

FUTURE MIGRATION  
SCENARIOS FOR EUROPE

# Quantifying and modelling future migration

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Development of the migration models  
from global, through regional/national to  
local levels



Funded by the EU  
Horizon 2020 programme



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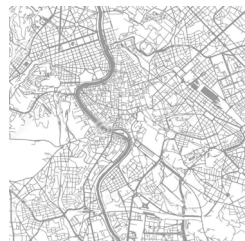
- Global Model



- Regional Model



- Local Model



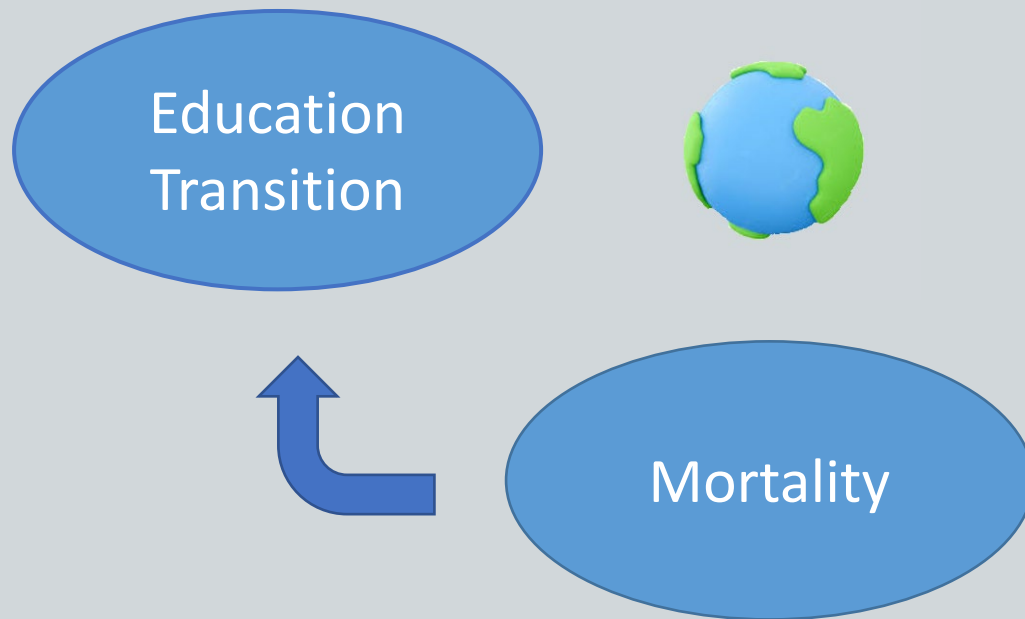
# Global Population Model



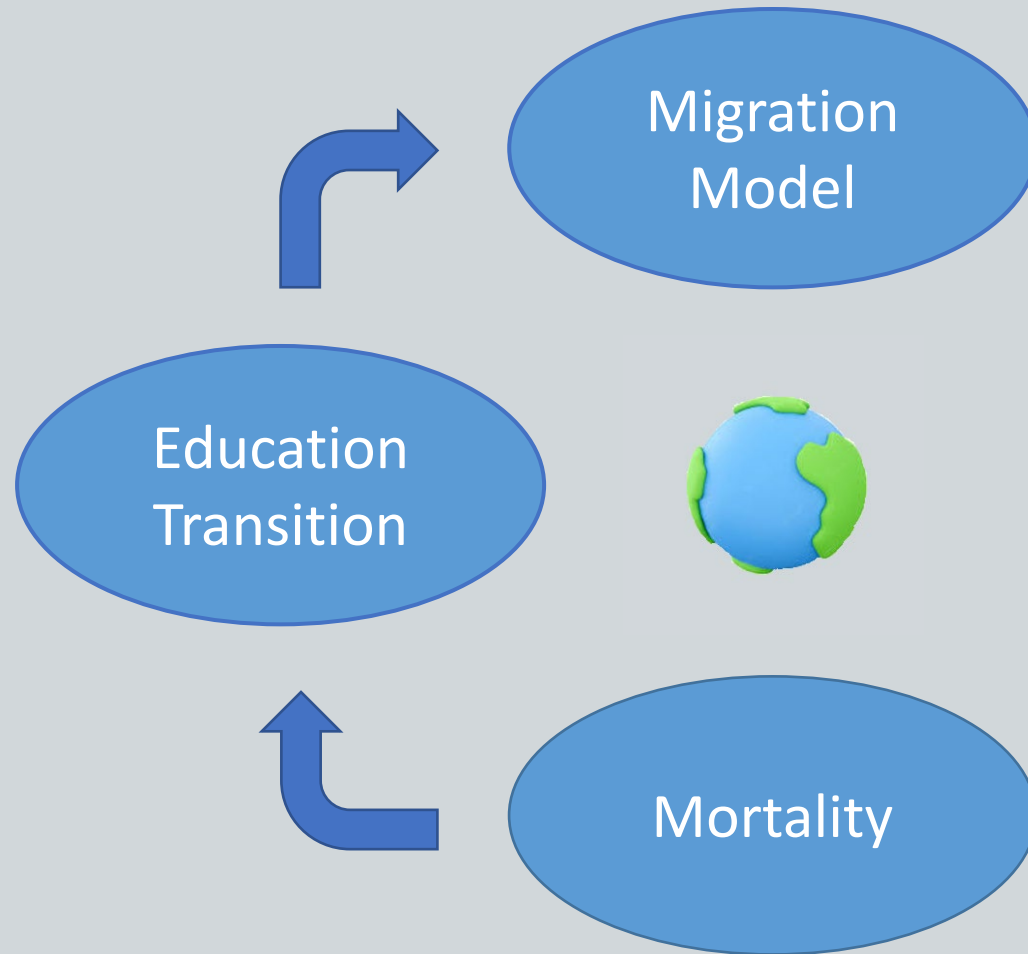
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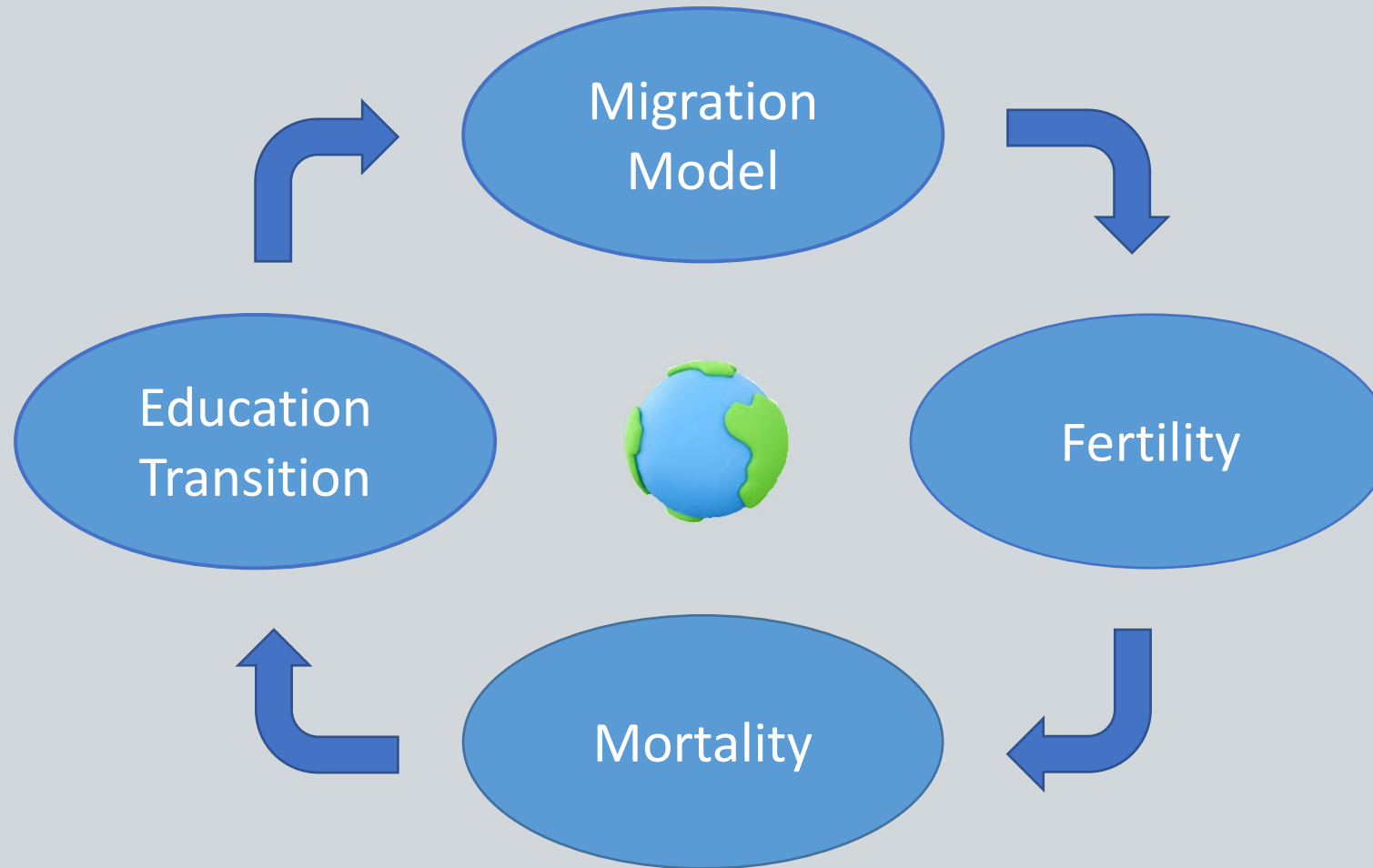
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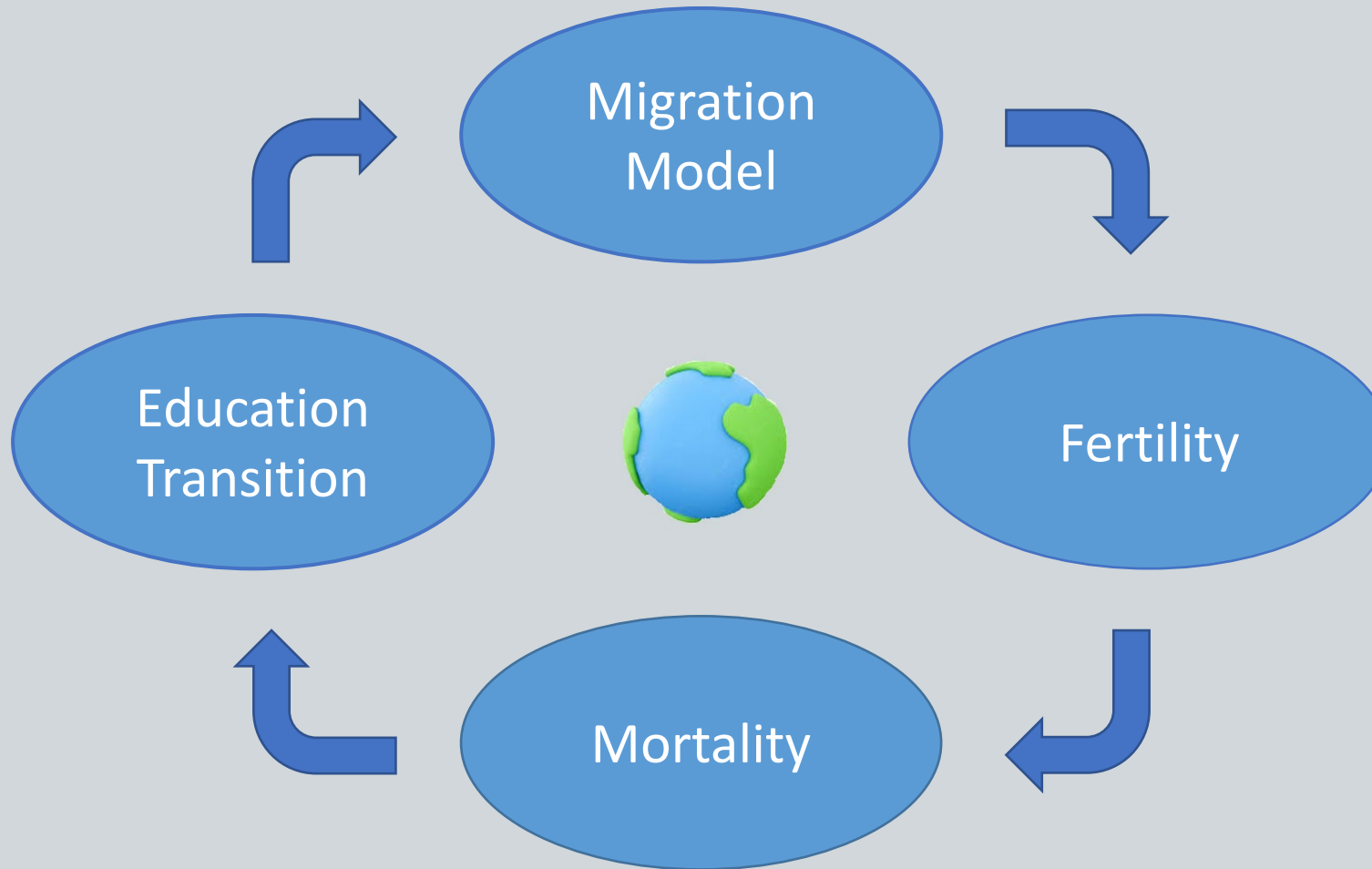
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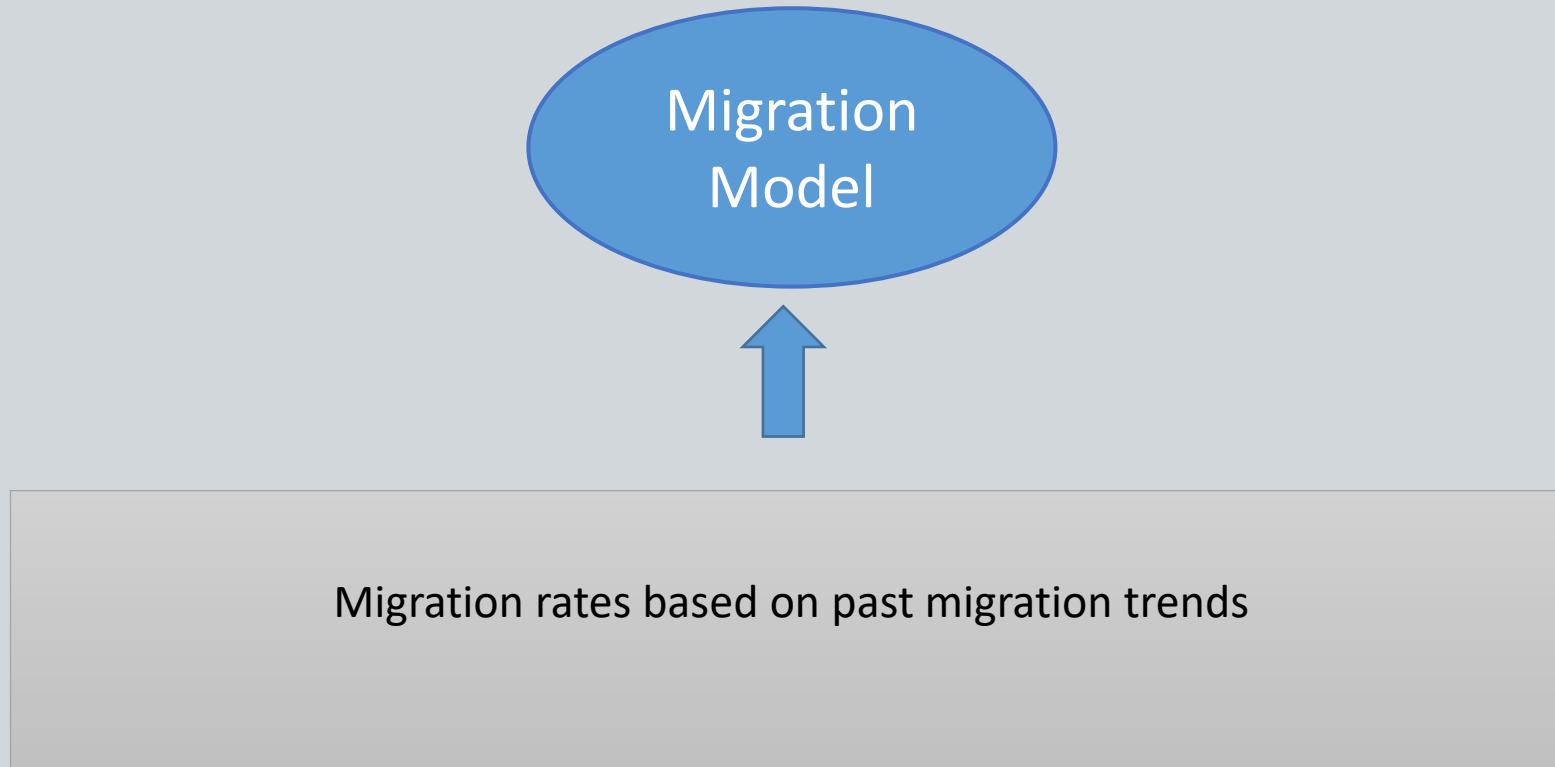
Age (21)  
Education(6)  
Sex (2)  
COB  
COR



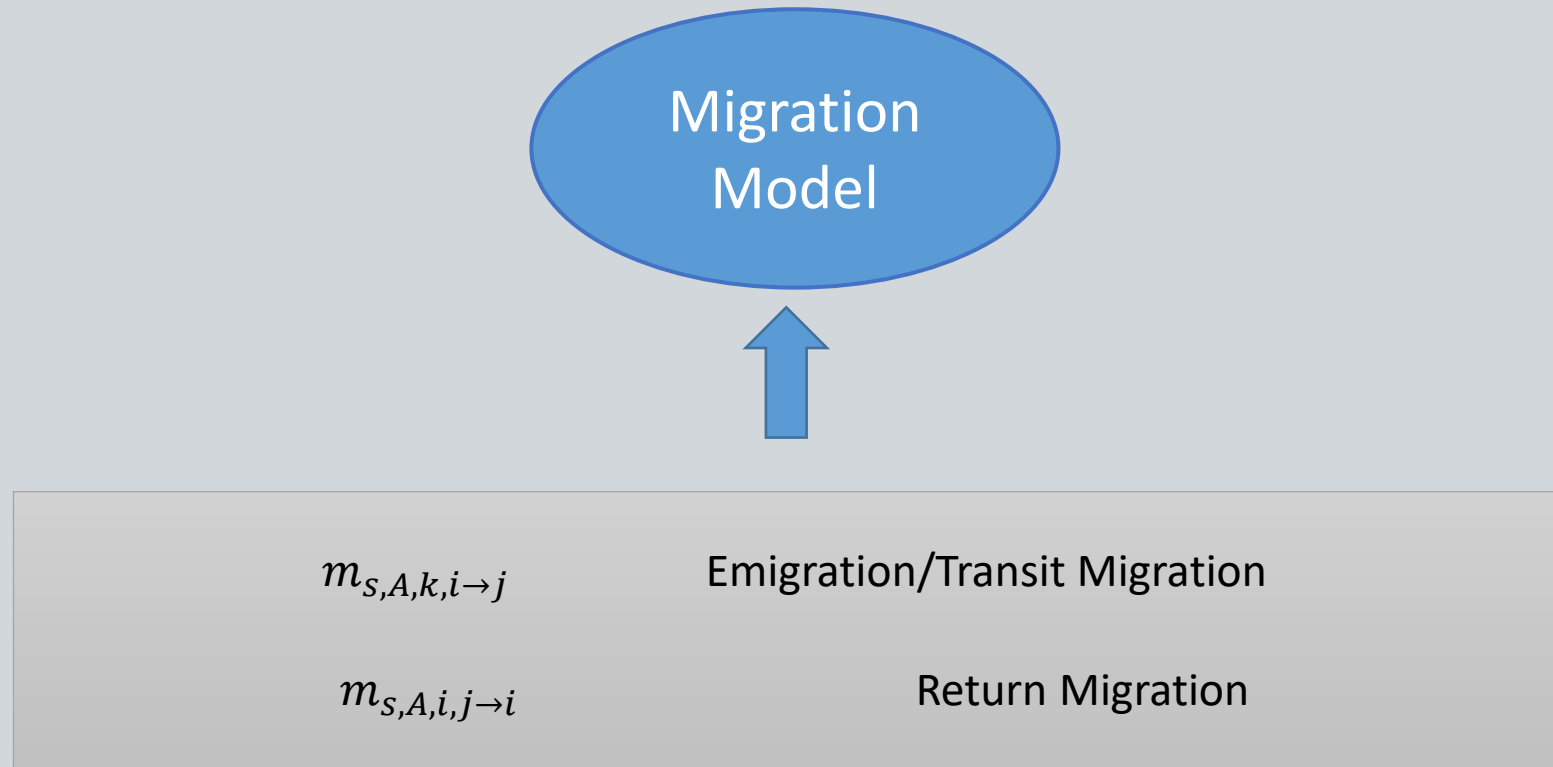
# Global Population Model

Migration  
Model

# Global Population Model



# Global Population Model



# Global Population Model

Migration  
Model



s = Skill  
A = Age  
k = Place of birth  
i = Place of residence  
j = Destination

$$m_{s,A,k,i \rightarrow j}$$

Emigration/Transit Migration

$$m_{s,A,i,j \rightarrow i}$$

Return Migration

# Global Population Model

Migration  
Model



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Emigration/Transit Migration

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Return Migration

Age  $\in \{0-24, 25-64, 65+\}$   
Skill  $\in \{\text{High-Skill, Low-Skill}\}$

High Skill: upper secondary education or higher  
Low Skill: below upper secondary education

# Global Population Model

Migration  
Model



s = Skill  
A = Age  
k = Place of birth  
i = Place of residence  
j = Destination

$$m_{s,A,k,i \rightarrow j} = a_A F(G_i) \left( \frac{w_{s,j}}{w_{s,i}} \right)^{\alpha_g} p_{k,j}^{\alpha_p}$$

Emigration/Transit Migration

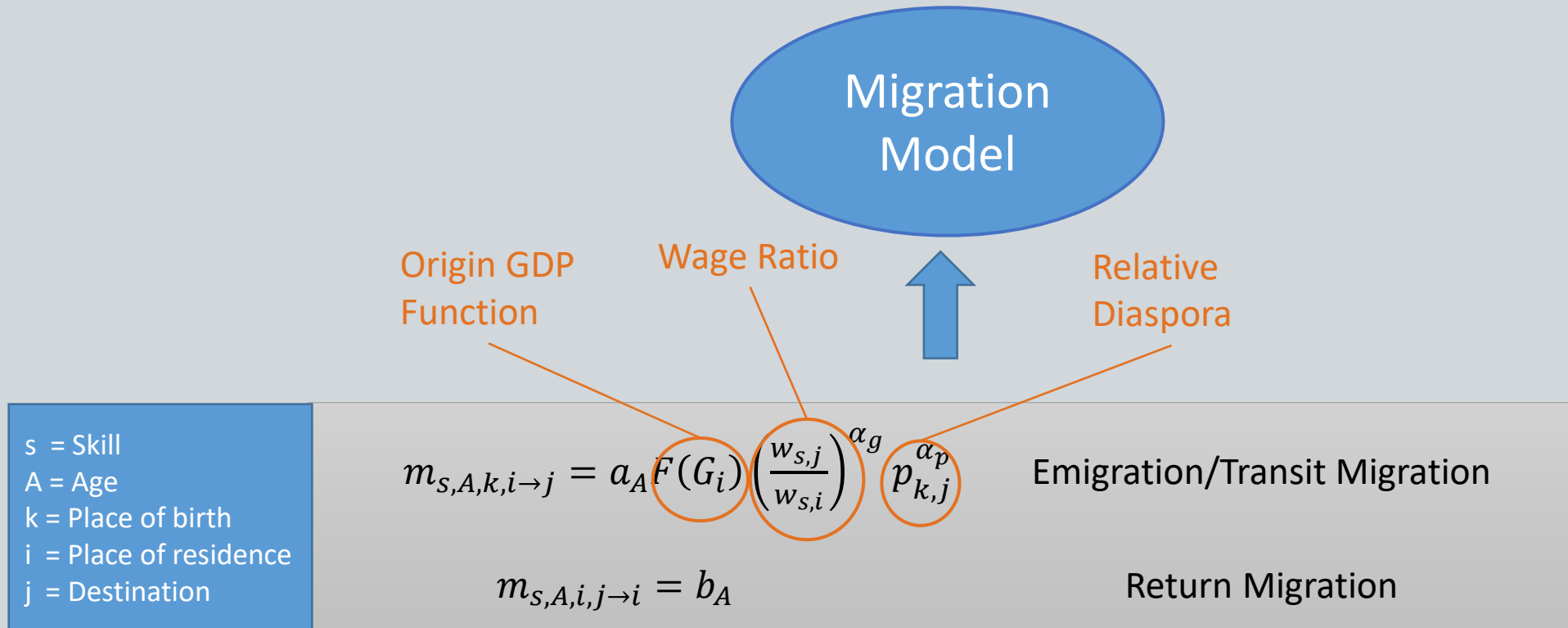
$$m_{s,A,i,j \rightarrow i} = b_A$$

Return Migration

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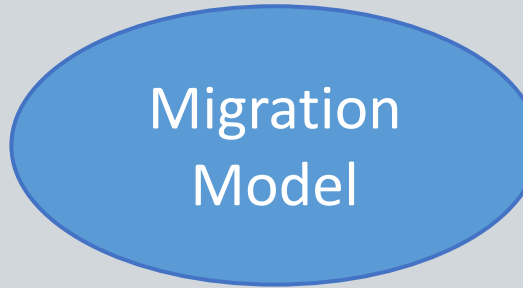
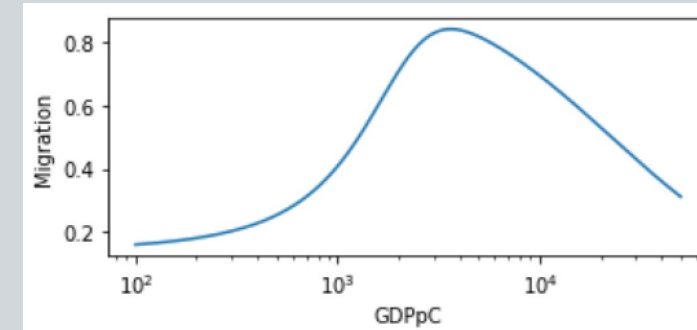


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# Global Population Model

Origin GDP Function



Origin GDP Function

Wage Ratio

Relative Diaspora

s = Skill  
A = Age  
k = Place of birth  
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$$m_{s,A,k,i \rightarrow j} = a_A F(G_i) \left( \frac{w_{s,j}}{w_{s,i}} \right)^{\alpha_g} p_{k,j}^{\alpha_p}$$

Emigration/Transit Migration

$$m_{s,A,i,j \rightarrow i} = b_A$$

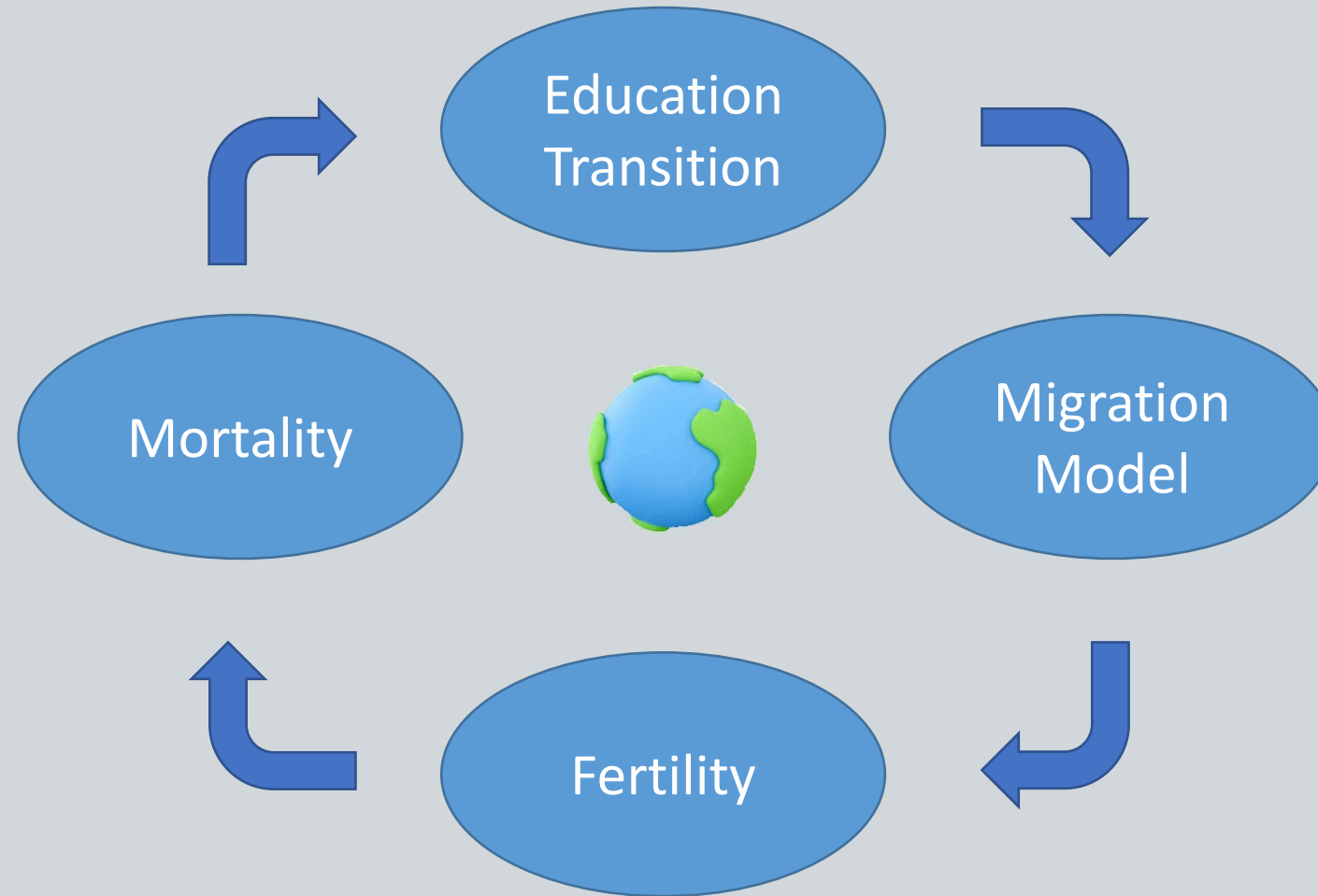
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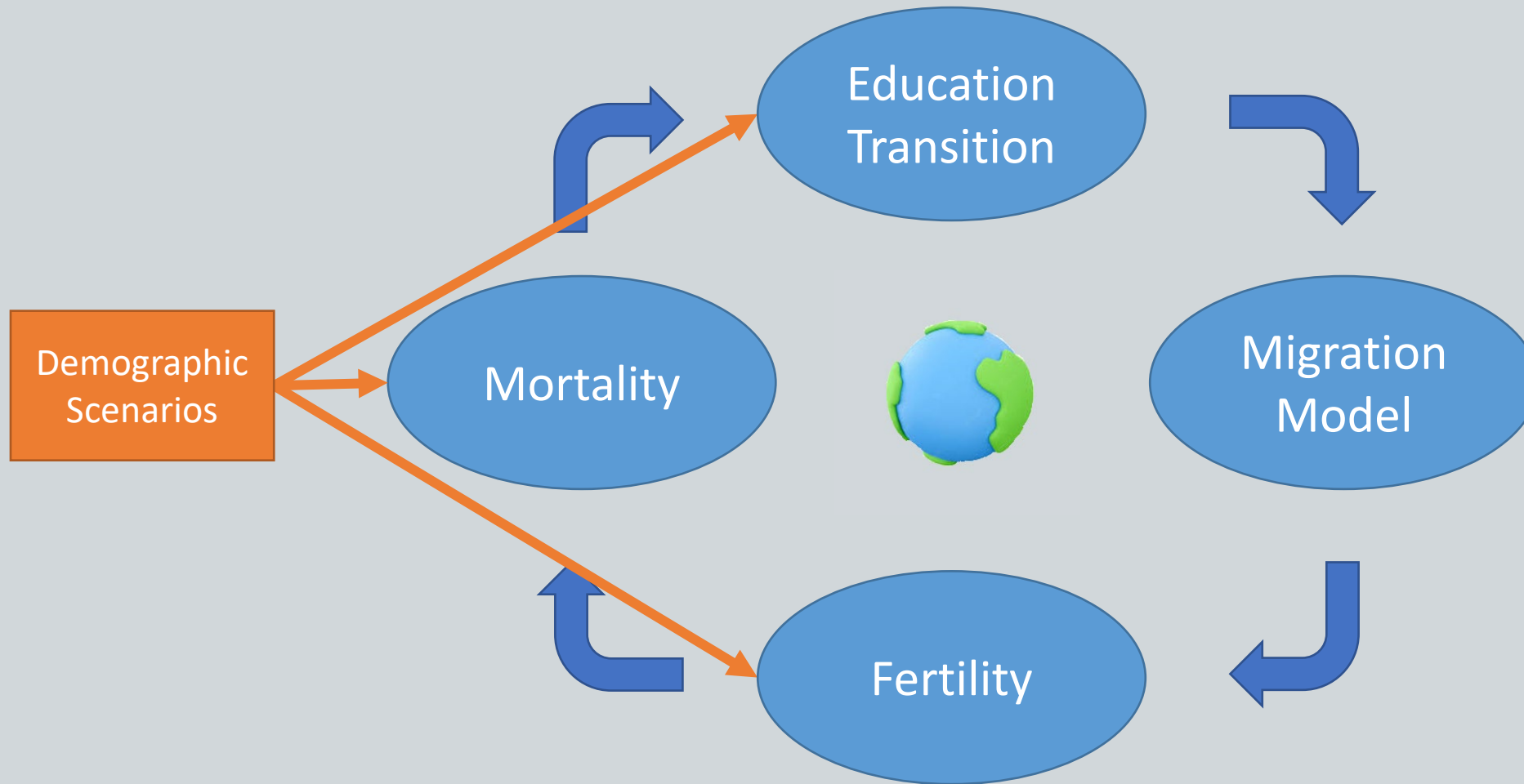
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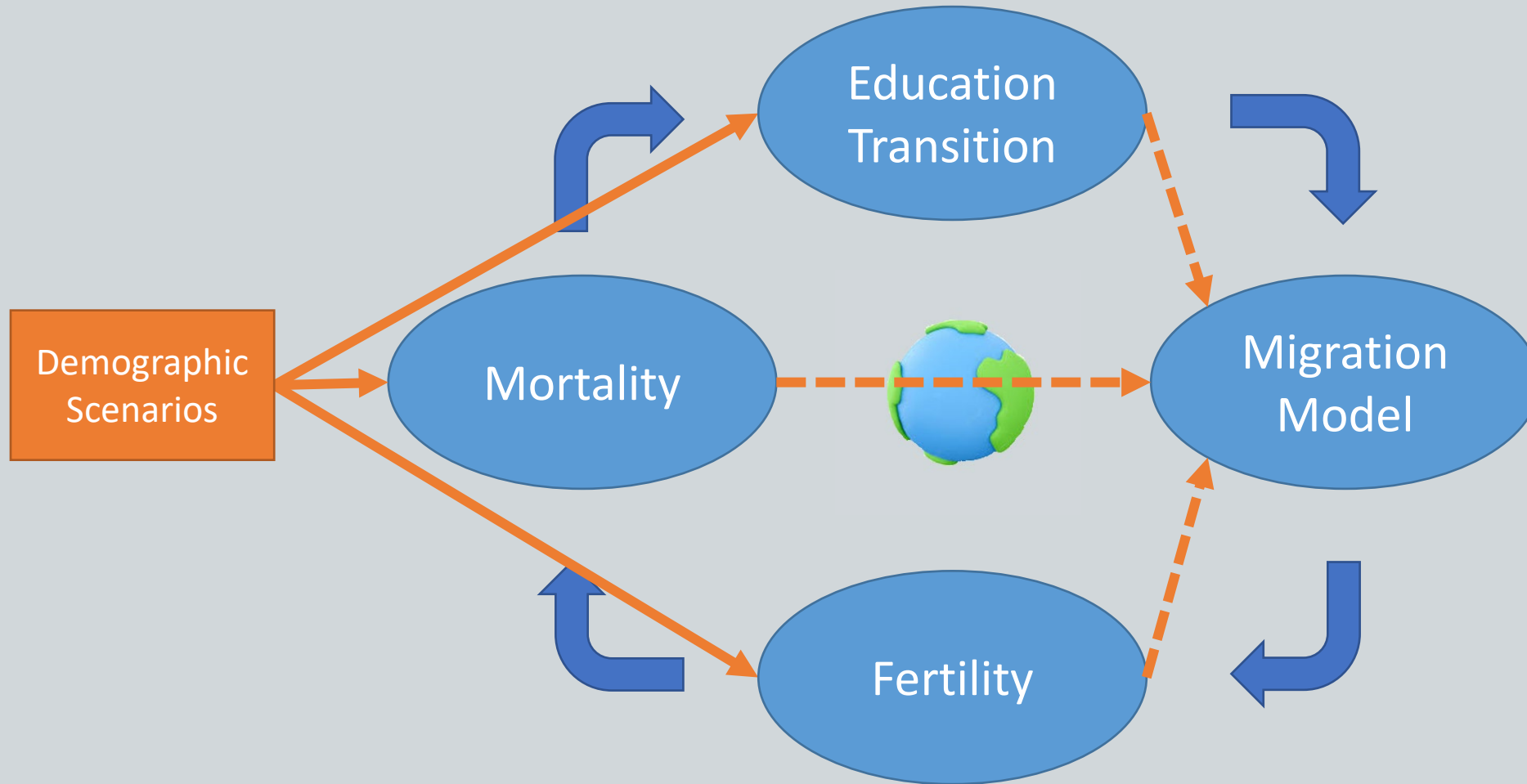
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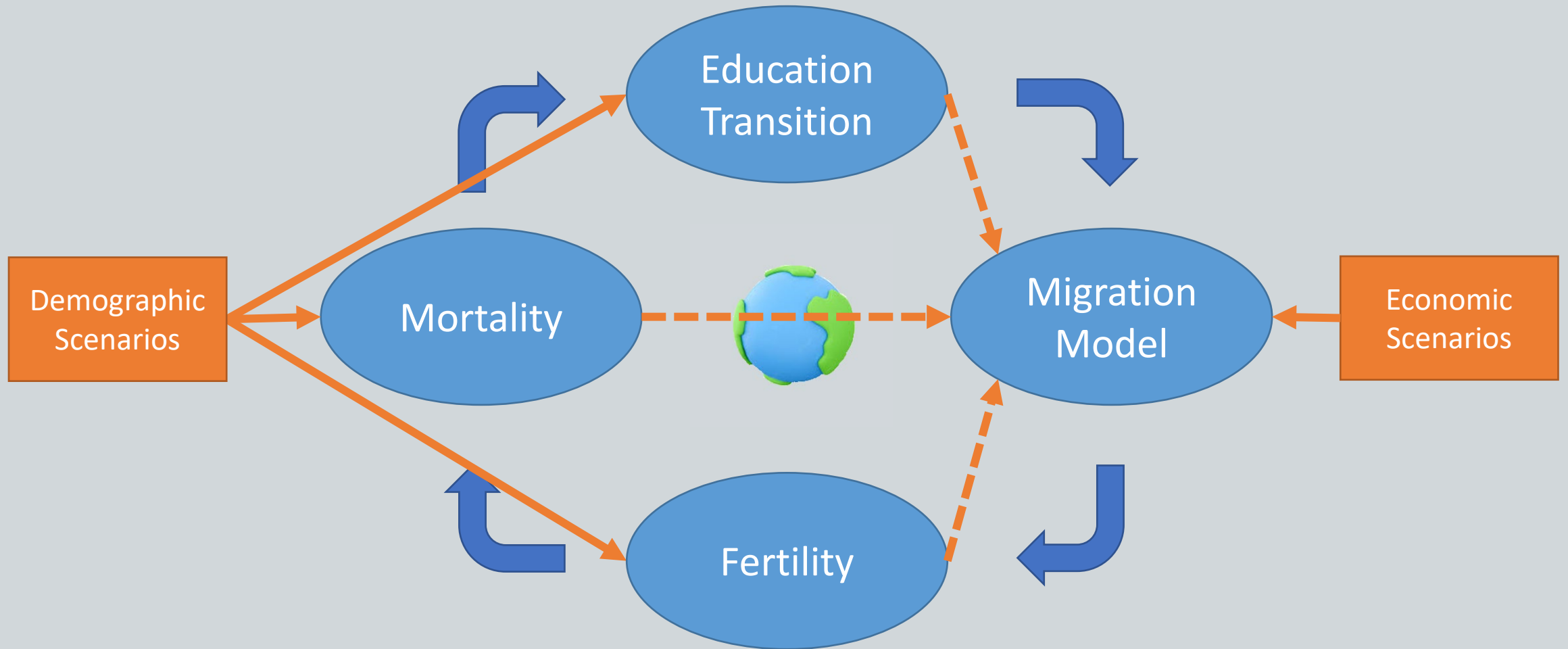
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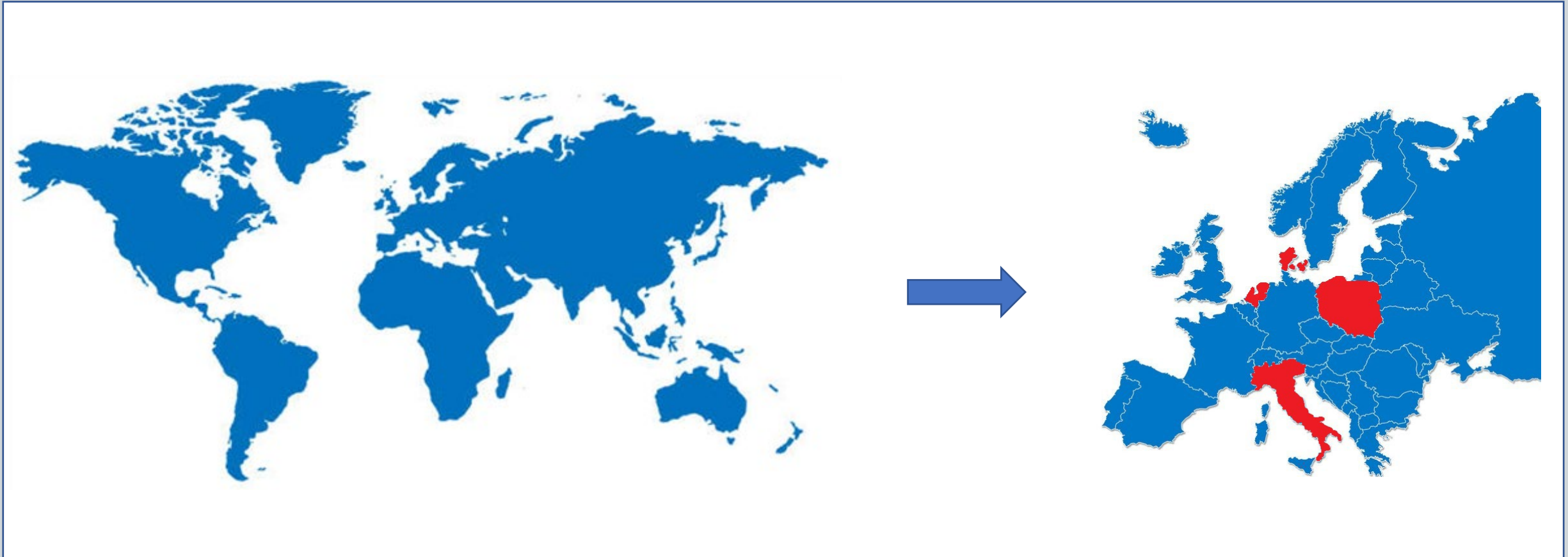
# Global Population Model



# Global Population Model



# Global to Regional

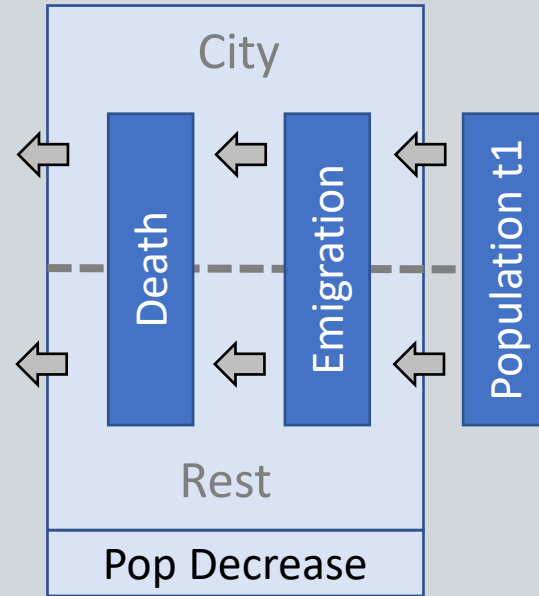


# Regional Model

Population t1

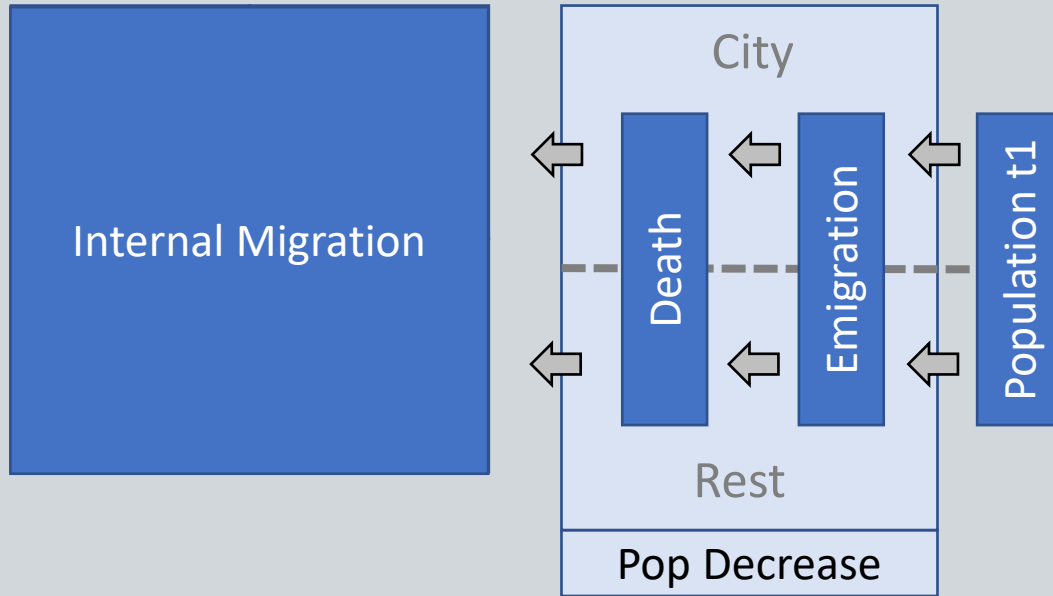
- Bi-directional model (City/Rest) consisting of: **Age (A), Sex (S), Migrant status (M), Education (E)**
- Estimate of population in 2020 as the starting population for the regional scenarios

# Regional Model



- Bi-directional model (City/Rest) consisting of: **Age (A), Sex (S), Migrant status (M), Education (E)**
- Estimate of population in 2020 as the starting population for the regional scenarios
- Analysis of regional mortality
- Analysis of regional emigration rates in accordance with global results

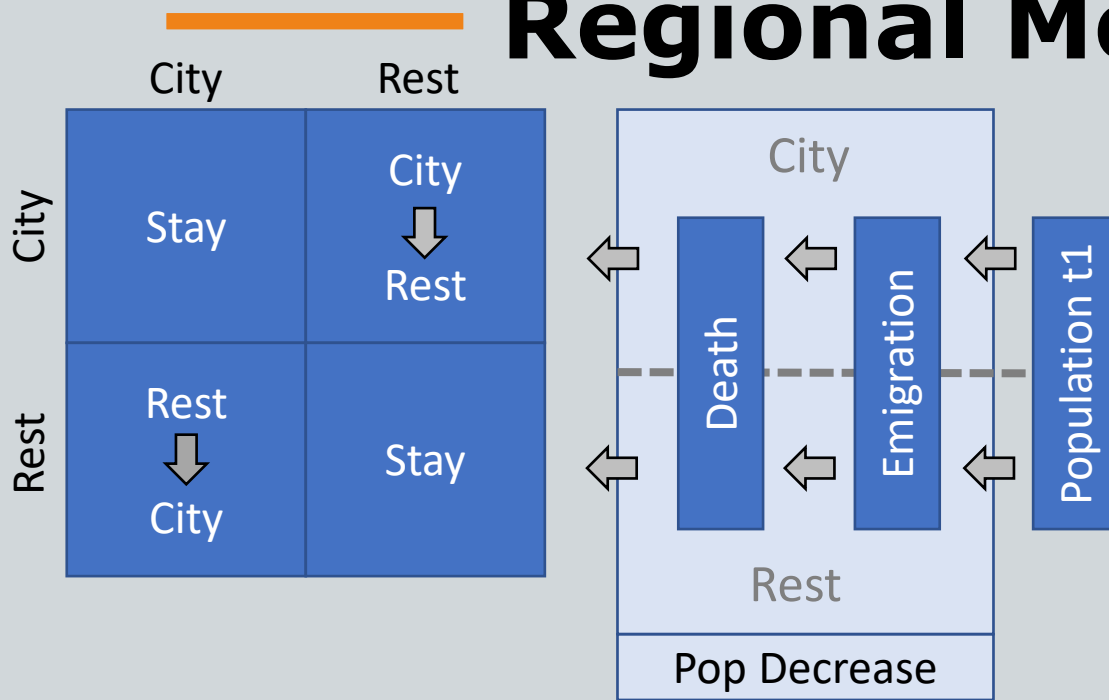
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- Analysis of regional emigration rates in accordance with global results
- Analysis of internal migration

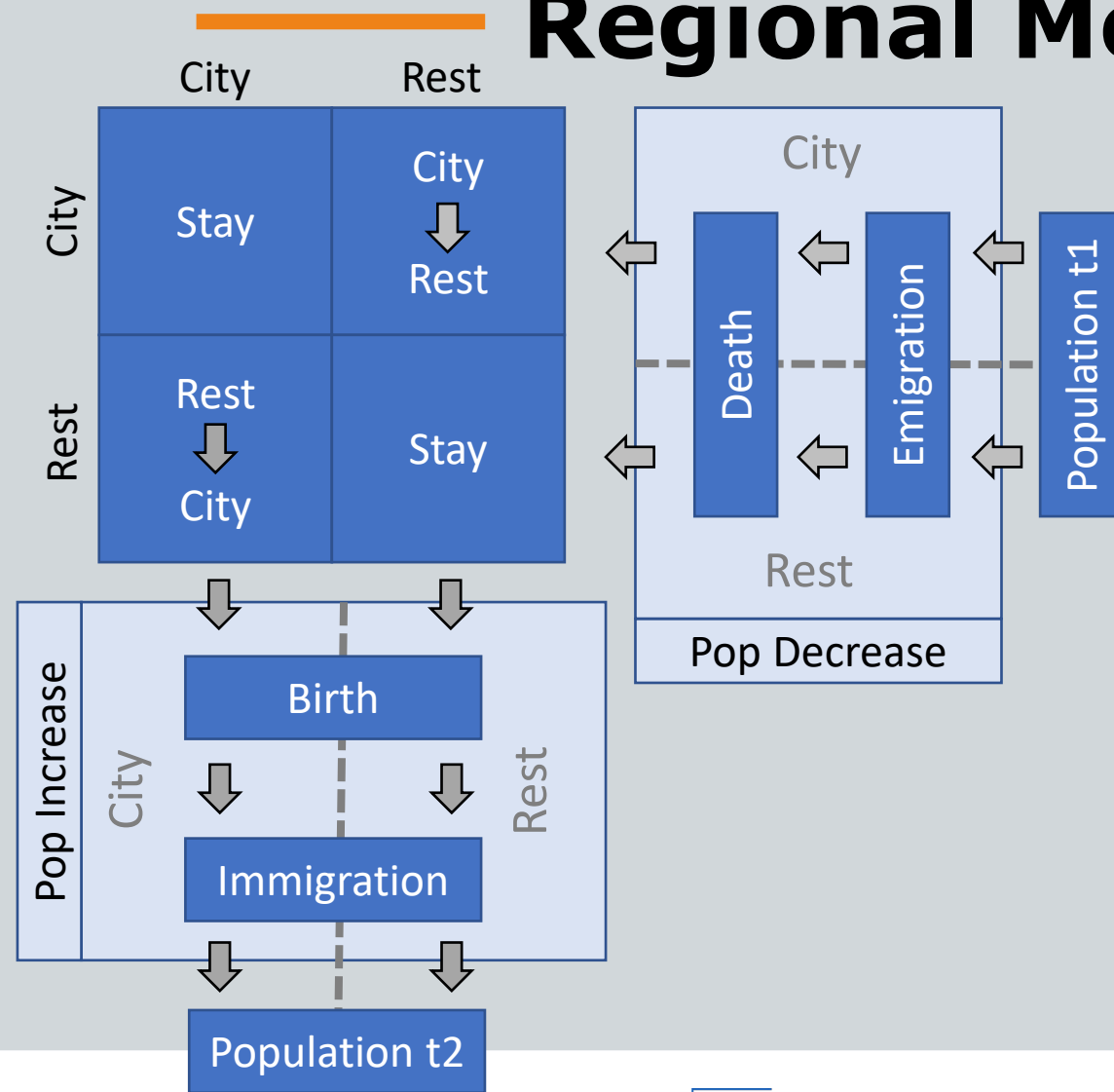


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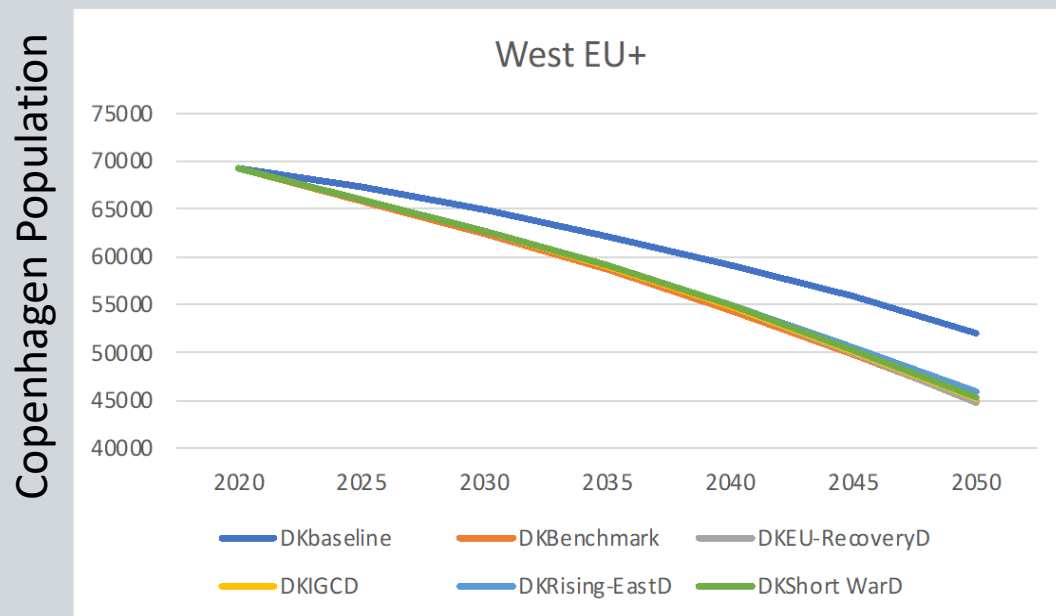
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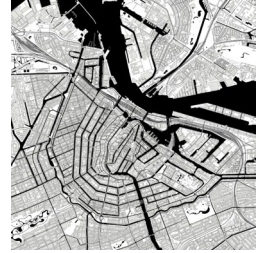
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# Regional to Local

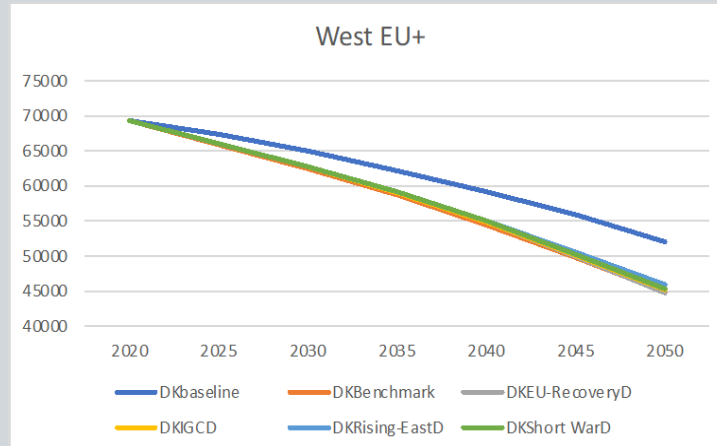


# Local Model

The proposed approach is based on a **spatial disaggregation methodology** that combines the output of the subnational projection model to local development plans for the future of the cities. It relies on a Machine Learning (ML) regression model employing multi-output Convolutional Neural Network (CNN).

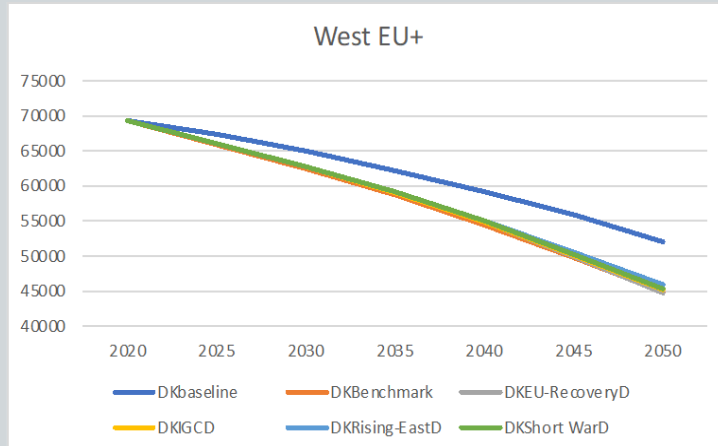
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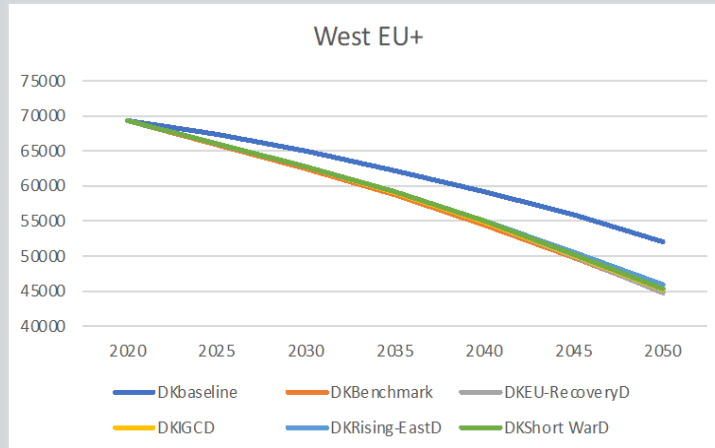
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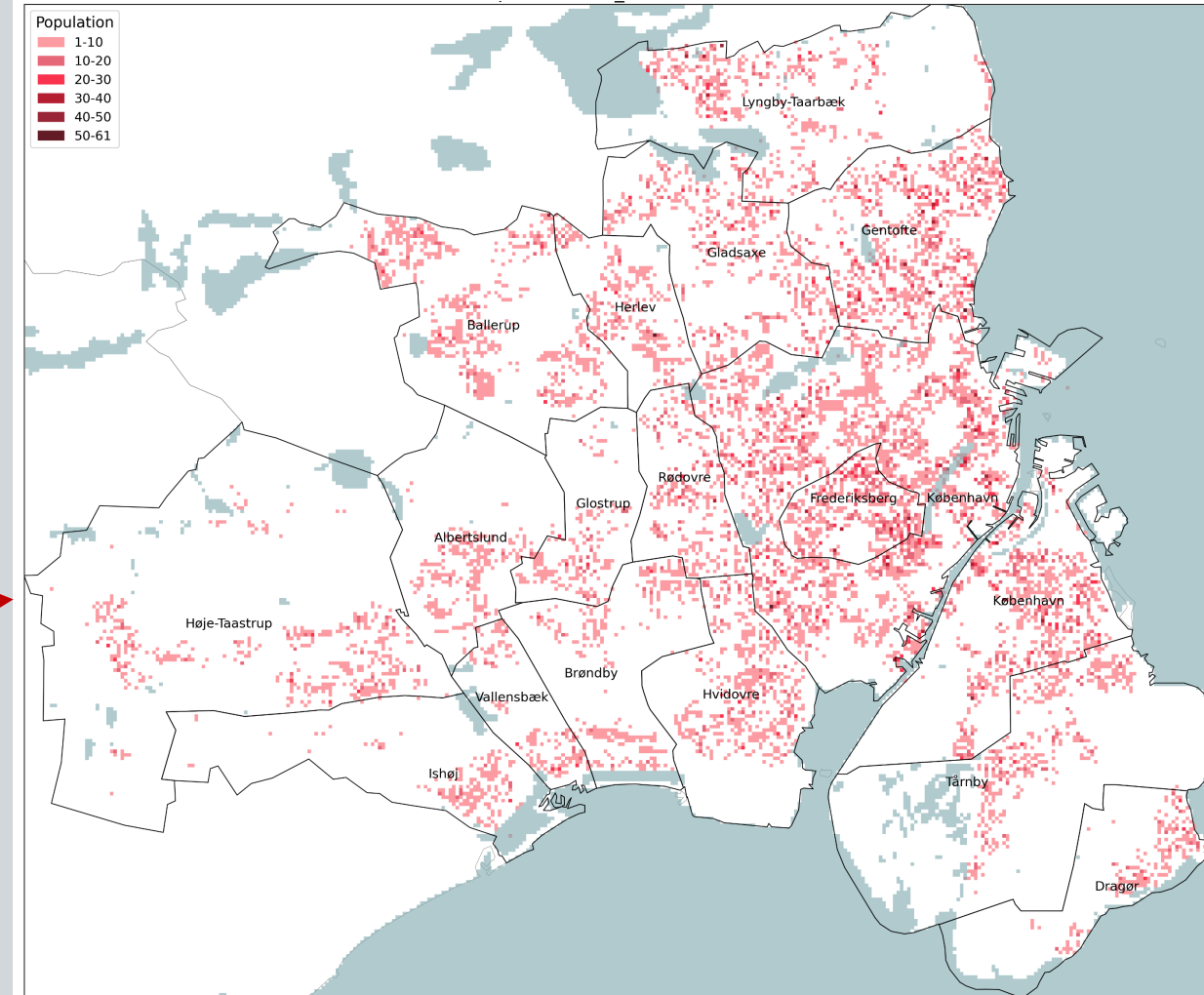


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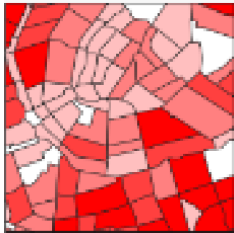
Distribution of West EU+ migrants in 2050 under the scenario: Rising East





# Local Model

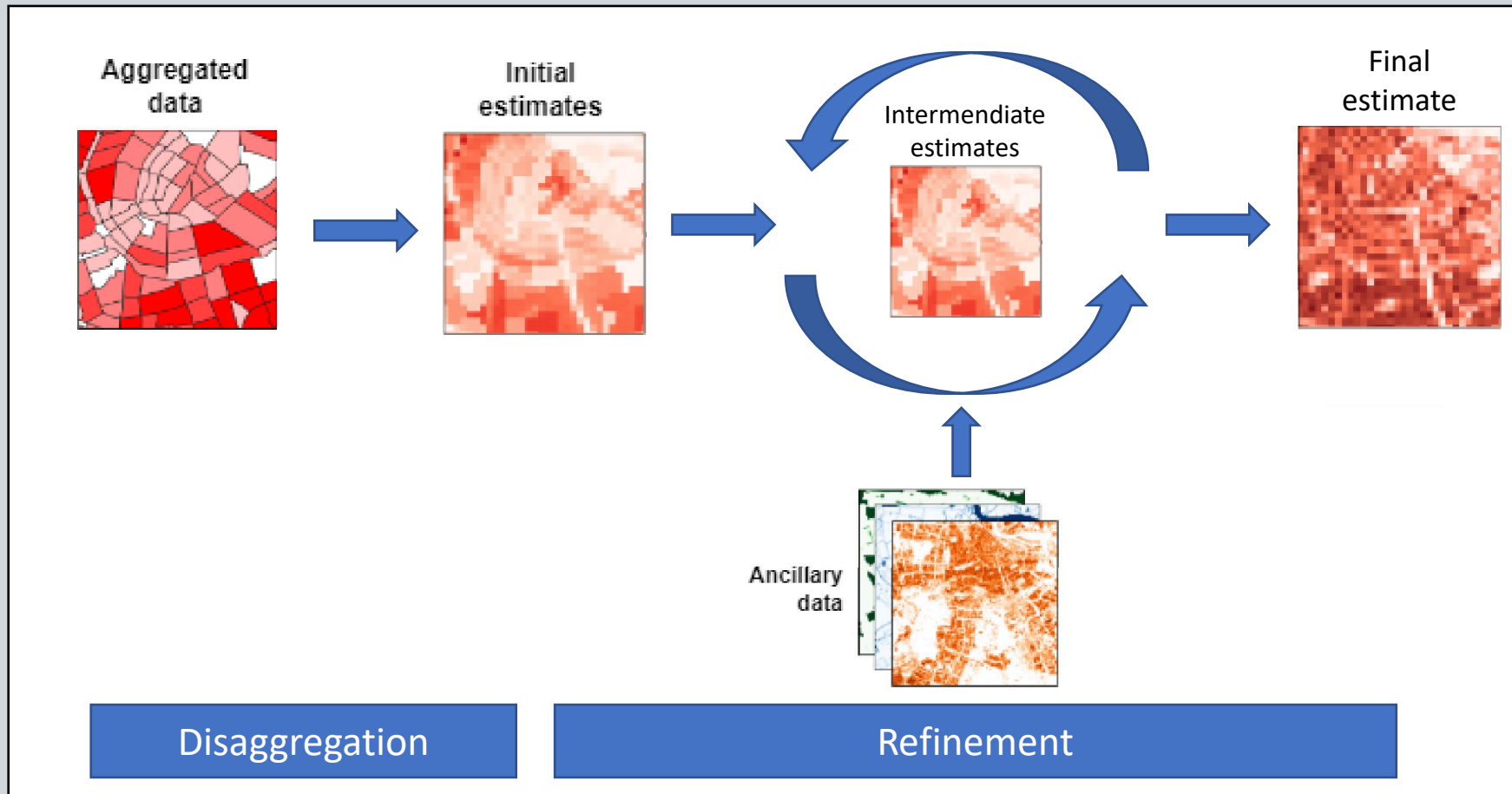
Aggregated  
data



# Local Model



# Local Model



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# Thank you