574472e2c4a69a15da19df79e0033
                                                            1
                                               1
                                                     NA
                                                                    1
                                                                         NA
#> 3041 785f60b3e0bb4ec0a72247dd7cc0df61
                                              1
                                                     NA
                                                            1
                                                                    1
                                                                         NA
#> 3051 785f60b3e0bb4ec0a72247dd7cc0df61
                                              1
                                                     NA
                                                                    1
                                                                         NA
#> 3061 785f60b3e0bb4ec0a72247dd7cc0df61
                                               1
                                                     NA
                                                                         NA
```

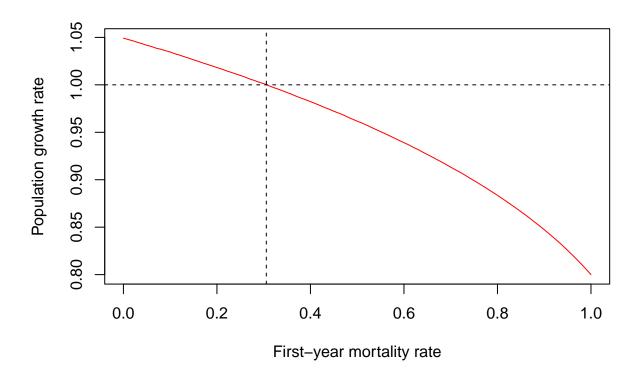
1.5 Sampling from the population

It is often useful to keep track of which animals in the population have been captured, and if capture is lethal, to mark captured animals as dead through a separate process from the normal 'mort' functions. The function capture() takes a sample of individuals, marks them as 'captured' by updating their 'captured' value, and, if capture is lethal, marks them as dead by updating their death year, as in mort(). It is possible to make capture() sex-specific, age-specific, or age:sex specific, so that only one sex may be captured, only one age-class may be captured, or only one sex at one age-class may be captured, respectively.

```
## non-lethal sampling of 5 females
indiv <- capture(indiv, n = 5, year = 1, fatal = FALSE, sex = "F")
## lethal sampling of 5 animals, from either sex
indiv <- capture(indiv, n = 5, year = 1, fatal = TRUE)
## non-lethal sampling of 5 one-year-old females
indiv <- capture(indiv, n = 5, year = 1, fatal = FALSE, sex = "F", age = 1)</pre>
```

1.6 What's my population doing? Can I make it stay the same size?

A couple more functions deserve a mention here: check_growthrate() and PoNG(). check_growthrate() tells you how quickly your population is growing. PoNG() tells you what you need first-year survival to be, in order for your population to maintain a constant size (within limits - the estimation is Leslie Matrix-based, and there are ways to fool Leslie Matrices that are out of scope for this vignette but covered briefly in the PoNG() and check_growthrate() documentation). Let's try both of those, using the mating and mortality settings we have already used.



```
#> $root
#> [1] 0.3056585
#>
#> $f.root
#> [1] -0.000138004
#>
#> $iter
  [1] 8
#>
#>
#> $init.it
#>
   [1] NA
#>
#> $estim.prec
#> [1] 0.0009070185
## if first-year mortality was about 0.305, rather than 0.2, our population
## would have null growth. You can also read off a range of possible growth rates
## from the plot.
```

1.7 Turning processes into a simple simulation

To turn those processes into a full demographic simulation, all that is needed is to repeat the processes in a loop. Let's do that, but set age-specific mortality so that the long-run average population growth rate is zero using the first-year mortality rate we got from PoNG(), so that our population is unlikely to explode or become extinct.

```
indiv <- makeFounders(stocks = c(1))</pre>
ageMort <- c(0.305, rep(0.2, 100)) ## age-specific mortality is 0.305 for first-years,
## 0.2 for all older age-classes.
for (y in 1:60) {
    indiv <- altMate(indiv, firstBreed = 2, batchSize = 0.9, year = y) ## y for year</pre>
   indiv <- mort(indiv, year = y, type = "age", ageMort = ageMort)</pre>
                                                                    ## age-specific mort
   indiv <- birthdays(indiv)</pre>
}
tail(indiv) ## a population with 60 years of births, deaths, and birthdays
                                      Me Sex
                                                                         Da.d.
#> 40071 b68092d2202f408da11a8d127e308dc9 M 9a35eb3e22e04850ac59168fde91a9f5
#> 40081 d1c85db7cbe94109971ee8c62b87f904
                                           F de638211fdd3421186e9edf66aa06531
#> 40091 05035b2b48ae4737ba99dbb7929b282f
                                          F 310244b16ffd4d68a873bf5c4385cea7
#> 401110 60c04210dc094f7da1a48922353a62ee
                                           M c8deec4aff6e447f9ab868eb308ab830
#> 401210 f5f598e719a84de6b4b87167e3728e29
                                           M d64619c024dd462ea81c5950d714a3e0
                                     Mum BirthY DeathY Stock AgeLast SampY
#> 40071 c905df92850344cf854cfb3ba57d7ecd
                                             60
                                                   NA
                                                          1
                                                                  1
#> 40081 dbea7ea36f4c4fa0947caac418c5bdf1
                                             60
                                                    NA
                                                          1
                                                                  1
                                                                       NA
#> 40091 f283293105e14a85a4814e2a2e4884c5
                                             60
                                                    60
                                                                  0
                                                                       NA
                                                          1
#> 401010 f283293105e14a85a4814e2a2e4884c5
                                             60
                                                    NA
                                                          1
                                                                  1
                                                                       NA
#> 401110 b320294404754451843e2c7414c1002c
                                             60
                                                    60
                                                                       NA
#> 401210 1a0083b56e6d4e3b8de221e862ec6383
                                             60
                                                    NA
                                                          1
                                                                  1
                                                                       NA
nrow(indiv[is.na(indiv$DeathY),]) ## the currently-alive population size. Note that population
#> [1] 11750
                              ## growth only *averages* zero, and variability occurs!
```

1.8 Looking up relationships between pairs of animals

One of the key advantages of fishSim is its ability to report on different relationships between pairs of animals in a sample. Are these two each other's siblings? Half-siblings? Is one the parent of the other? The grandparent? Some obscure half-cousin, once removed?

Internally, these relationships are stored in terms of 'shared ancestors at the n'th generation of each member', starting with the 'self' as generation 1. So a pair might have a shared pairs\$TwoThree ancestor - that ancestor is the parent of one member, and the grandparent of the other. Or the pair might have a shared pairs\$OneTwo ancestor - in which case, one member's self is the other member's parent.

If a pair shares a parent (i.e., pairs\$TwoTwo == 1), then they also share at least two grandparents (pairs\$ThreeThree >= 2), four great-grandparents (pairs\$FourFour >= 4), and so on. This pattern holds generally: a half thiatic pair (pairs\$TwoThree == 1) will also share at least two pairs\$ThreeFour >= 2 ancestors and at least four pairs\$FourFive >= 4 ancestors. It is also possible, for example, for a pair to share two grandparents, but no parents - that is the case for full cousin pairs.

```
## mark 200 individuals alive at the end of the simulation as 'captured'.
indiv <- capture(indiv, n = 200, year = 60, fatal = FALSE)

## look up each animal's ancestors and look for shared ancestors between each
## pair of sampled animals:
pairs <- findRelativesPar(indiv = indiv, sampled = TRUE, nCores = 2)

#> Sample. Year Freq
#> 1 60 200
```

```
#> [1] "parents found at 2024-05-09 15:25:45.976034"
#> [1] "grandparents found at 2024-05-09 15:25:46.472472"
#> [1] "great-grandparents found at 2024-05-09 15:25:47.471043"
#> [1] "great-great-grandparents found at 2024-05-09 15:25:49.416985"
#> [1] "great-great-great-grandparents found at 2024-05-09 15:25:53.393376"
#> [1] "great-great-great-great-grandparents found at 2024-05-09 15:26:03.145211"
#> 1000 of 19900 comparisons2000 of 19900 comparisons3000 of 19900 comparisons4000 of 19900 comparisons
POPs <- pairs[pairs$OneTwo == 1,] ## Parent-Offspring pairs
GGPs <- pairs[pairs$OneThree == 1,] ## Grandparent-Grandoffspring pairs
HSPs <- pairs[pairs$TwoTwo == 1,] ## Half-sibling pairs</pre>
FSPs <- pairs[pairs$TwoTwo == 2,] ## Full Sibling pairs (self-comparisons
## are automatically excluded)
FCPs <- pairs[pairs$ThreeThree == 2 & pairs$TwoTwo != 1,] ## Full Cousin pairs
## look at the number of shared ancestors at each ancestral
## generation, for one of the half-sibling pairs.
lookAtPair(HSPs[1,])
       Self Par GP G2P G3P G4P G5P
#> Self
#> Par
            1 . .
#> GP
         . . 2 . . .
#> G2P
         . . . 4 . . .
#> G3P
         . . . . . . 16
#> G4P
#> G5P
relatives <- namedRelatives(pairs) ## shows the number of pairs of each relationship type
relatives
#> POPs GGPs dGGPs G4Ps dG4Ps G6Ps dG6Ps HSPs FSPs HTPs FTPs HCPs FCPs GHCPs GFCPs ORCs
#> 1 0 4 0 5 0 2 0 3 0 9 3 20 1 19 2 12487
```

2 The 'bells and whistles' scenario

In this second scenario, we will simulate a metapopulation with:

- age-specific, sex-specific fecundity with within-season mating exhaustion for females,
- stock-specific, age-specific survival,
- three subpopulations ('stocks') with markovian movement between subpopulations,
- male-to-female sex-switching,
- a growing population.
- archiving for speed (?)

We set up the population basically as before, with a couple of slight tweaks. First, we should make sure the founding population has multiple stocks (we'll give it three). Second, we will set up an archive matrix. The archive matrix is intended to hold the records of dead animals in large, long-running simulations: dead animals do not take part in any further mating, movement, sex-switching, aging, or mortality events, but if they stay in indiv, indiv can become huge and unweildy, slowing down all of those processes. There is of course a trade-off, in that writing dead animals to the archive takes system time, so the optimum may be to only archive dead animals once every few 'years'.

2.1 Setting up the data objects

```
## set up founders with three stocks: two that each contain 30% of the population,
## and one that contains the remaining 40%.

indiv <- makeFounders(pop = 1000, stocks = c(0.3, 0.3, 0.4))

## set up archive - just a matrix with zero rows and eight columns

archive <- make_archive()</pre>
```

2.2 Parameterising movement, survival, and maturity structures

Because we will have inter-stock movement in this sim, we will also need to set up a matrix giving the probability that an individual will move into another stock, given its current stock membership. Because survival will be age- and stock-dependent, we will need a matrix of survival rates with as many columns as stocks, and as many rows as (at least) the age of the oldest plausible population-member. Because we will have age-specific, sex-specific fecundity, we will need a male age-specific maturity curve and a female age-specific maturity curve. Let's set those up now.

```
## Markovian movement matrix
stocks <- c(0.3, 0.3, 0.4)
admix.m <- matrix(NA, nrow = length(stocks), ncol = length(stocks))
for(i in 1:nrow(admix.m)) {
    admix.m[i,] <- stocks*stocks[i]
}
## admix.m shows movement proportional to starting population sizes.
admix.m
#> [,1] [,2] [,3]
#> [1,] 0.09 0.09 0.12
#> [2,] 0.09 0.09 0.12
```

```
#> [3,] 0.12 0.12 0.16
## let's tweak those numbers so that animals tend to stay where
## they are, and not move around so much.
admix.m \leftarrow matrix(c(0.23, 0.03, 0.04, 0.03, 0.23, 0.04, 0.04, 0.04, 0.32),
                  nrow = length(stocks), ncol = length(stocks), byrow = FALSE)
admix.m
#>
        [,1] [,2] [,3]
#> [1,] 0.23 0.03 0.04
#> [2,] 0.03 0.23 0.04
#> [3,] 0.04 0.04 0.32
## Age- and stock-dependent survival
ageStockMort \leftarrow matrix(c(0.47, 0.37, 0.27, rep(0.23, 97),
                          0.45, 0.35, 0.25, 0.20, rep(0.22, 96),
             0.45, 0.3, 0.3, 0.19, rep(0.2, 96),
                       ncol = length(stocks), nrow = 100)
head(ageStockMort)
        [,1] [,2] [,3]
#> [1,] 0.47 0.45 0.45
#> [2,] 0.37 0.35 0.30
#> [3,] 0.27 0.25 0.30
#> [4,] 0.23 0.20 0.19
#> [5,] 0.23 0.22 0.20
#> [6,] 0.23 0.22 0.20
## Sex-specific maturity curves
maleCurve \leftarrow c(0,0,0,0.1,0.5,0.8,0.85,0.9,0.95,rep(1, 91))
femaleCurve \leftarrow c(0,0,0.5,0.9,0.95,rep(1,95))
## maleCurve and femaleCurve should both be long enough that no individuals
## will outlive the curve.
head(maleCurve)
#> [1] 0.0 0.0 0.0 0.1 0.5 0.8
head(femaleCurve)
#> [1] 0.00 0.00 0.50 0.90 0.95 1.00
```

2.3 Checking population growth rates with the new parameters

Now, what's going to happen with these subpopulations, if we run with those parameters?

2.4 Running the simulation

Now we just run the population simulator, as we did for the simple population, but with a couple of extra things to specify. Let's give it 100 years.

```
for (k in 1:100) {
    ## very rarely, switch some males to females
    indiv <- sexSwitch(indiv = indiv, direction = "MF", prob = 1e-04)</pre>
    ## move animals according to the markovian matrix we set up before
    indiv <- move(indiv = indiv, moveMat = admix.m)</pre>
    ## mate animals using the age-specific, sex-specific curves we set up before
    indiv <- altMate(indiv = indiv, batchSize = 1.6, type = "ageSex", maleCurve = maleCurve,</pre>
                      femaleCurve = femaleCurve, year = k)
    ## kill animals on the basis of their age and stock, as set up before
    indiv <- mort(indiv = indiv, year = k, type = "ageStock", ageStockMort = ageStockMort)</pre>
    if(k \% 10 == 0) {
        archive <- archive_dead(indiv = indiv, archive = archive)</pre>
        indiv <- remove_dead(indiv = indiv)</pre>
        cat( sprintf( '\rIteration %i complete', k))
    ## occasionally sample from the population and do some clean-up. And report on progress.
    if(k %in% c(94:100)) {
    indiv <- capture(indiv, n = 40, fatal = TRUE, year = k)</pre>
    indiv <- birthdays(indiv = indiv)</pre>
#> Iteration 10 completeIteration 20 completeIteration 30 completeIteration 40 completeIteration 50 com
archive <- rbind(archive, indiv)</pre>
indiv <- archive ## merge 'indiv' and 'archive', since they were only separated for speed.
```

2.5 Looking up relationships between pairs of animals

Now that the simulation is finished, examining kin relationships is the nearly same as the simple scenario. The only difference comes from the fact that we we integrated multiple years of sample-capture into the simulation, so we don't need to call capture() as a separate operation.

```
## look up each animal's ancestors and look for shared ancestors between each
## pair of sampled animals:
pairs <- findRelativesPar(indiv = indiv, sampled = TRUE, nCores = 2)
   Sample. Year Freq
#> 1
             94
                 40
#> 2
             95
                  40
#> 3
             96
                 40
             97 40
#> 4
#> 5
             98
                  40
#> 6
             99
                  40
#> 7
            100
                  40
#> [1] "parents found at 2024-05-09 15:26:46.155541"
#> [1] "grandparents found at 2024-05-09 15:26:46.476692"
#> [1] "great-grandparents found at 2024-05-09 15:26:47.122024"
#> [1] "great-great-grandparents found at 2024-05-09 15:26:48.449955"
#> [1] "great-great-great-grandparents found at 2024-05-09 15:26:50.909693"
#> [1] "great-great-great-great-grandparents found at 2024-05-09 15:26:55.714697"
#> 1000 of 39060 comparisons2000 of 39060 comparisons3000 of 39060 comparisons4000 of 39060 comparisons
POPs <- pairs[pairs$OneTwo == 1,] ## Parent-Offspring pairs
GGPs <- pairs[pairs$OneThree == 1,] ## Grandparent-Grandoffspring pairs
```

```
HSPs <- pairs[pairs$TwoTwo == 1,] ## Half-sibling pairs</pre>
FSPs <- pairs[pairs$TwoTwo == 2,] ## Full Sibling pairs (self-comparisons
## are automatically excluded)
FCPs <- pairs[pairs$ThreeThree == 2 & pairs$TwoTwo != 1,] ## Full Cousin pairs
## look at the number of shared ancestors at each ancestral
## generation, for one of the half-sibling pairs.
lookAtPair(HSPs[1,])
#> Self Par GP G2P G3P G4P G5P
#> Self . . . . . . .
#> Par
       . 1 . . . .
#> GP
        . . 2 .
#> G2P
        . . . 4
        . . . . 8 . 1
#> G3P
#> G4P
        . . . . . . 16 1
         . . . 1 1 1 33
#> G5P
relatives <- namedRelatives(pairs) ## shows the number of pairs of each relationship type
#> POPs GGPs dGGPs G4Ps dG4Ps G6Ps dG6Ps HSPs FSPs HTPs FTPs HCPs FCPs GHCPs GFCPs ORCs
#> 1 9 11 0 4 0 0 0 25 1 63 0 116 9 74 3 34468
```

3 Addenda

3.1 A note on mark-dependent survival or movement

It is possible to simulate mark-dependent survival or movement by working on subsets of the 'indiv' matrix within the main simulation loop, and applying different mortality or movement operations to each subset. Note that if mate(), altMate(), birthdays(), etc., are run on a subset of the population, the operation will only affect members of that subset. In the case of subsets for marked and unmarked individuals, this would imply that marked animals only mate with other marked animals, and *vice versa*. It is important to ensure that a combined indiv object is available for any operations that affect the whole population, or to repeat each operation for each subset.

```
indiv <- makeFounders(stocks = c(1))</pre>
ageMort <- c(0.305, rep(0.2, 100)) ## age-specific mortality is 0.305 for first-years,
## 0.2 for all older age-classes.
for (y in 1:60) {
    indiv <- altMate(indiv, firstBreed = 2, batchSize = 0.9, year = y)</pre>
    ## 'mate' happens first, affecting the whole population
    indiv \leftarrow capture(indiv, n = 5, year = y, fatal = FALSE)
    indiv_unmarked <- indiv[is.na(indiv$SampY),] ## all the unmarked animals</pre>
    indiv_marked <- indiv[!is.na(indiv$SampY),] ## all the marked animals
    indiv_unmarked <- mort(indiv_unmarked, year = y, type = "age", ageMort = ageMort)</pre>
        ## normal mort for unmarked animals
    indiv_marked <- mort(indiv_marked, year = y, type = "age", ageMort = ageMort*2)</pre>
        ## double mort for marked animals
    indiv <- rbind(indiv unmarked, indiv marked)</pre>
        ## stick them back together and proceed as normal
    rm(indiv marked, indiv unmarked) ## clean up
    indiv <- birthdays(indiv)</pre>
}
```

3.2 A note on custom functions in fishSim

The objects used in fishSim are deliberately kept simple, to encourage hacking wherever hacking is useful. To that end, most functions in fishSim both input and output a data.frame that we have called indiv throughout this vignette.

If your species of interest has a life-history not readily captured by the existing fishSim functions, you may wish to write a custom function for just that step in the simulation. For instance, you may have a species in which each female mates with a handful of males in the year preceding each breeding season, and then uses stored sperm from these mates to fertilise a clutch of eggs just before giving birth. Let's call this the 'sperm storage' scenario. The sperm storage scenario can't be coded using the built-in mate or altMate functions - in those functions, each mating event either has single paternity (i.e., all offspring produced by each female have the same father) or completely random paternity (i.e., the father of each offspring is randomly selected from among all mature males in the same stock), or, using mate, within-clutch single paternity but potentially multiple clutches (each with a different father). In the situations handled by mate and altMate, the expected number of offspring for a female is linearly related to her number of mates, which doesn't fit with our 'sperm storage' scenario.

To get around this problem, we will need to define a custom mate-like function, that inputs an indiv-like data.frame, generates new offspring the way the scenario demands, and outputs an indiv-like data.frame to be used by the other functions in fishSim. Such a function could look like this:

```
# A custom myMate function
# parameter 'indiv' is a standard indiv frame, as from makeFounders()
# parameter 'batchSize' sets the number of offspring per breeding female
# such that the number of offspring ~Poisson(lambda = batchSize)
# parameter 'breedProb' is the probability that a mature female will
# breed this in this mating event
# parameter 'maturityAge' is the knife-edge age at maturity, for both
# males and females
# parameter 'year' is the year. It is used to set the $BirthY for new
# recruits
# myMate uses a zero-truncated Poisson distribution to determine the
# number of mates for each female that breeds. Parameter 'meanMates'
\# sets the T parameter for that distribution
myMate <- function(indiv, batchSize, breedProb, maturityAge, year, meanMates) {</pre>
   library(ids)
    ## select mature females and males at current time-step
   matureFemales <- indiv[indiv$Sex == "F" & indiv$AgeLast >= maturityAge & is.na(indiv$DeathY) ,]
   matureMales <- indiv[indiv$Sex == "M" & indiv$AgeLast >= maturityAge & is.na(indiv$DeathY),]
    ## select subset of mature females that will breed (given breedProb)
    iBreed_F <- matureFemales[sample(1:nrow(matureFemales), size = nrow(matureFemales)*breedProb),]</pre>
    iBreed M <- matureMales</pre>
    ## if no mature females or males available, don't add new individuals to the population
    if(nrow(iBreed_F) == 0 | nrow(iBreed_M) == 0) { return(indiv) }
    clutchSize <- rpois(nrow(iBreed_F), batchSize) # how many offsprings per breeding females?</pre>
   nMates <- rTruncPoisson(nrow(iBreed_F), T = meanMates) # how many mates per breeding females?</pre>
   mates <- lapply(nMates, function(i) sample(iBreed_M$Me, i, replace = FALSE)) # draw mates for each
    # and then assign fathers to each new recruit based on mates identified previously
    # (note each item in the list corresponds to a unique female)
   dads <- lapply(1:length(mates), function(i) sample(mates[[i]], clutchSize[[i]], replace = TRUE))</pre>
    # now set-up table of recruits assembling all variables
   recruits <- data.frame(Me=uuid(sum(clutchSize), drop_hyphens = TRUE), # unique ID
                           Sex=sample(c("M","F"), sum(clutchSize), prob = c(0.5,0.5), replace = TRUE),
                           Mum=rep(iBreed_F$Me, clutchSize), # add mum vector that match litter sizes a
                           Dad=unlist(dads), # unlist dads (length should match new recruits number)
                           BirthY=year, # rest of meta-data is simple for recruits. birth year
                           DeathY=NA, # not dead yet
                           Stock=1, # single stock for now
                           AgeLast=0, # recruits start at age 0
```

```
SampY=NA) # not sampled yet

outs <- rbind(indiv, recruits)
return(outs)
}</pre>
```

With myMate defined, we can go on to write a simulation using the other fishSim tools, as in this stripped-down example:

```
indiv <- makeFounders(stocks = c(1))</pre>
ageMort <-c(0.305, rep(0.2, 100)) ## age-specific mortality as in the
## first, 'simple' example
for (y in 1:10) {
    indiv <- myMate(indiv = indiv, batchSize = 3, breedProb = 1,</pre>
                     maturityAge = 4, year = y, meanMates = 3)
    indiv <- mort(indiv, year = y, type = "age", ageMort = ageMort)</pre>
    indiv <- birthdays(indiv)</pre>
   if(y %in% c(6:10)) {
        indiv \leftarrow capture(indiv, n = 40, fatal = FALSE, year = y)
}
pairs <- findRelativesPar(indiv = indiv, sampled = TRUE, nCores = 2)</pre>
#> Sample.Year Freq
#> 1
              6
                 38
#> 2
              7
                  40
#> 3
              8
                 39
#> 4
              9
                 40
#> 5
             10
                  40
#> [1] "parents found at 2024-05-09 15:27:07.804099"
#> [1] "grandparents found at 2024-05-09 15:27:07.979331"
#> [1] "great-grandparents found at 2024-05-09 15:27:08.18247"
#> [1] "great-great-grandparents found at 2024-05-09 15:27:08.396933"
#> [1] "great-great-great-grandparents found at 2024-05-09 15:27:08.638873"
#> [1] "great-great-great-great-grandparents found at 2024-05-09 15:27:08.87684"
#> 1000 of 19306 comparisons2000 of 19306 comparisons3000 of 19306 comparisons4000 of 19306 comparisons
namedRelatives(pairs)
#> POPs GGPs dGGPs G4Ps dG4Ps G6Ps dG6Ps HSPs FSPs HTPs FTPs HCPs FCPs GHCPs GFCPs ORCs
          5 0 0 0 0 0 43 80 88 1508 109 2524
#> 1 12
                                                                           7 2387 12543
```