

Integrating agent-based modelling and behavioural data analytics: A case study of climate change farmers' perception in Italy

Sandra Ricart¹, Paolo Gazzotti^{1,3}, Claudio Gandolfi², Andrea Castelletti^{1,3}

¹ Environmental Intelligence for Global Change Lab, Department of Electronics, Information and Bioengineering, Politecnico di Milano, Italy

² Department of Agricultural and Environmental Sciences, University of Milan, Italy

³ RFF-CMCC European Institute on Economics and the Environment (EIEE), Centro Euro-Mediterraneo sui Cambiamenti Climatici, Milan, Italy

Track 1

*Using qualitative data
to inform behavioural rules
in agent-based models*

INTRODUCTION

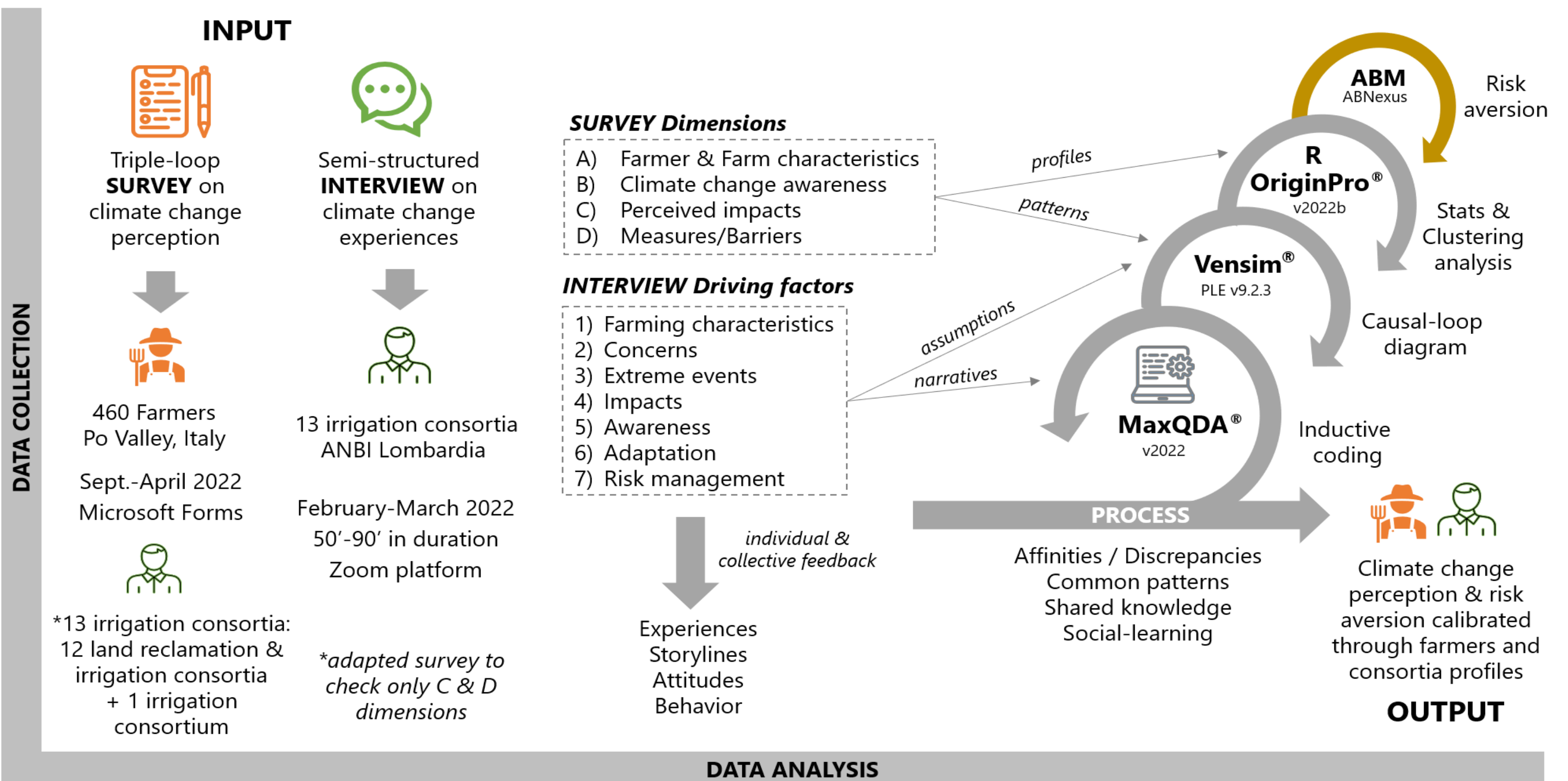
- Agricultural systems** are adversely influenced by **climate change** through increased **water stress**, **change in run-off patterns**, **seasonality fluctuation**, and **temperature variations**.
- Farmers and irrigation consortia** are **valuable sources of first-hand observations** of climate change as they may provide a deeper understanding of their manifestation, relevance, and effects, but also promote adaptation measures.
- Perception is a complex process** that encompasses a range of **psychological constructs** such as previous knowledge, beliefs, attitudes, and concerns about if and how climate changes.
- Social learning from bottom-up approaches and tools** (survey, interviews) can **reinforce system dynamics** and Agent-Based Models (ABM) through individuals' and stakeholders' narratives, and map the social network with agents' interactions.

CASE STUDY: THE LOMBARDY REGION

- An agricultural cluster:** ≈52,000 farms distributed in less than 600,000ha (25% of the irrigated area at the national level).
- An intricate system** of rivers, lakes, regulated reservoirs, and channels.
- Subalpine hydrometeorological regime:** dry periods in winter/summer & peaks in late spring/autumn fed by snowmelt and rainfall.
- Extreme events:** hydrological (flash floods), climatological (convective storms, droughts) & meteorological (cold and heat waves).

AIM & METHODS

To analyse **behavioural data on climate change from farmers' and irrigation consortia's perceptions** as the first step **to build risk aversion profiles** for coupling an agent-based model with a distributed agrohydrological model (ABNexus) that covers the irrigation district of the **Adda river, Lombardy region, Italy**.



RESULTS

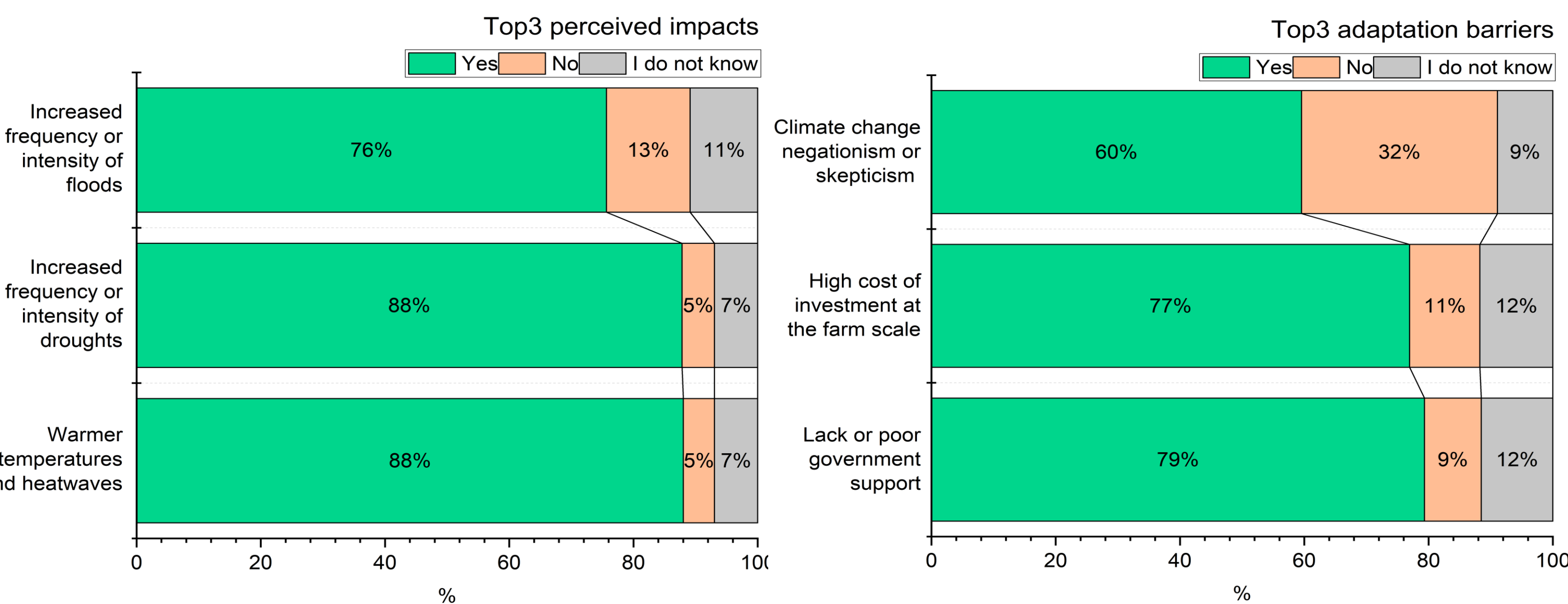
Farmer dominant profile
Man, 45-64y, higher education, experience >30y, union farm and consortia membership, non off-farm activity, no succession intention

Farm dominant characteristics
Size >20ha, irrigated, conventional crops (maize), livestock, fertilizers use, irrigation canal as water source, non renewable energy use

CLIMATE CHANGE AWARENESS

- Climate change is the single most **serious problem** (85%)
- Multifunctionality** is slightly **more exposed** to climate change than rainfed and irrigated **crops & livestock**
- Individuals are more responsible** than EU and economic sectors for tackling climate change adaptation

CLIMATE CHANGE PERCEPTION AND ADAPTATION



Most promoted adaptation measures

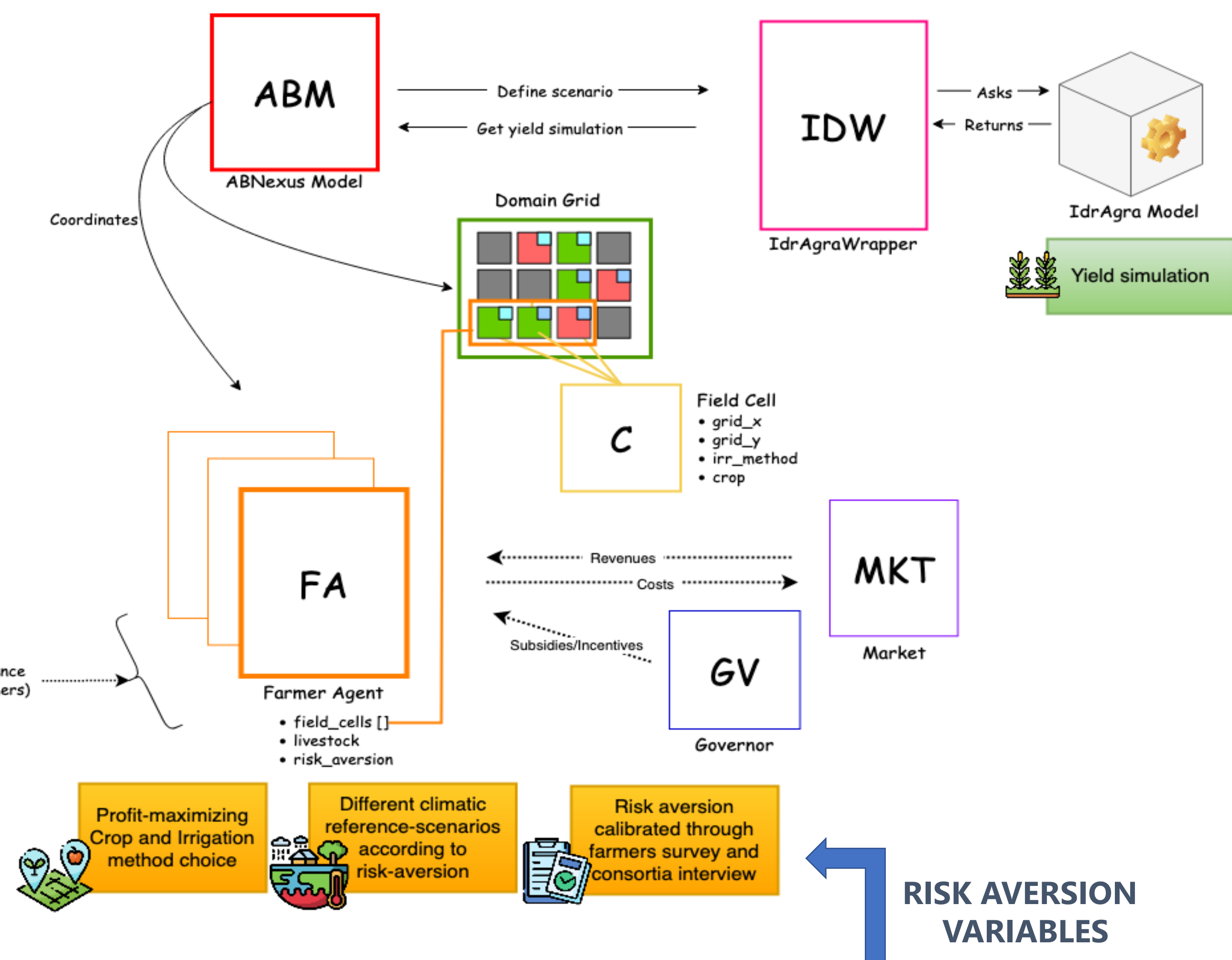
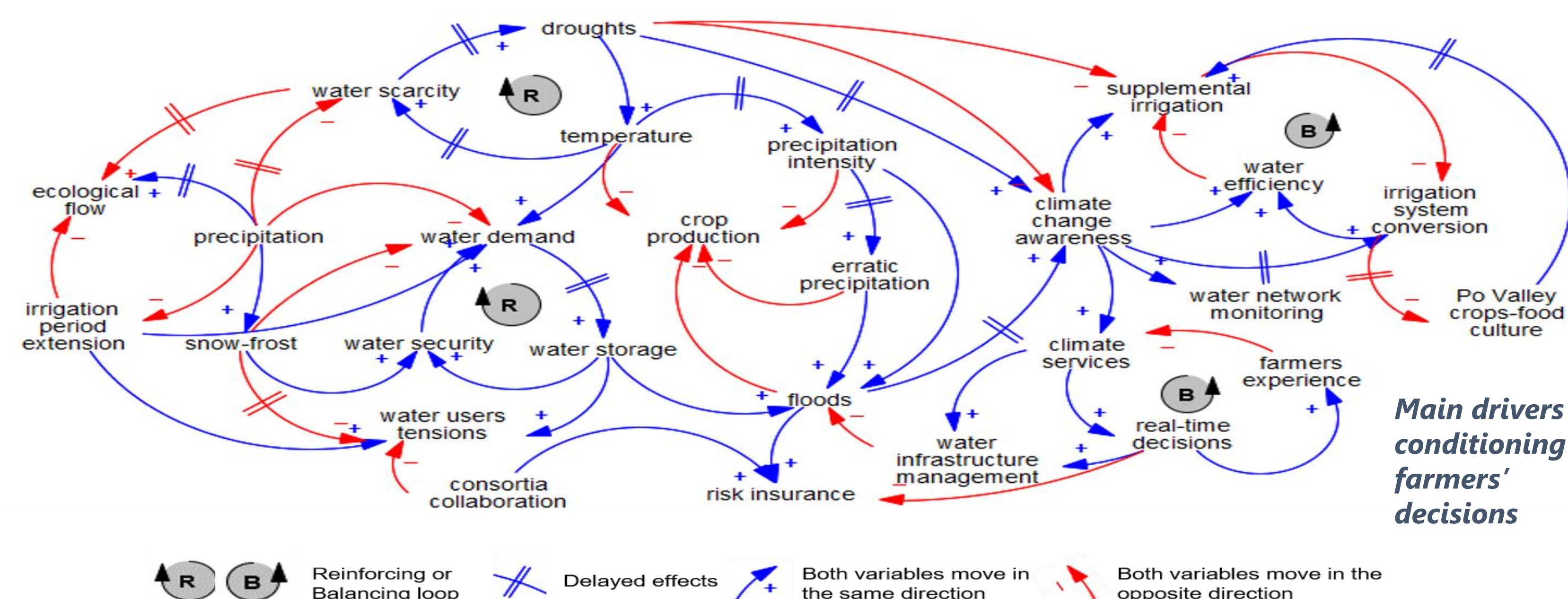
- Weather services (79%)
- Reduce fertilizers' use or improve their efficiency (70%)
- Crop diversification and rotation (67%)

Irrigation consortia's perspectives – Farmers heuristics

- A neighbourhood effect:** small farmers (**C4**) in proximity exhibit similar risk adaptation preferences, especially by introducing water-saving practices or supplying supplementary irrigation.
- Farmers are conservative**, and their **attitudes tend to change depending on** personal **experiences** through the **years**, and notably after suffering economic losses in a mid-term period.
- Young farmers (**C2-C4**) lead the **modernisation and innovation process**, eminently in water efficiency techniques.

FEEDBACK

reinforcing



Social focus

- Education, age & farming experience
- ❖ **Succession intention** (no consensus)
- ❖ **Consortium membership** (no consensus)

Agricultural focus

- Farm size, production system, fertilizers use & irrigation method
- ❖ **Crops/Livestock** (no consensus)

SURVEY CLUSTERING

- C1 Medium farms** (46%) old, low education, high experience
- C2 Rainfed** (16%) young, high education, low experience
- C3 Big farms** (31%) old, low education, high experience
- C4 Small farms** (7%) young, high education, low experience
- C1/C3:** annual forages
- C2:** vineyards & grasslands
- C4:** vineyards & vegetables
- ❖ **Maize + livestock** (all)
- AWARENESS:** C4 is the most concerned / small differences between clusters
- PERCEIVED IMPACTS:** C4 highest perception / C1-C4 more floods / C3-C4 pest infection
- ADAPTATION MEASURES:** C3-C4 highest application / C2 asking for cooperation
- ADAPTATION BARRIERS:** C3-C4 highest barriers / C4 negationism-skepticism
- ❖ **"I do not know" answer:** C2 (the 'doubtful' cluster) / C4 (the 'self-confident' cluster)

REMARKS AND FUTURE RESEARCH

- Surveys & interviews** recap qualitative data to **reinforce ABMs**.
- Farmers and consortia's heuristics** can be used to determine **risk aversion** in ABMs.
- Farmers and consortia are **aware of climate change**, **perceiving similar impacts** (↑ increase and extreme events), **but differing about adaptation strategies: soft measures by farmers** (e.g., crops, insurance, weather services) or **hard measures by the consortia** (e.g., water storage).
- Causal Loop Diagrams** can be used to **identify drivers and interactions** between climate change impacts and adaptive capacity.
- Future research** should target how **farmers' imitation attitudes** can increase adaptive capacity and how consortia, together with farmers' unions, can serve as peer groups for **social-learning and knowledge transfer**.