# The Demography of Kinship (3)

### Kinship microsimulations

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European Doctoral School of Demography 2022-23 26 April 2023



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### Structure of this talk

1. Principles of demographic microsimulation

2. Implementations

### What is a simulation?

### In groups, discuss:

- What is a simulation?
- 2 What is a microsimulation?
- 3 What is a demographic microsimulation?
- What is the difference between a demographic microsimulation and an agent-based model?

Principles of demographic microsimulation

## General logic of demographic microsimulations

- Model individual-level demographic behaviour using set of rules
- Manufacture individual-level data
- Simple inputs
- 4 Different alternatives:
  - SOCSIM
  - ► CAMSIM
  - R/python
  - Agent-based modelling

# Expected number of children<sup>1</sup>

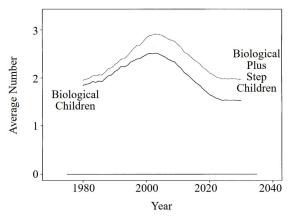


Figure 1. Living biological children and stepchildren, US whites aged 70–85. Outputs of Berkeley SOCSIM simulations, average of 40 replications.

¹Wachter, K. W. (1997). Kinship resources for the elderly. *Philosophical Transactions of the Royal Society of London. Series B: Biological Sciences*, 352(1363), 1811–1817. https://doi.org/10.1098/rstb.1997.0166 ← ▼ ト ← ▼ ト

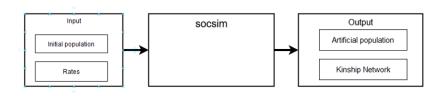
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### Demographic microsimulations with SOCSIM

- 1 A stochastic microsimulation platform, 1970s at UC Berkeley
- Starts with initial population
- 3 Each simulated individual experiences specific rates every month (e.g., mortality, fertility, marriage)
- 4 Keeps track of kinship ties to create a full genealogy
- **5** UC Berkeley SOCSIM User Manual<sup>2</sup>

 $<sup>^2\</sup>mathsf{Mason, C. (2016). SOCSIM Oversimplified. UC Berkeley.} \\ \mathsf{https://lab.demog.berkeley.edu/socsim/CurrentDocs/socsimOversimplified.pdf:} \ \square \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \\ \mathsf{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?} \ \lor \land \ \textcircled{?}$ 

# Are we living in a simulation?<sup>3</sup>



# How does SOCSIM work? (1)

- 1 Every person is an individual object
- 2 The population is a long list of persons
- When a birth happens, a new person is created and appended to that list
- 4 At the start of the simulation (or after an event), every person gets a "next event"

# How does SOCSIM work? (2)

- **5** Events can be marriage, divorce, childbirth, death, etc.
- 6 Time increments in discrete timesteps
- In every time step, all events scheduled for this time "happen"
- **3** A simulation can consist of 1 or more "segments", every segment can have different rates
- At the end of the simulation, socsim writes the population into output files

# Attributes of simulated individuals (1)

Every SOCSIM-person has the following parameters:

- 1 status: dead/alive
- 2 sex (female or male)
- marital status (single, married, divorced, cohabiting, widowed)
- 4 parity (total number of children born to a woman)

# Attributes of simulated individuals (2)

- **5 group** (number between 0 and 63. Can be used to simulate different groups/countries/towns.... with transition rates between groups)
- 6 age (in months, changes with time steps, starts at 0. Max age is 200 years)
- 7 next event

### Possible events

- birth/childbirth: creation of a new person with age 0 and parameters that are random (sex) or derived (marital status=single at birth, ...)
- 2 death: according to mortality rates. These are specific to parameters of the individual persons (age, gender, groups, parity, marital status)
- **3 marriage**: the most complicated event, because it involves 2 persons. Three marriage market systems:
  - Marriage rates for both males and females
  - Marriage rates only for females males just get picked
  - 3 No marriage rates; Marriage just before a childbirth to an unmarried mother
- divorce

### Running a SOCSIM simulation

```
## init new.opop|init new.omar|init new.opox|sim results socsim.sup 300 /result.pyr|sim results
## fix pop pointers..
## Starting month is 601
## Initial size of pop 8000 (living: 8000)
  -----aa3s-----aa32New events generated for all living persons
## ------b1month: 700 PopLive: 9414 Brths: 16 Dths:
                                                           0 Mrgs: 11 Dvs: 0 Mq: 3728 Fq:0
## month: 800 PopLive: 10926 Brths: 12 Dths:
                                            1 Mrgs: 6 Dvs: 0 Mg: 3890 Fg:0 til: 0.5 til:
## month: 900 PopLive: 12260 Brths: 14 Dths:
                                              0 Mrgs: 4 Dvs: 0 Ma: 4031 Fa:0 til: 0.7 til:
## month: 1000 PopLive: 13397 Brths: 9 Dths:
                                              2 Mrgs:
                                                       4 Dvs:
                                                              0 Ma: 4134 Fa:0 ti1: 0.8 ti2:
## month: 1100 PopLive: 14172 Brths: 16 Dths:
                                              6 Mrgs: 6 Dvs:
                                                              0 Mq: 4135 Fq:0 ti1: 1.0 ti2:
## month: 1200 PopLive: 14518 Brths: 13 Dths:
                                             11 Mrgs: 6 Dvs: 0 Mg: 4000 Fg:0 til: 1.2 til:
## month: 1300 PopLive: 14323 Brths:
                                                               0 Ma: 3891 Fa:0 ti1: 1.4 ti2:
                                   14 Dths:
                                              20 Mrgs: 4 Dvs:
                                                              0 Mg: 3746 Fg:0 til: 1.6 til:
## month: 1400 PopLive: 13816 Brths:
                                   13 Dths:
                                             15 Mrgs:
                                                       4 Dvs:
## month: 1500 PopLive: 13330 Brths: 11 Dths:
                                             11 Mrgs: 5 Dvs:
                                                              0 Mq: 3679 Fq:0 ti1: 1.8 ti2:
## month: 1600 PopLive: 12944 Brths:
                                    10 Dths:
                                             15 Mrgs:
                                                       4 Dvs:
                                                               0 Mg: 3593 Fg:0 ti1: 2.0 ti2:
## month: 1700 PopLive: 12525 Brths:
                                    10 Dths:
                                             20 Mrgs: 5 Dvs:
                                                               0 Mg: 3436 Fg:0 ti1: 2.1 ti2:
## month: 1800 PopLive: 12009 Brths: 10 Dths: 16 Mrgs: 7 Dvs: 0 Ma: 3275 Fa:0 til: 2.3 til:
##
##
## Socsim Main Done
## Socsim Done.
```

### At the end of a simulation

- 1 Virtual population written to output files
  - **1 opop**: every person that ever lived and their attributes
  - 2 omar: every marriage and their attributes
- 2 text files, can then be read and analysed in R

### SOCSIM output objects

### SOCSIM output objects

```
head(opop)
     pid fem group nev dob mom pop nesibm nesibp lborn marid mstat
                                                                        dod
                                                                               fmult
## 1
                    65 1009
                                                  0 26579
                                                           1005
                                                                     4 1593 1.767931
## 2
                    65 1179
                                                              0
                                                                     1 2062 0.000000
## 3
                    65
                        956
                                                  0 26205
                                                            625
                                                                     4 1795 0.706973
## 4
                    65
                        641
                                                                     1 1349 0.000000
## 5
                    65 1015
                                                  0 25201
                                                           2810
                                                                     3 1938 0.000000
## 6
                    65
                        797
                                                  0 22412
                                                            526
                                                                     3 1555 1.581888
```

#### head(omar)

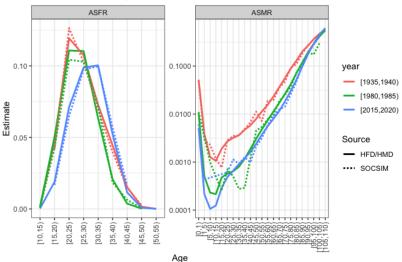
```
wpid hpid dstart dend rend wprior hprior
##
     mid
##
          4473 11649
                        1201 1810
                                     3
                                             0
                                                    0
          3418
               1865
                        1201 1358
##
                                     3
##
          3569 11595
                        1201 1660
                                            0
       4 17771 3043
                        1201 1451
## 4
                                     3
## 5
          5388 17305
                        1201 1765
                                                    0
## 6
       6 11717
                  33
                        1201 1402
                                                    0
```

## Input data for SOCSIM microsimulation

- User-provided
  - 1 Initial population
  - 2 Age-specific fertility rates
  - **3** Age-specific mortality rates
- Optional or default parameters available
  - Marriage transition rates
  - 2 Model for marriage market
  - 3 Other transition rates
  - Other parameters (inheritance of fertility, etc.)

## Discuss: comparison input-output rates<sup>4</sup>

Age-Specific Fertility and Mortality rates in the USA (1933-2020) retrieved from HFD, HMD and a SOCSIM simulation



<sup>&</sup>lt;sup>4</sup>Liliana P. Calderón-Bernal,

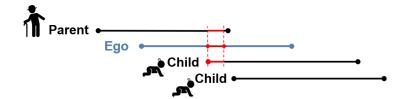
# Break

# **Implementations**

### Demographic sandwiching

We define a person as 'sandwiched' if they simultaneously have:

- 1 one child younger than 15 years old, and
- 2 one older parent or parent in-law within 5 years from death



# Measuring the 'sandwich generation' around the world<sup>5</sup>

### Research question

Is the 'sandwich generation' more prevalent among the ageing populations of the Global North?

- 1 Methods: [redacted]
- ② Data: [redacted]
- Results: unequal geographic distribution of demographic sandwiching

### **Discuss**

- 1 How would you go about answering this question?
- Which methods/data would you use?
- 3 What problems/limitations do you foresee?

# Measuring the 'sandwich generation' around the world<sup>6</sup>

### Research question

Is the 'sandwich generation' more prevalent among the ageing populations of the Global North?

- Methods: demographic microsimulation in SOCSIM
- 2 Data: calibrated against 2019 UNWPP estimates and projections
- Results: unequal geographic distribution of demographic sandwiching

<sup>&</sup>lt;sup>6</sup>Alburez-Gutierrez, D., Mason, C., & Zagheni, E. (2021). The "Sandwich Generation" Revisited: Global Demographic Drivers of Care Time Demands. *Population and Development Review*, 47(4), 997–1023 □ → ← ⑤ → ← ② → ← ○ → ←

### Anatomy of a demographic sandwich

S(a) is the probability that a woman aged a has a child younger than 15 and a parent within 5 years of death:

$$S(a) = \underbrace{\left(1 - \prod_{x=1}^{15} [1 - m(a - x)]\right)}_{\text{fertility risk in the}} \times \underbrace{M_1(a)}_{\text{Prob. ego's mother}} \times \underbrace{\left(1 - \frac{M_1(a + 5)}{M_1(a)}\right)}_{\text{Prob. ego's mother}}$$

where the probability of having a living mother in a stable population is:

$$M_1(a) \approx \frac{I(\mu + a)}{I(\mu)}.$$

## (1) Longer and healthier life

S(a) is the probability that a woman aged a has a child younger than 15 and a parent within 5 years of death:

$$S(a) = \underbrace{\left(1 - \prod_{x=1}^{15} [1 - m(a - x)]\right)}_{\text{fertility risk in the}} \times \underbrace{M_1(a)}_{\text{Prob. ego's mother}} \times \underbrace{\left(1 - \frac{M_1(a + 5)}{M_1(a)}\right)}_{\text{Prob. ego's mother}}$$
Prob. ego's mother dies in 5 years

where the probability of having a living mother in a stable population is:

$$M_1(a) \approx \frac{I(\mu + a)}{I(\mu)}$$
.

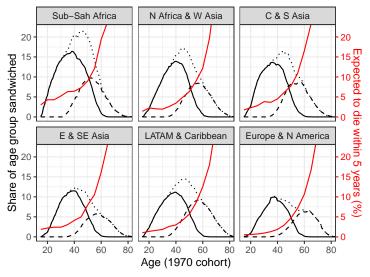
# (2-3) Reduced fertility and later childbearing

S(a) is the probability that a woman aged a has a child younger than 15 and a parent within 5 years of death:

$$S(a) = \underbrace{\left(1 - \prod_{x=1}^{15} [1 - m(a - x)]\right)}_{\text{fertility risk in the} \atop \text{15 years preceding age a}} \times \underbrace{M_1(a)}_{\text{Prob. ego's mother}} \times \underbrace{\left(1 - \frac{M_1(a + 5)}{M_1(a)}\right)}_{\text{Prob. ego's mother dies in 5 years}}$$

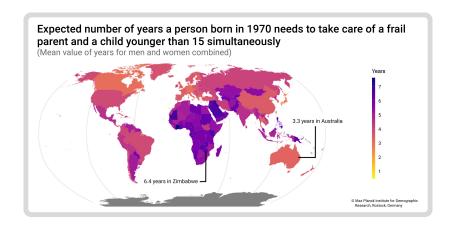
where the probability of having a living mother in a stable population is:

$$M_1(a) pprox rac{I(\mu+a)}{I(\mu)}$$
.



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### Sandwichness around the planet



## rsocsim: demographic microsimulation in R

- ► Efficient R-language implementation
- Runs in any OS
- Built-in functions
- ► https://github.com/MPIDR/rsocsim
- ► More in the lab session...





Tom Theile



Liliana P. Calderón-Bernal



Mallika Snyder



Emilio Zagheni

### Models and simulations

#### Discuss:

- Compare and contrast model- and simulation-based approaches to study kinship
- 2 What are the relative advantages or each approach?
- 3 When would you chose one over the other?

### Pros and cons of SOCSIM microsimulation

### Strengths

- Keep track of kinship ties
- 2 Full genealogies
- 3 Low data requirements
- 4 Flexible and adaptable states

### Limitations

- Not real populations
- 2 Correlated input rates
- 3 Computing power

## When to use demographic microsimulations?

- ① Complex inter-generational processes
- 2 Trace ancestry or relatedness
- 3 Improve the interval validity of simulations
  - Calibration
  - Comparing simulations to ground-truth
  - Methodological triangulation