# Age-structured and stage-structured population models







# Today's topics

Introduction

2 Matrix Models

3 Reproductive value

4 Stage-structured models

Birth and death rates usually depend on age.

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Some age classes contribute more to population growth than others.

These facts have important management implications.

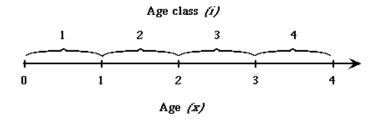
# Matrix models vs life tables

### Matrix models

Age is discrete

### Life tables

Age is continuous



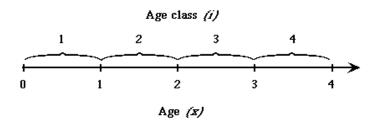
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#### Life tables

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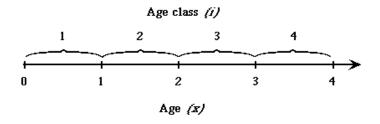
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- Each age class can have its own vital rates

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•  $n_{i,t}$  is abundance of age class i in year t

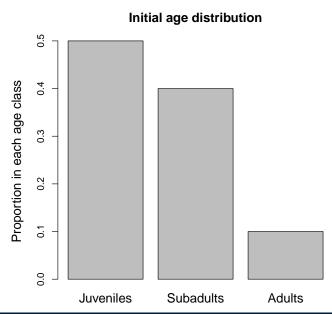
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- Suppose initial abundance in the 3 age classes is:
  - $ightharpoonup n_{1,0} = 50$  (Age class 1, juveniles)
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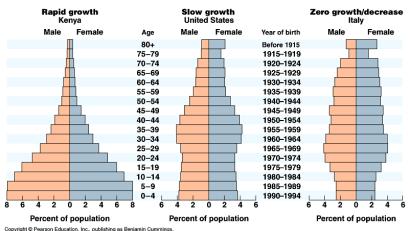
An age distribution describes the proportion of individuals in each age class

# AGE DISTRIBUTION



### Age distribution

# Declining populations have relatively more old individuals than growing populations



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### Three age class example

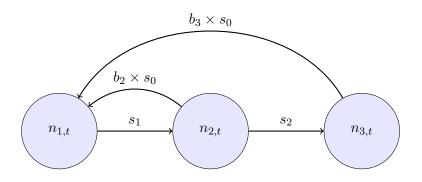
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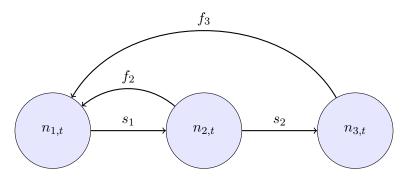
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- ullet Depends on age class survival rates  $s_i$
- And age class birth rates  $b_i$
- Fecundity is often defined as the product of birth rate and offspring survival,  $f_i = b_i \times s_0$



# HOW DOES THIS POPULATION GROW?

Age class	Equation
1	$n_{1,t+1} = n_{1,t} \times f_1 + n_{2,t} \times f_2 + n_{3,t} \times f_3$

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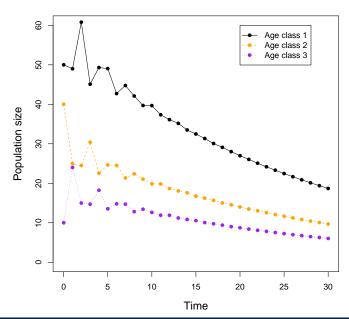
In stage-structured models, animals can stay in a class for more than one time interval.

### EXAMPLE

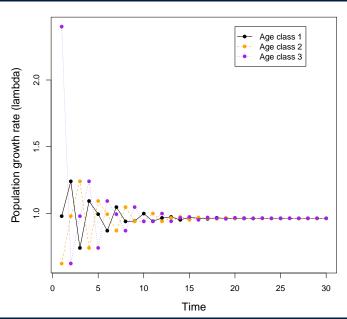
Let's choose values of  $s_i$  and  $f_i$ 

Age class	Initial population size	Survival probability	Fecundity rate
	$n_{i,0}$	$s_i$	$f_{i}$
1	50	0.5	0.0
2	40	0.6	0.8
3	10	0.0	1.7

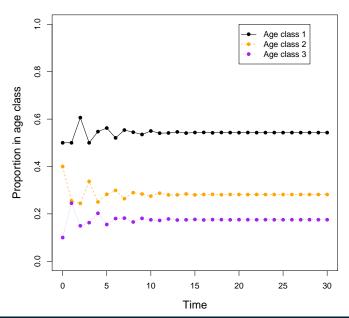
# Population size, $n_{i,t}$



# GROWTH RATES, $n_{i,t+1}/n_{i,t} = \lambda_{i,t}$



# Age distribution, $c_{i,t}$



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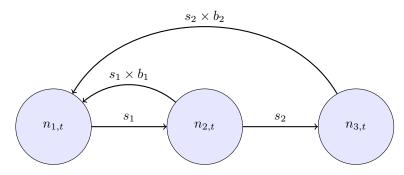
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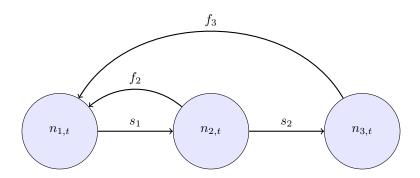
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Asymptotic growth rate is  $\lambda$  (without subscript).

Growth rate at the stable age distribution is the same for all age classes, and it is geometric!

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# MATRIX MODELS

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But, they make it much easier to compute important quantities like  $\lambda$  and reproductive value.

# What is a matrix?

**Definition**: A matrix is a rectangular array of numbers

- Usually denoted by an uppercase, bold letter
- Either square or rounded brackets are used
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Example of a  $3 \times 4$  matrix:

$$\mathbf{A} = \begin{bmatrix} a_{1,1} & a_{1,2} & a_{1,3} & a_{1,4} \\ a_{2,1} & a_{2,2} & a_{2,3} & a_{2,4} \\ a_{3,1} & a_{3,2} & a_{3,3} & a_{3,4} \end{bmatrix}$$

### Leslie Matrix

#### What is it?

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- Fertilities on first row
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#### LESLIE MATRIX

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# Example:

$$\mathbf{A} = \begin{bmatrix} f_1 & f_2 & f_3 & f_4 \\ s_1 & 0 & 0 & 0 \\ 0 & s_2 & 0 & 0 \\ 0 & 0 & s_3 & 0 \end{bmatrix}$$

# How do we use a Leslie matrix?

These two expressions are equivalent:

Age class	Equation
1	$n_{1,t+1} = n_{1,t} \times f_1 + n_{2,t} \times f_2 + n_{3,t} \times f_3$
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AND

$$\mathbf{n}_{t+1} = \mathbf{A} \times \mathbf{n}_t$$

## MATRIX MULTIPLICATION

$$= \begin{bmatrix} a & b & c & d \\ e & f & g & h \\ i & j & k & l \\ m & n & o & p \end{bmatrix} \times \begin{bmatrix} w \\ x \\ y \\ z \end{bmatrix}$$

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### MATRIX MULTIPLICATION AND LESLIE MATRIX

$$\begin{bmatrix} n_{1,t+1} \\ n_{2,t+1} \\ n_{3,t+1} \\ n_{4,t+1} \end{bmatrix} = \begin{bmatrix} f_1 & f_2 & f_3 & f_4 \\ s_1 & 0 & 0 & 0 \\ 0 & s_2 & 0 & 0 \\ 0 & 0 & s_3 & 0 \end{bmatrix} \times \begin{bmatrix} n_{1,t} \\ n_{2,t} \\ n_{3,t} \\ n_{4,t} \end{bmatrix}$$

## REPRODUCTIVE VALUE

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## Reproductive Value

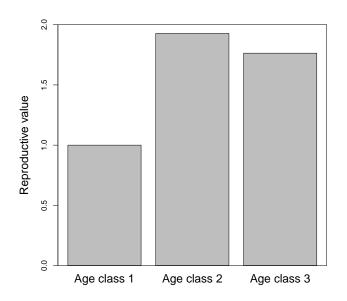
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Depending on survival and fecundity rates, a first-year individual could have a higher or lower reproductive value than a second-year individual.

#### REPRODUCTIVE VALUE FOR PREVIOUS EXAMPLE



#### REPRODUCTIVE VALUE

Sir Ronald Aylmer Fisher was central to the development of the idea of reproductive value.





He was also a terrible person (eugenicist and Nazi sympathizer).

# OTHER IMPORTANT QUANTITIES

#### Net reproductive rate

The expected number of individuals produced by an individual over its lifetime:

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#### Generation time

The time required for a population to increase by a factor of  ${\it R}_{
m 0}$ 

# OTHER PROPERTIES OF THE LESLIE MATRIX<sup>1</sup>

The dominant eigenvalue of A is the growth rate  $\lambda$ .

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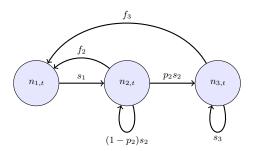
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This example allows for individual to remain in stages 2, 3, and 4 for more than one time period.

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### Summary

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Matrix models are a convenient method used to work with age-structured populations.