

# Assessing transboundary and intersectoral spillovers of multiple natural hazards in the Danube Region using a large-scale macroeconomic agent-based model

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# Research question

How can we increase resilience to multiple disasters that impact several **interconnected countries in the Danube Region** with strong macro-economic relationships?

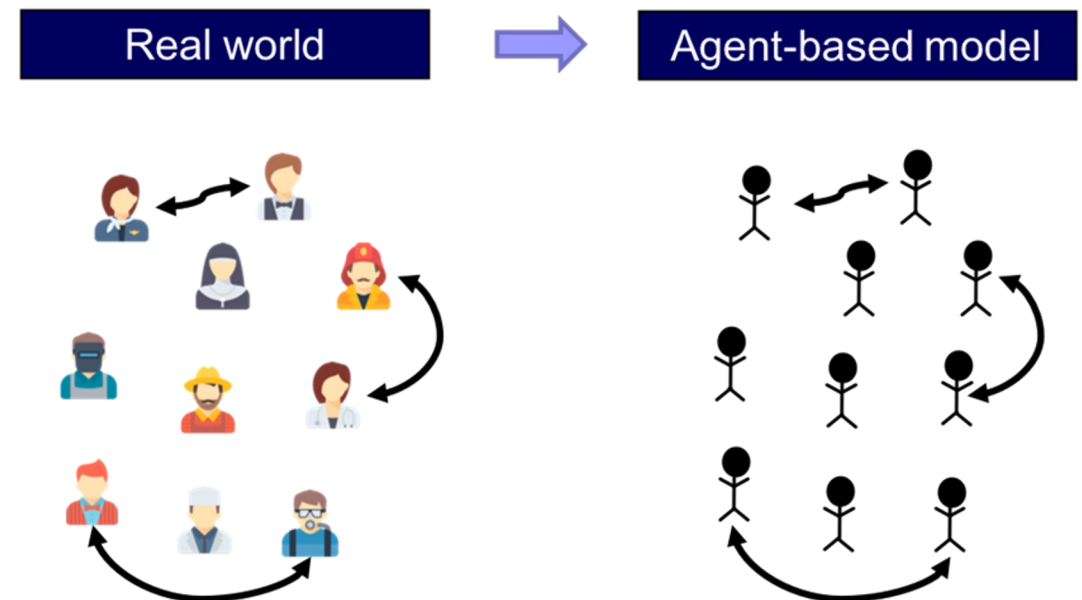


<https://danube-region.eu>

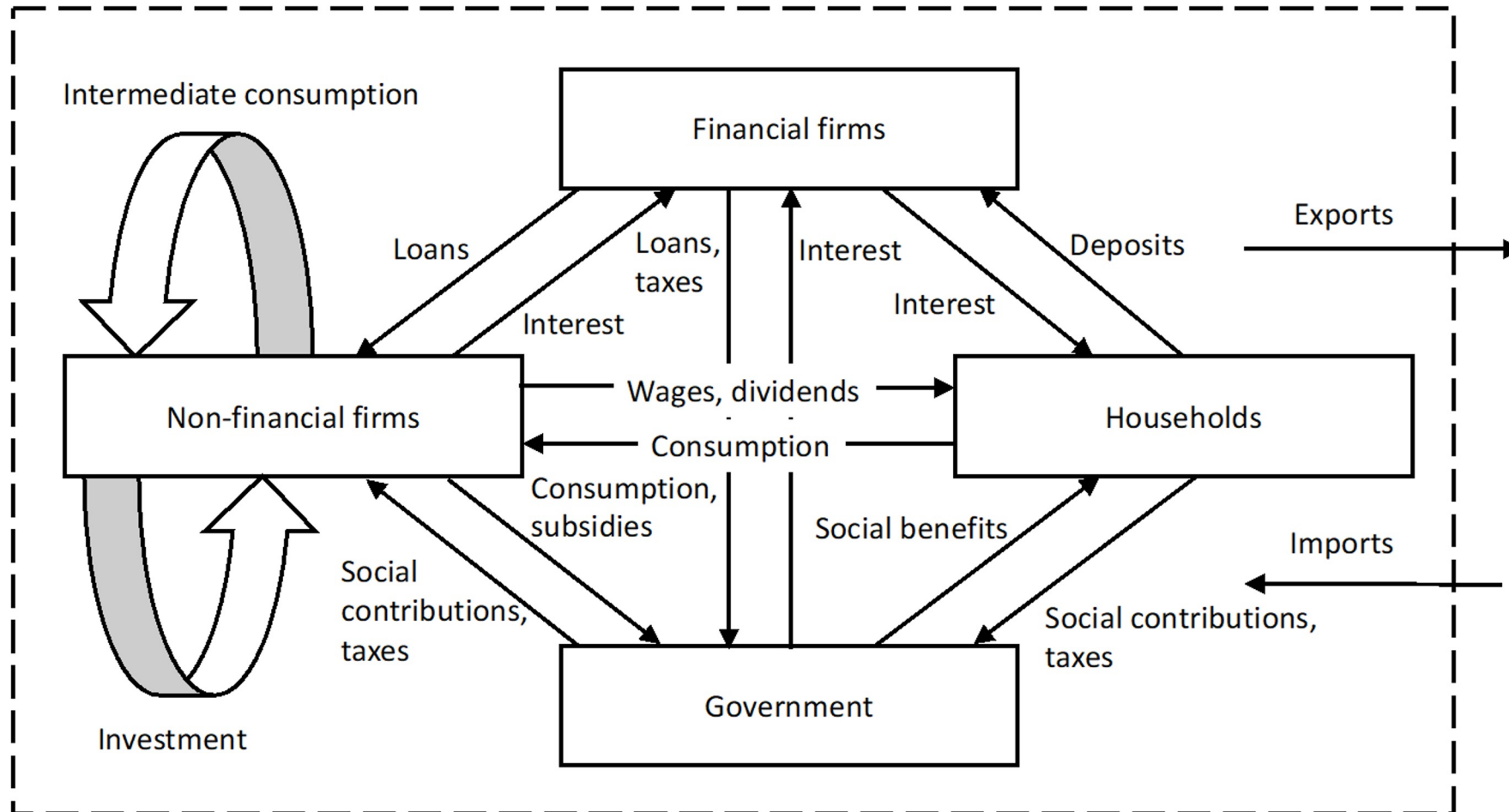
# Method: Agent-based modeling (ABM) of economic systems

Agent-based models (ABMs) are **computer simulation** models with the following features:

- They model **individual agents** and their individual **decisions** (decentralized decision-making)
- Can include thousands or even **millions** of agents
- Can capture **bounded rationality** (often in the form of some heuristics)
- Depict **emergent patterns** from micro-processes that aggregate to a macro level: the economy as a **complex system** subject to **fundamental uncertainty**



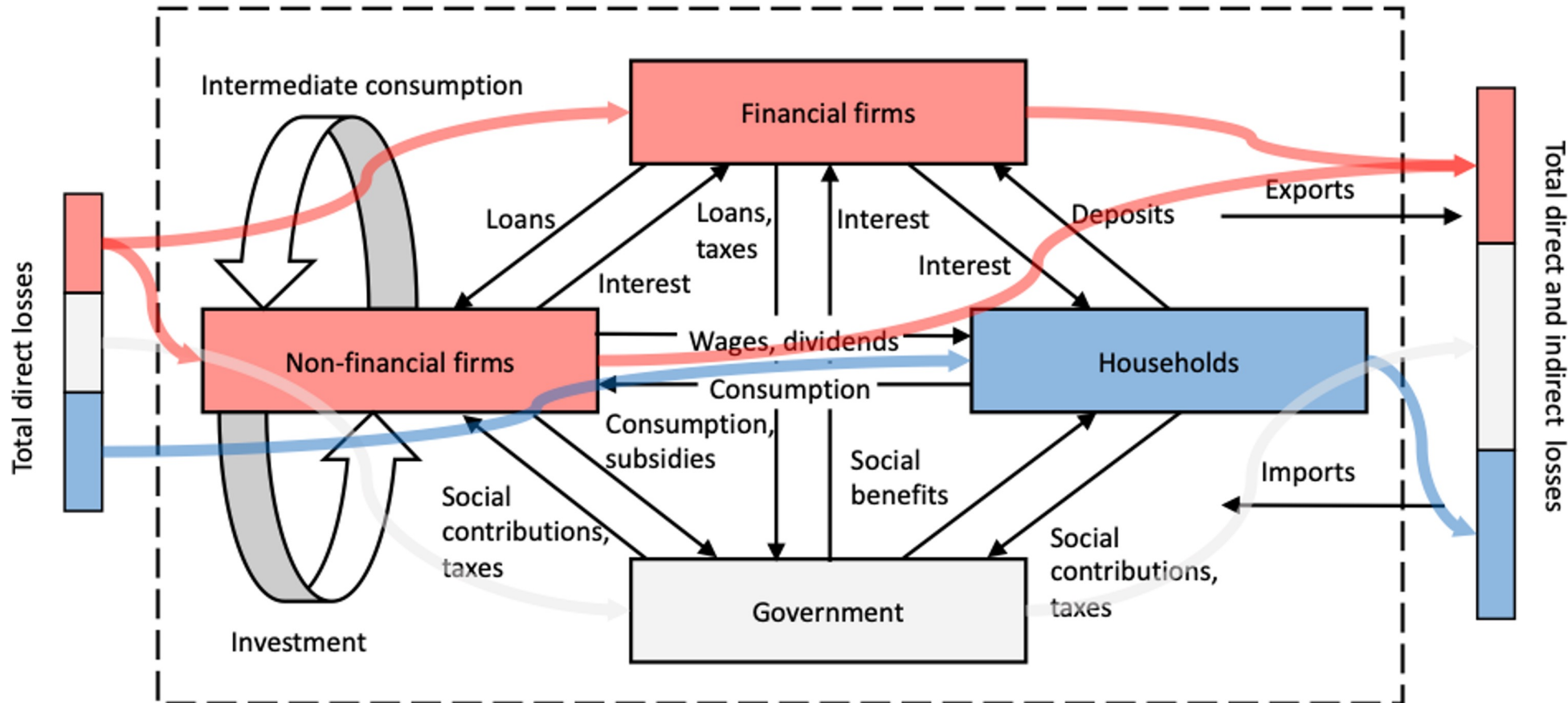
# IIASA macroeconomic ABM



Major economic agents and their interactions (Poledna et al., 2023)

# Modeling indirect losses with the ABM

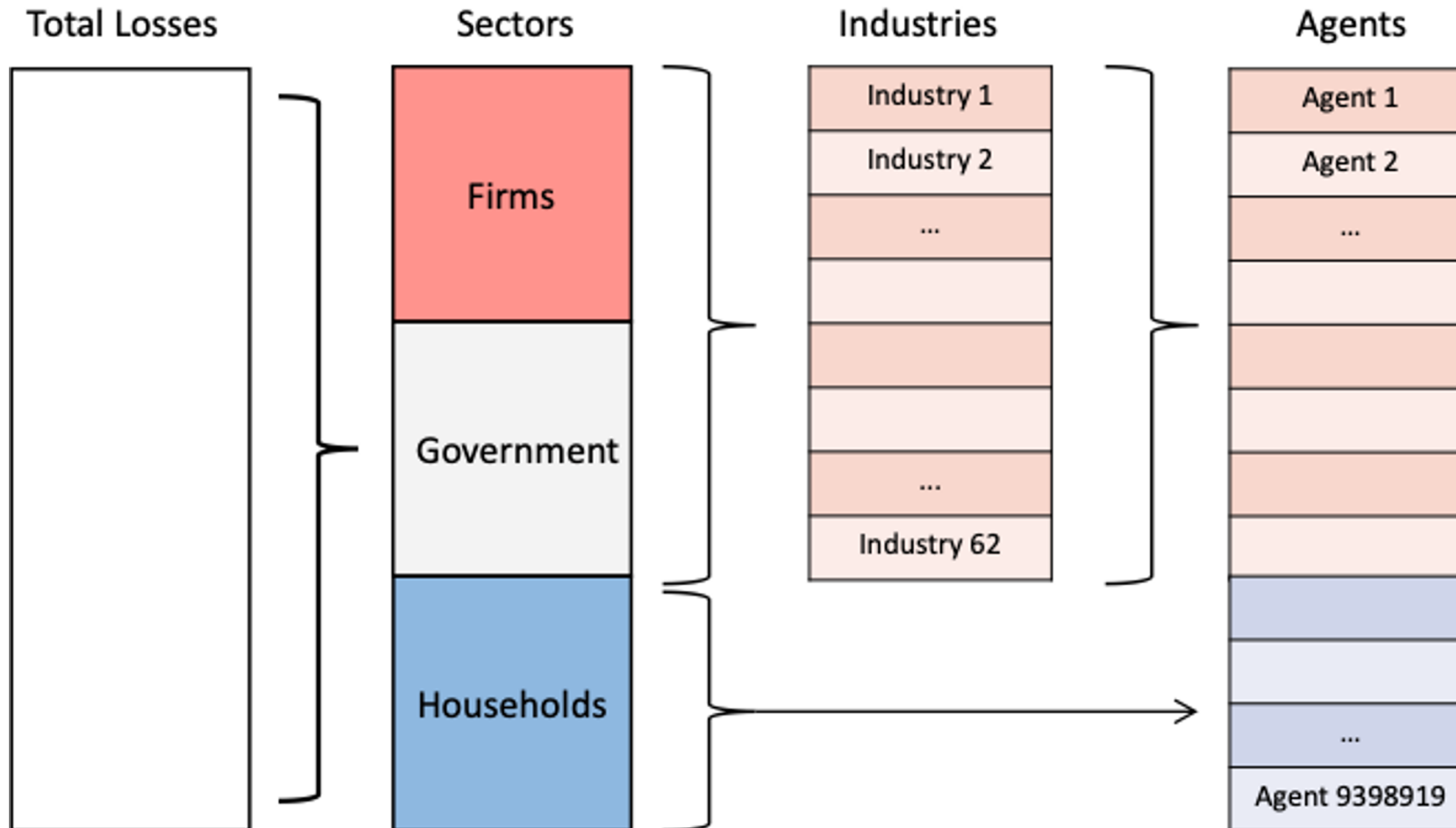
Agent-based model



**Indirect risks** arise not from the direct impact of a disaster but from the interconnectedness of system elements. They materialize through disruptions in transport, supply chains, or economic activities.

Coupling ABM with a damage scenario (Bachner et al. 2023)

# Modeling indirect losses with the ABM

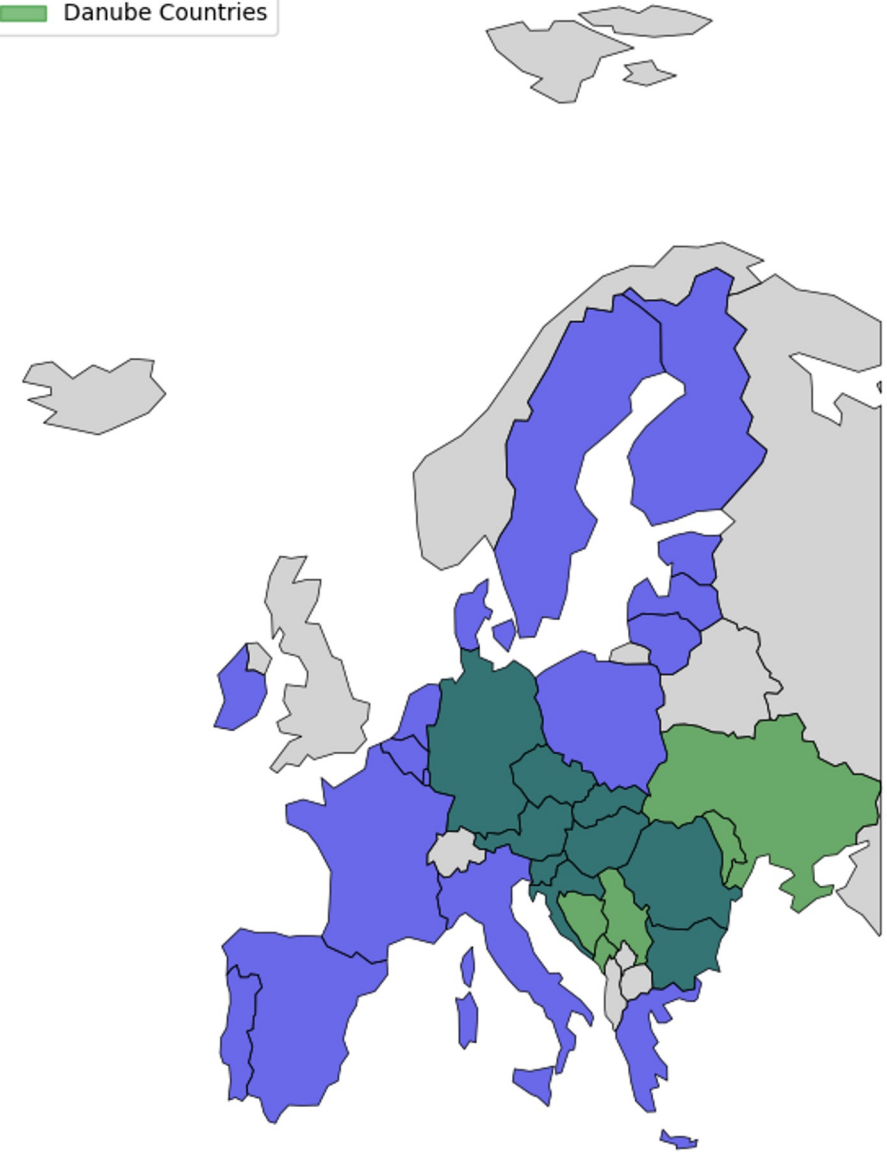


Coupling ABM with a damage scenario (Bachner et al. 2023)

# ABM Overview

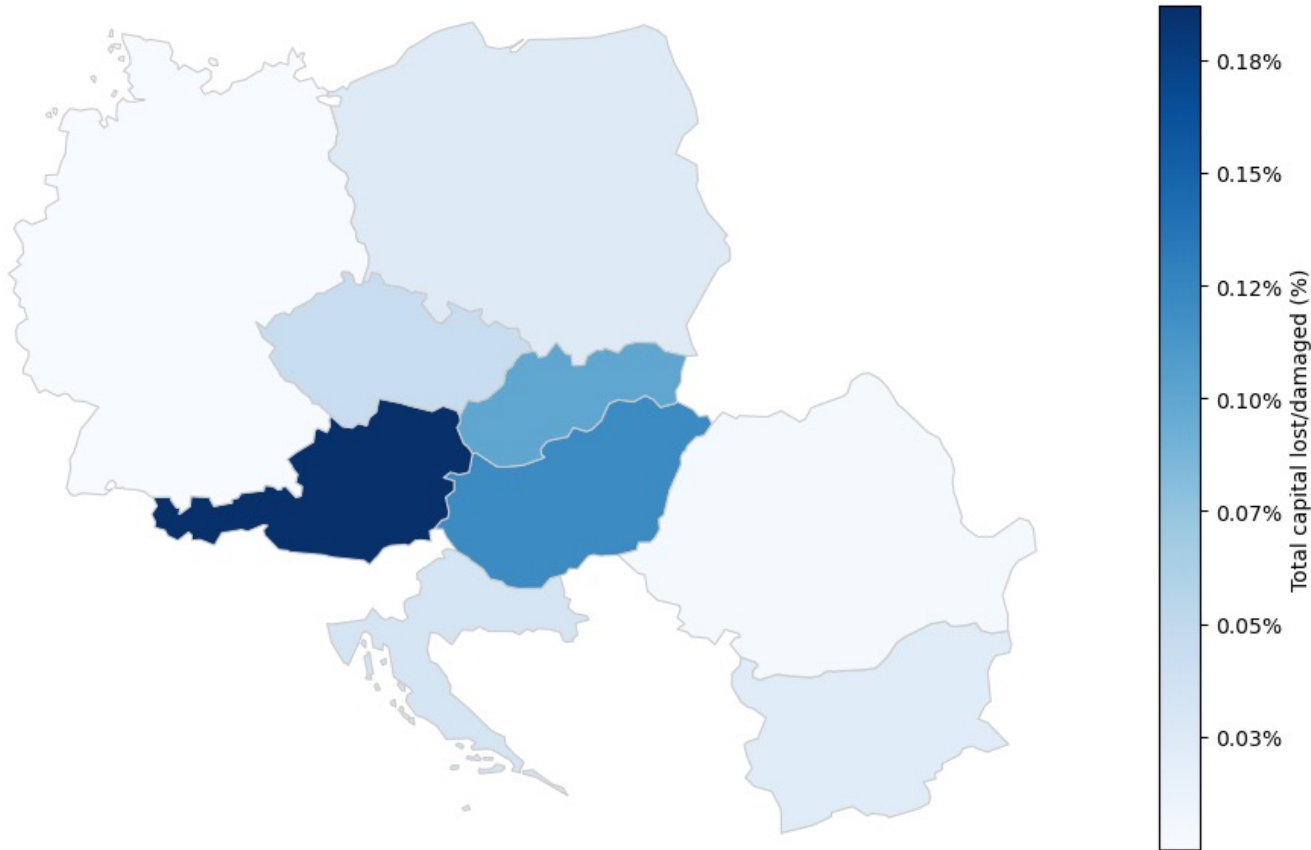
- 26 EU countries (except MT); 237 NUTS-2 regions
  - Including 9 Danube Region countries
- 64 industries (NACE)
  - Calibrated with FIGARO and Eurostat data
- Baseline calibration year: 2016
- 3–5 years time horizon
- Quarterly timestep

EU Countries  
Danube Countries

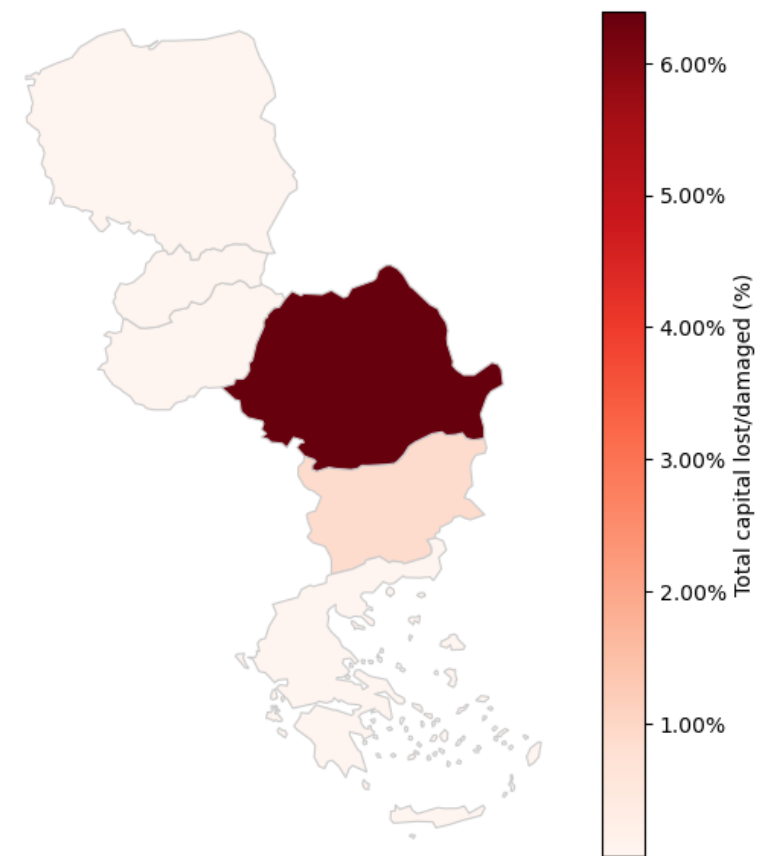


# Damage scenarios: flood and earthquake

Flood scenario

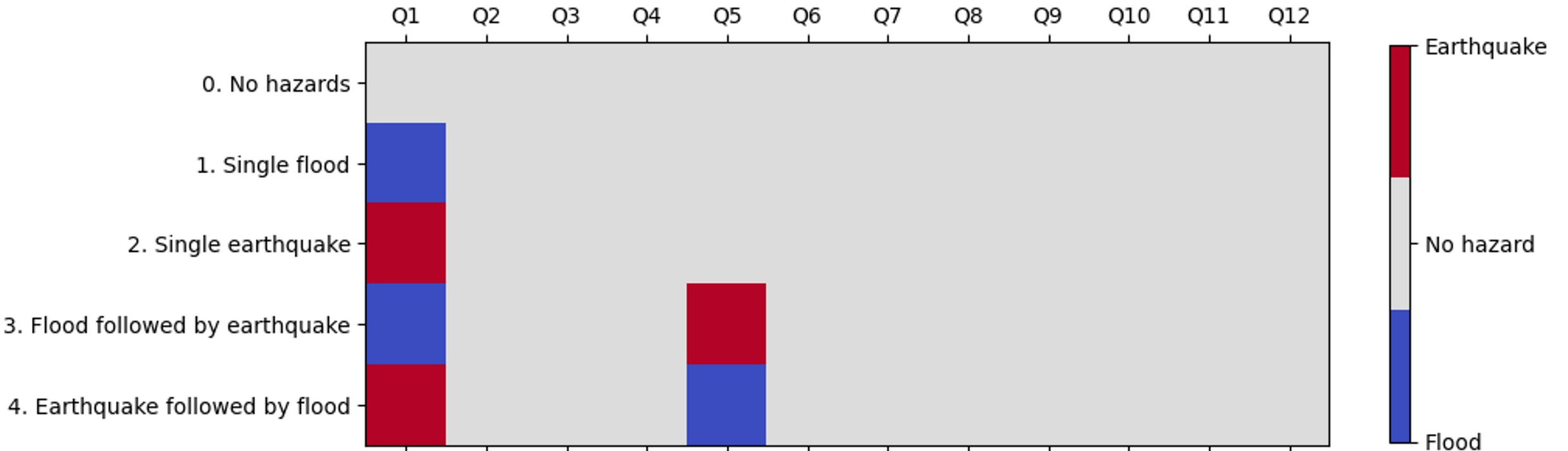


Earthquake scenario



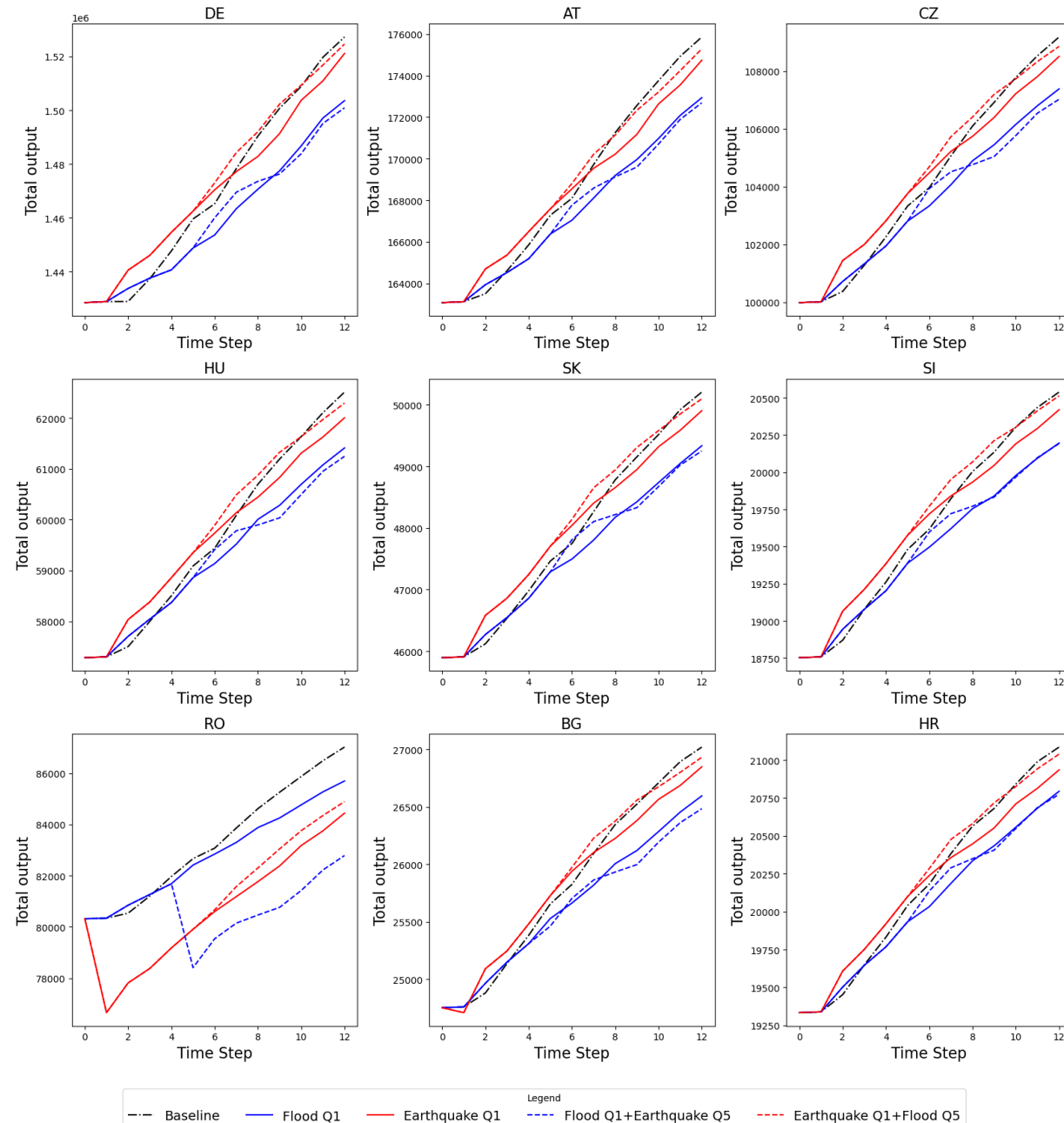


# Modeling single and consecutive hazards



# Impact of shocks on total output

- Single hazards generally reduce the total output compared to the baseline
- Consecutive hazards have a more severe impact, leading to a lower total outputs, particularly, when the flood is followed by the earthquake
- The total output often recovers over time, but does not usually reach the baseline level (particularly in the “flood-first” scenarios)
- The recovery rate can vary significantly between countries and scenarios



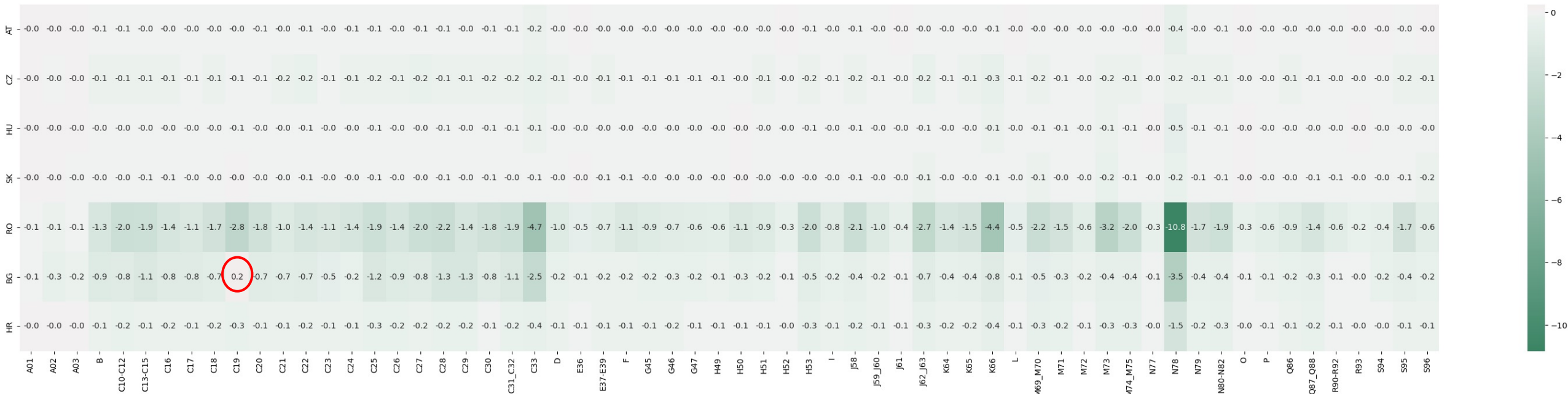
# Measuring indirect risks by industry

$$IR_i = \frac{\Delta GVA_i}{KD_i},$$

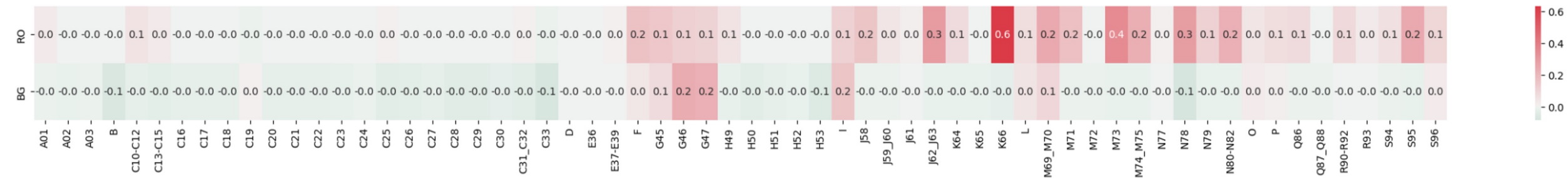
where  $\Delta GVA_i$  is the change in GVA of sector  $i$ , and  $KD_i$  is the capital damage to sector  $i$ 's capital stock

- $IR > 1$  means that the lost GVA is larger than the direct capital damage (“high” indirect risk)
- $IR = 1$  its losses are the same
- $0 < IR < 1$  sectoral GVA loss is smaller than the direct damage (“low” indirect risk)
- $IR < 0$  means that GVA can be increased, even though there is a direct damage to the sector (benefit of a hazard event) (Bachner et al., 2023)

# Indirect risks by industry: flood and earthquake



Initially, virtually all industries (except for **petroleum refinery** in BG) benefit from the shock



Initially, the most severely affected is the **financial sector** in RO

# Thank you for your time!

## Questions?





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