

Genetics and population analysis

POPdemog: visualizing population demographic history from simulation scripts

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Abstract

Summary: We present POPdemog, an R package which converts coalescent simulation program input parameters into a visual representation of the demographic model. This package is useful for preparing figures, for checking that demographic simulation parameters have been correctly specified, and for understanding demographic models that other researchers have used to simulate genetic data. The POPdemog package supports the ms, msa, msHot, MaCS, msprime, scrm and Cosi2 programs, and includes options for customizing the output figures.

Availability and implementation: The POPdemog package and its tutorial can be freely downloaded from <https://github.com/YingZhou001/POPdemog>.

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Supplementary information: [Supplementary data](#) are available at *Bioinformatics* online.

1 Introduction

Many simulation tools have been developed to support population and evolutionary genetic studies, and many of these programs are able to generate genetic data under complex demographic models (Hoban *et al.*, 2012). Often the demographic models include several populations with time-varying population sizes and multiple migration events. In this case, the large number of demographic parameters makes it difficult to understand the demographic model directly from the simulation program command line (see [Box 1](#)).

We have developed the POPdemog R package to capture the complex demographic information from simulation scripts or parameter files, and output the demographic model as a figure ([Fig. 1](#)). The main output figure shows the changes in population sizes and migrations events. When multiple migrations happen at a particular time, additional figures can be generated to give fine-scale representation of the overlapping migration events. Currently, POPdemog supports the input to the ms and msa (Hudson, 2002), msHot (Hellenthal and Stephens, 2007), MaCS (Chen *et al.*, 2009), scrm (Staab *et al.*, 2015), msprime (Kelleher *et al.*, 2016) and Cosi2 (Shlyakhter *et al.*, 2014) programs.

Box 1. MaCS command (Vernot *et al.*, 2016) for modified Tennessen model (Tennessen *et al.*, 2012):

```
macs 2025 15000000 -i 10 -r 3.0e-04 -t 0.00069 -T -I 4 10
1006 1008 1 0 -n 4 0.205 -n 1 58.00274 -n 2 70.041 -n 3
187.55 -eg 0.9e-10 1 482.46 -eg 1.0e-10 2 570.18 -eg 1.1e-
10 3 720.23 -em 1.2e-10 1 2 0.731 -em 1.3e-10 2 1 0.731
-em 1.4e-10 3 1 0.2281 -em 1.5e-10 1 3 0.2281 -em 1.6e-10
2 3 0.9094 -em 1.7e-10 3 2 0.9094 -eg 0.007 1 0 -en
0.007001 1 1.98 -eg 0.007002 2 89.7668 -eg 0.007003 3
113.3896 -eG 0.031456 0 -en 0.031457 2 0.1412
-en 0.031458 3 0.07579 -eM 0.031459 0 -ej 0.03146 3 2 -en
0.0314601 2 0.2546 -em 0.0314602 2 1 4.386 -em
0.0314603 1 2 4.386 -eM 0.0697669 0 -ej 0.069767 2 1 -en
0.0697671 1 1.98 -en 0.2025 1 1 -ej 0.9575923 4 1 -em
0.06765 2 4 32 -em 0.06840 2 4 0
```

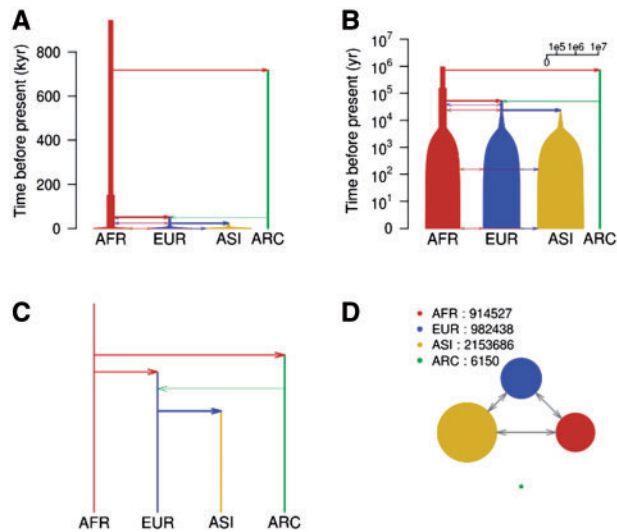


Fig. 1. Visual representations of demography in MaCS simulation script for a modified Tennesen model (Box 1) (Vernot *et al.*, 2016). AFR: Africans; EUR: Europeans; ASI: Asians; ARC: Archaic humans. (A) Use a time unit of 1000 years and scale the population size logarithmically. (B) Zoom in on the recent events and scale the population size logarithmically. (C) ‘topology’ of migrations with rates ≥ 0.001 per generation. (D) Migrations and population sizes 1000 years ago, with population sizes scaled linearly. A–C are generated by the *PlotMS()* function, D is generated by the *PlotMig()* function

Table 1. Options for the parameters controlling scaling of population size and event time

size.scale	‘log’	Scale the population size logarithmically, with the base parameter log.base [default]
	‘linear’	Scale population size linearly, with scale parameter linear.scale
	‘topology’	Ignore population size and event times, output only the topological relationship
time.scale	‘4Ne’	Set time unit to 4Ne [default]
	‘kyear’	Set time unit to 1000 years
	‘generation’	Set time unit to generations
	‘years’	Set time unit to years
	‘log10year’	Scale time with function ‘log ₁₀ (years before present)’

Note: Further details can be found in the program documentation and the tutorial file.

2 Input and output

The input to our program is the command line or parameter file for invoking the simulation program, the simulation program name, and the baseline effective population size. Many coalescent-based simulation programs allow for arbitrary scaling of simulation parameters relative to an unspecified baseline effective population size; thus the effective population size is required by our program in order

to adjust the scale. We also provide options to customize the appearance of the output figure such as the time scale, branch positions, branch colors and branch widths for each population. Options for controlling scaling of time and population size are described in Table 1. For example, setting size.scale = ‘log’ shows population sizes on a log scale, which is helpful when population size has undergone exponential growth (Fig. 1A), and setting time.scale = ‘log10year’ allows more detailed visualization of recent events (Fig. 1B). Setting size.scale = ‘topology’ gives an overview of the relationships among the simulated populations ignoring event times and population sizes (Fig. 1C), which permits demographic events to be displayed in time order even when the time between events is extremely small. There are also options for adjustment of branch positions which can minimize the number of crossings of migration arrows and population branches. One can also plot the population sizes and migrations at a particular point in time (Fig. 1D). The scripts used to run the POPdemog program and generate Figure 1 are provided in the Supplementary Information. The POPdemog program includes an online tutorial which contains examples for different simulators and demographic models, as well as an example showing how migration plots can be overlaid onto a world map.

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Conflict of Interest: none declared.

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