



#### **Future Migration to Europe** What can we learn from the last decade?

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### **Explain Before Predict**

□ To ensure safe and orderly migration, there is a need for systems which can help anticipate where and when people are likely to migrate.

However, building such systems requires a deep understanding of the mechanisms underlying migration flows.

HumMingBird's starting point: uncover what drove migration flows to Europe, particularly the sharp increase in asylum seekers in 2015-16.

□ Key lessons:

> Migration drivers are mixed, heterogeneous, and have temporal patterns.

> Traditional migration models are inadequate to capture such complexities.

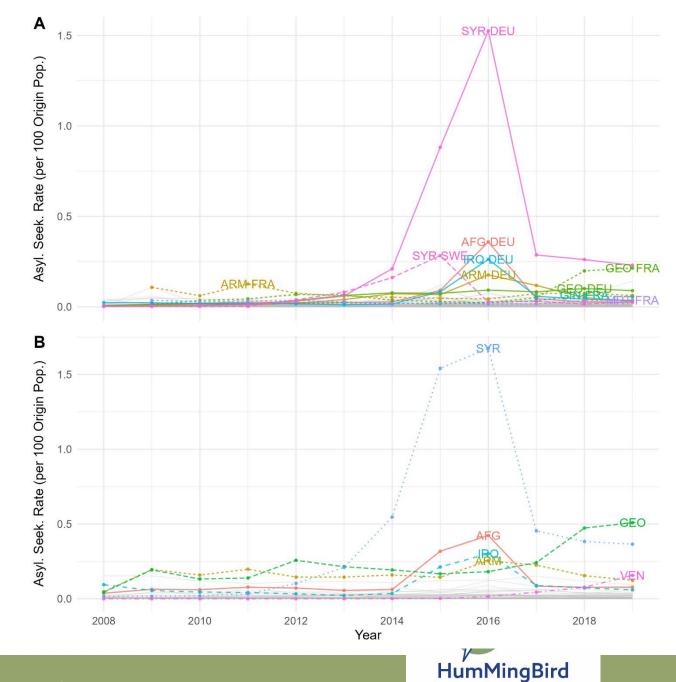


# Trends of Asylum-Seeking Rate (ASR)

- □ ASR is the nr. of people migrated relative to those who remained
- Known driver:
  War in Syria

. . .

What about: economic collapse? climate stressors?



# **Drivers**

Panel A: Conflict-induced fatality (Uppsala Conflict Data Program)

Dependent Panel B:

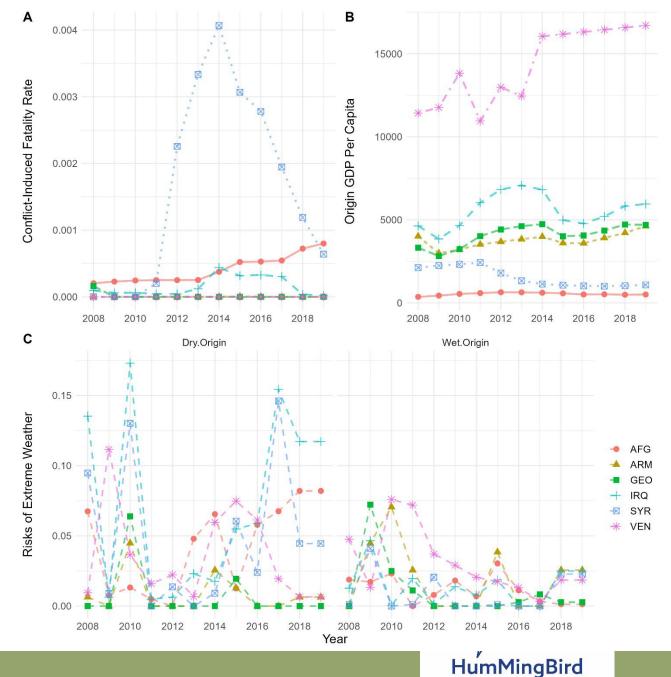
Economic indicator (World Bank per capita GDP in USD)

Dependence Panel C:

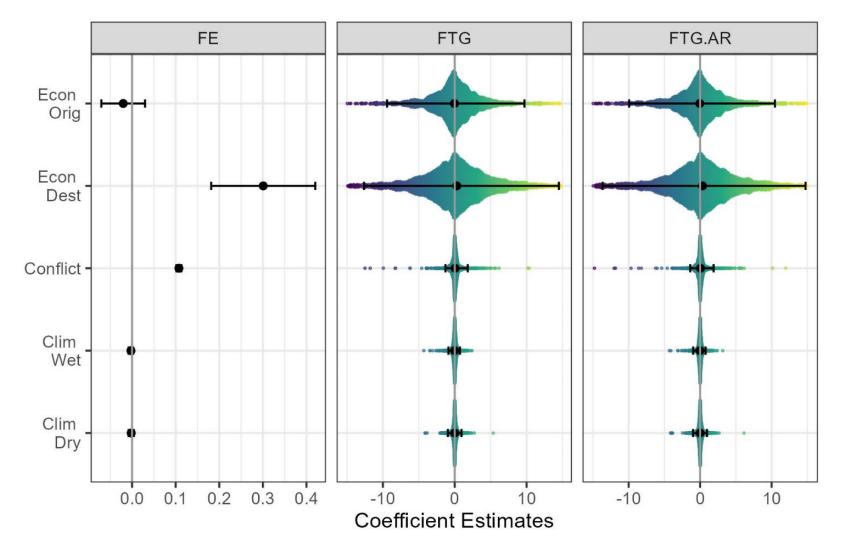
Climate risks (Standardised Precipitation-Evapotranspiration Index - SPEI)

- ➢ If SPEI above 2, extreme wet
- ➢ If SPEI below 2, extreme dry
- Risks computed by

grids with extreme wet/dry relative to total grids



## Elasticities of ASR



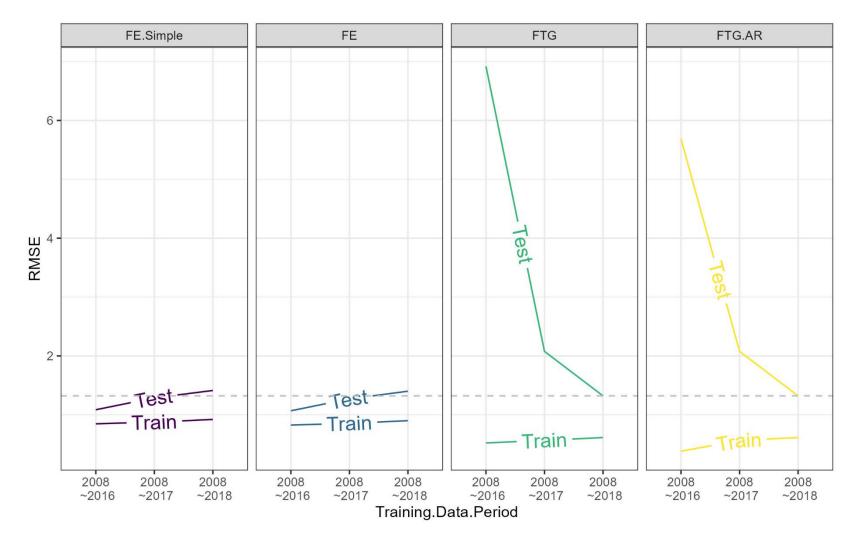
FE (Fixed-Effects): a traditional approach to capture time-constant drivers, e.g., language proximity, distance, etc.

- FTG (Flow-Specific Temporal): our new approach to capture heterogeneity in migration responses.
- FTG reveals pervasive heterogeneity in migration responses.



Qi H, Bircan T (2023) Modelling and predicting forced migration. PLoS ONE 18(4): e0284416. https://doi.org/10.1371/journal.pone.0284416

## Model Performances



RMSE (Root Mean Squares Errors): the smaller the value, the better model performs.

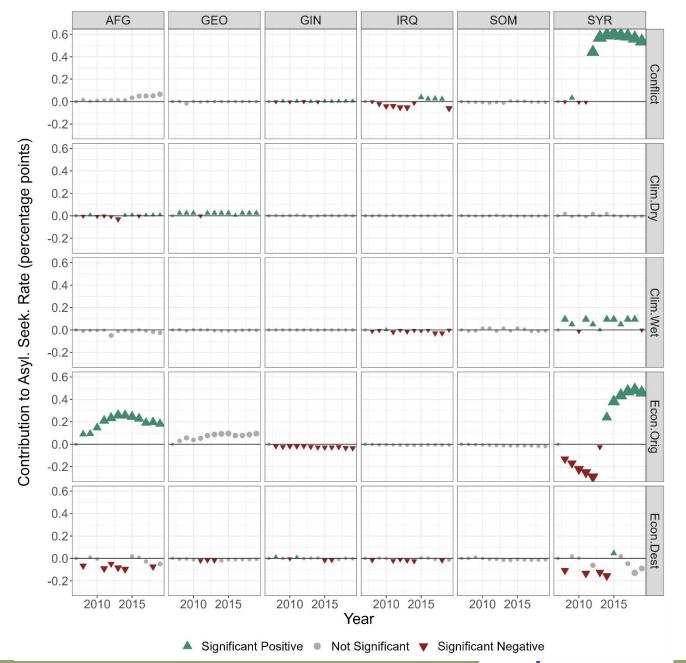
 Our FTG model can outperform the traditional FE model when data lengthens.



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#### **Temporal Dynamics**

- Use FTG to simulate how each driver evolved overtime.
- The rise of ASR initially triggered by conflict, followed by collapsed economy in Syria - mixed drivers.
- Drivers and their temporal patterns vary substantially across origins heterogeneity.



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### Key Findings and Implications

□ Migration drivers can be mixed, heterogeneous, and have temporal patterns.

□ For the Syria-EU flow, conflict was the initial trigger followed by an economic collapse.

What can we say about the future based on the past patterns?

Given the ongoing war in Ukraine and elsewhere, and/or looming recessions, the desire to migrate might increase.

However, when and where large flows might emerge remain largely uncertain, as

- Migration responses can be highly heterogeneous.
- Temporal patterns can be highly complex.
- Migration policies may be switched on/off.

