# Accounting for Heterogeneity in the Official Austrian Population Projection

**Pauline Pohl, Philip Slepecki** Statistics Austria

Martin Spielauer Austrian Institute of Economic Research (WIFO)

9<sup>th</sup> World Congress of the International Microsimulation Association Vienna, 9<sup>th</sup> January 2024

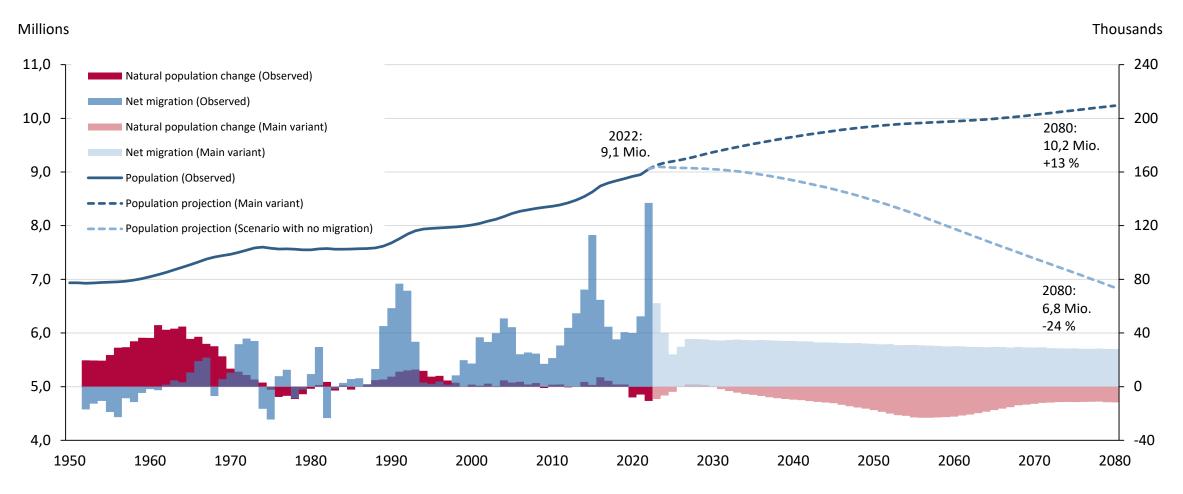
www.statistik.at





Independent statistics for evidence-based decision making

### Motivation Migration drives population growth in Austria



S. STATISTICS AUSTRIA, Population projection 2023.

### Motivation

### Background

- The demographic behavior of migrants will influence the future size and composition of the Austrian population.
- The **foreign-born population is highly diverse**, as evidenced by the variation in emigration risks based on country of birth and length of residence.

### Objectives

- Account for heterogeneity among migrants to improve accuracy and add detail to the official Austrian population projection.
- Incorporate information on **country of birth** and **length of residence** in the projection.

### Methods

- Cluster analysis to group countries of birth based on similarities in emigration patterns.
- Hazard regression, capturing differences in emigration risks based on age, sex, province, country of birth and duration of stay.
- **Dynamic competing risk microsimulation**, incorporating these detailed emigration hazards in the population projection.

## Microsimulation model features

- Dynamic competing risk microsimulation with continuous time
- Case-based
- Simulated events: Births, deaths, migration
- Regional breakdown: Austria and federal provinces (NUTS-2)
- Programming language: Modgen<sup>1</sup>

<sup>1</sup> https://www.statcan.gc.ca/en/microsimulation/modgen/modgen

Administrative (micro) data for the Austrian population, available at Statistics Austria

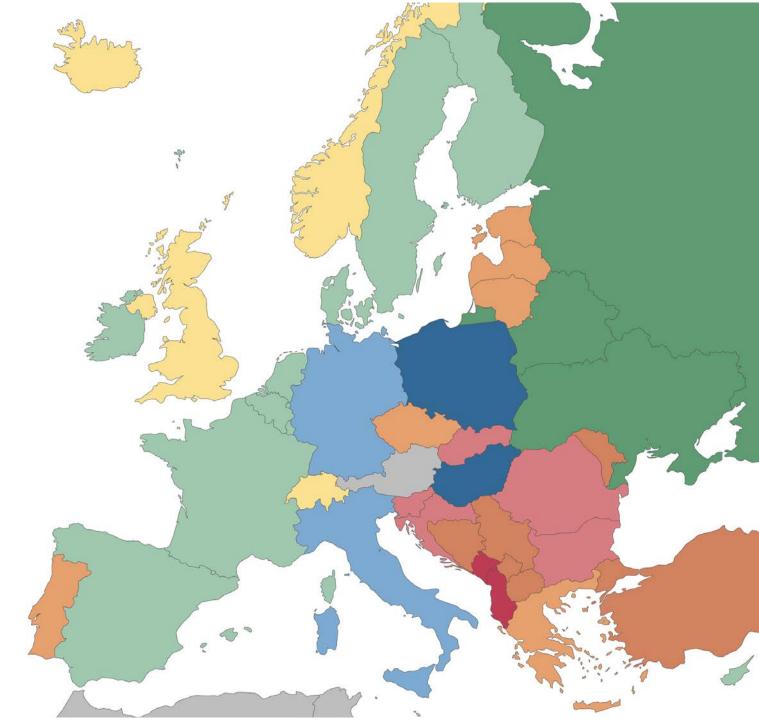
- → Base population: Resident population as of January 1st of the starting year by age, sex, province of residence, duration of residence, country of birth (clustered)
- → Main parameters are derived from Vital Statistics, Migration Statistics and Population Statistics
- → Country clusters are determined using additional data from Asylum Statistics and Register-based Labour Market Statistics



# **Country clusters**

- Administrative data aggregated at country level:
  - age,
  - sex,

- duration of stay,
- % of university students,
- % in active emplyoment,
- % with children,
- applications for asylum and subsidiary protection
- Total of 17 clusters worldwide



## **Emigration hazards**

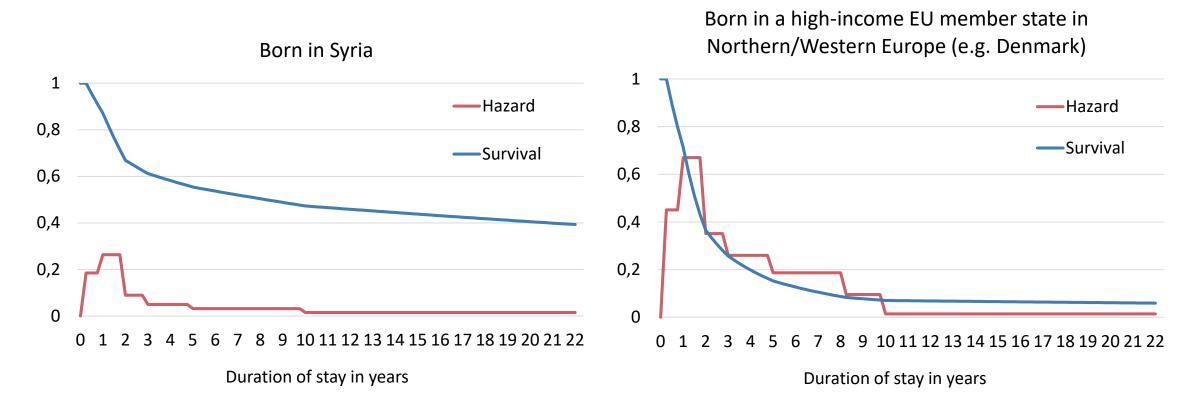
- Estimate piecewise constant hazards for emigration by sex and country cluster
- Input variables: age, federal province of residence, duration of stay

 $\rightarrow$  Does not require much additional data, but more data analysis necessary

 $\rightarrow$  Relevant because emigration patterns differ based on individual characteristics

Differences in emigration behaviour by country of birth and duration of stay

### Example: 18 year old male immigrates to Austria and lives in Vienna



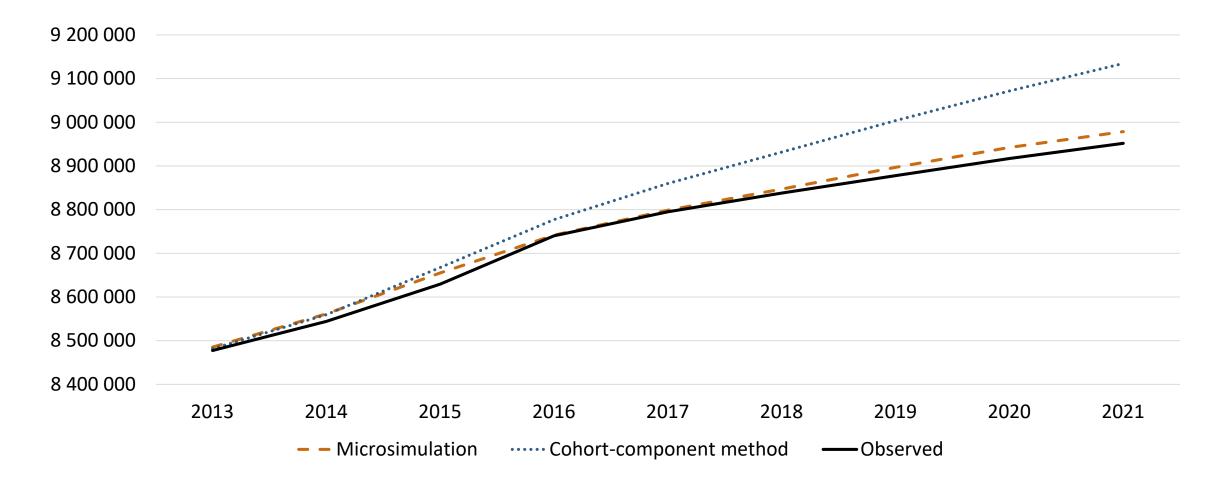
*Hazard*: Rate at which a person emigrates in a given time interval. *Survival*: Proportion of individuals who do not emigrate until a given point in time.

### Model validation

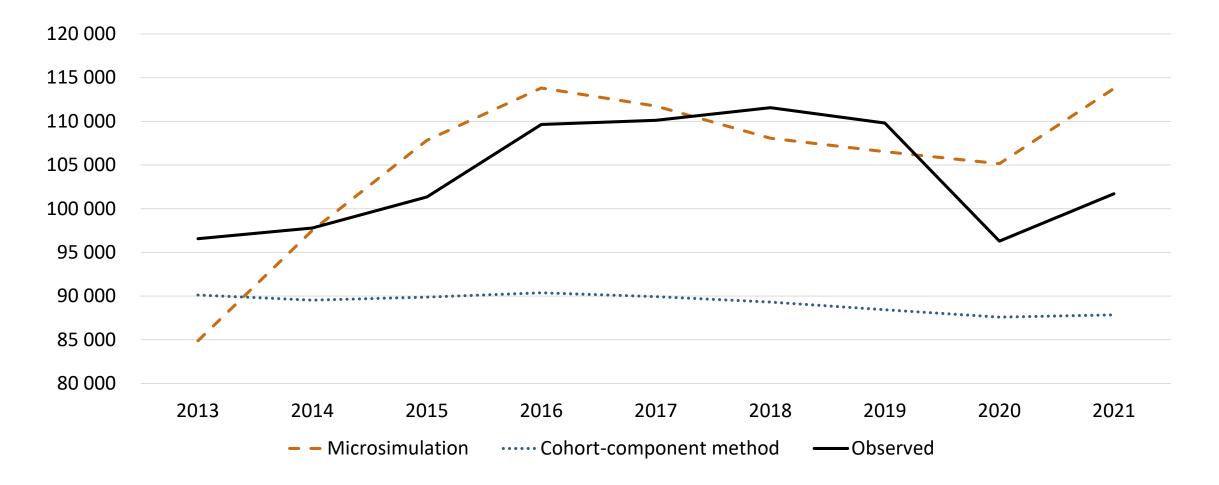
Comparing the cohort-component method with the microsimulation model in an ex-post validation



## Projected and observed population of Austria 2013-2021, based on the cohort-component method vs. the microsimulation model



## Projected and observed emigration from Austria 2013-2021, based on the cohort-component method vs. the microsimulation model



# **Concluding remarks**

- Emigration risks differ by country of birth and decrease with the duration of residence.
- Accounting for these differences impacts the projected number of emigrants as well as the size and composition of the Austrian population.
- Retrospective projection demonstrates the efficacy of the model in capturing emigration patterns, as evidenced by the close alignment with the observed emigration levels from 2013 to 2021.

### For further information please contact:

Pauline Pohl +43 1 71128 8007 pauline.pohl@statistik.gv.at

Philip Slepecki +43 1 71128 7623 philip.slepecki@statistik.gv.at

Martin Spielauer +43 1 798 26 01 246 martin.spielauer@wifo.ac.at



### Modelling scenarios and dynamic processes Example: Refugee migration from Ukraine

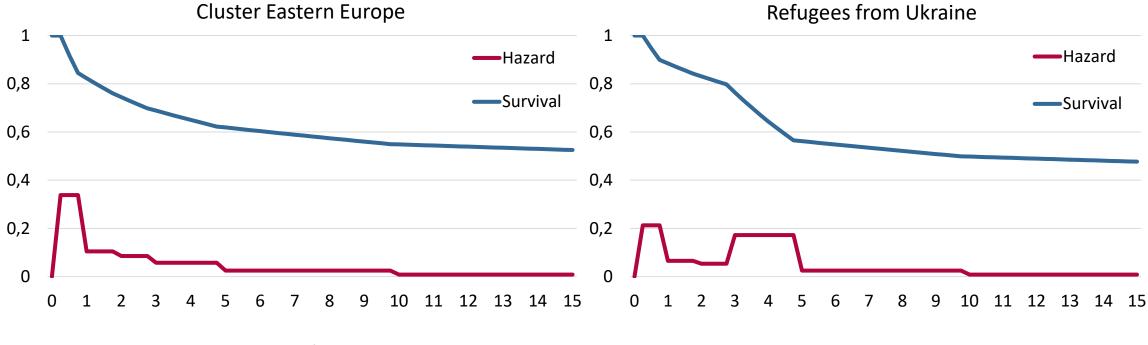
Three phases:

- 1. Increased immigration and reduced emigration
- Increased emigration and family reunification → Inclusion of assumptions about the future immigration of male partners of female Ukrainian refugees based on survey data (UkrAiA Survey<sup>2</sup>)
- 3. Emigration behaviour as before the war, higher immigration in the medium term than before the war due to larger Ukrainian community in Austria

<sup>&</sup>lt;sup>2</sup> Kohlenberger, J., Buber-Ennser, I., Rengs, B., Setz, I. and Riederer, B. (2022) "UkrAiA Abschlussbericht Stadt Wien" – Final project report / presentation for the city of Vienna [Online]. Available at: https://www.ukraia.at/wp-content/uploads/2022/08/ukraia\_final\_report\_city\_of\_vienna.pdf

## Differences in emigration patterns: Cluster Eastern Europe vs. Refugees from Ukraine

Example: 30 year old female immigrates to Austria and lives in Vienna



Duration of stay in years

Duration of stay in years

Hazard: Rate at which a person emigrates in a given time interval.

Survival: Proportion of individuals who do not emigrate until a given point in time.