

# Simulating sustainability

Challenges and opportunities in open-source agent-based platforms for supporting transdisciplinary approaches

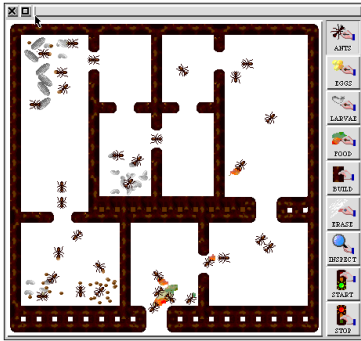


<http://across-lab.org>

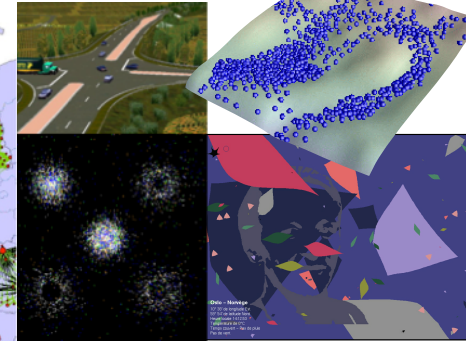
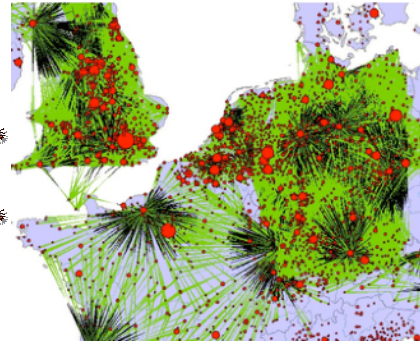
Alexis Drogoul, IRD — SIMULTECH 2024



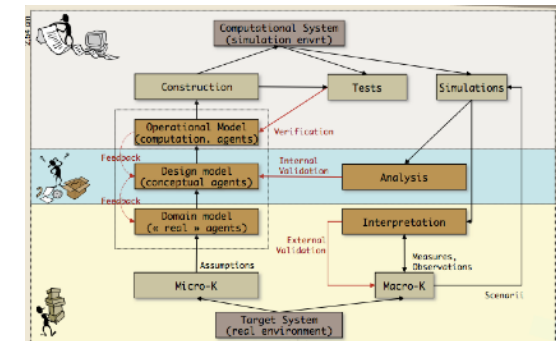
# Early career was devoted to Artificial Life, i.e. building a virtuous circle between agent-based simulation, collective robotics and AI



Manta (Agent-Based Modeling)



SimPop2, Archisim, Garden of Chances, Rivages...



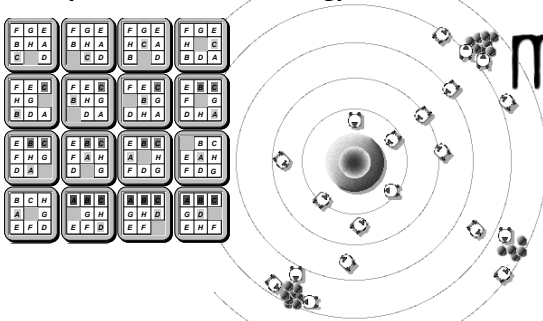
Agent-Based Meta-Modeling

PhD at Paris 6 University, from 1990 to 1993

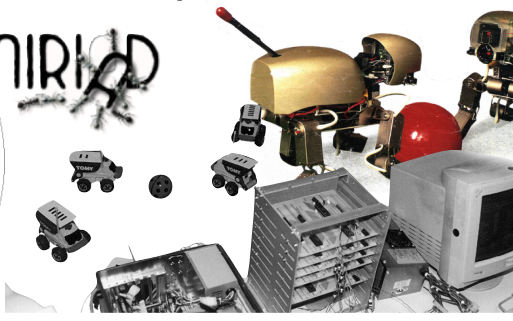
Assistant Professor at Paris 6, from 1995 to 2000

Full Professor at Paris 6, from 2000 to 2004

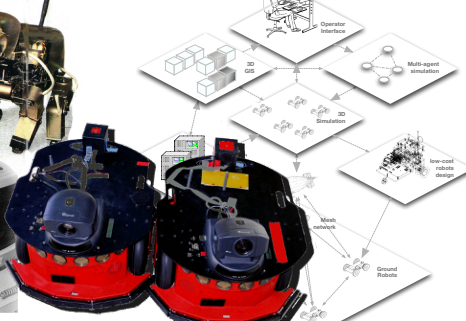
EPS (Eco-Problem Solving)



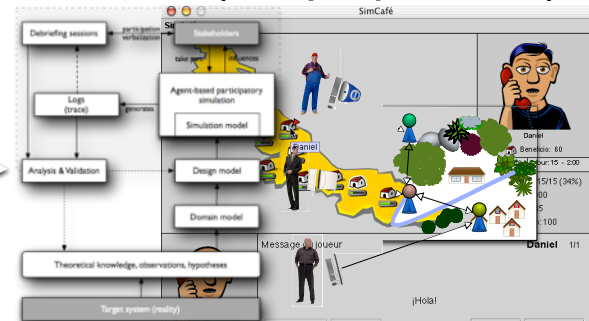
RoboCup



Microbes Social Robots

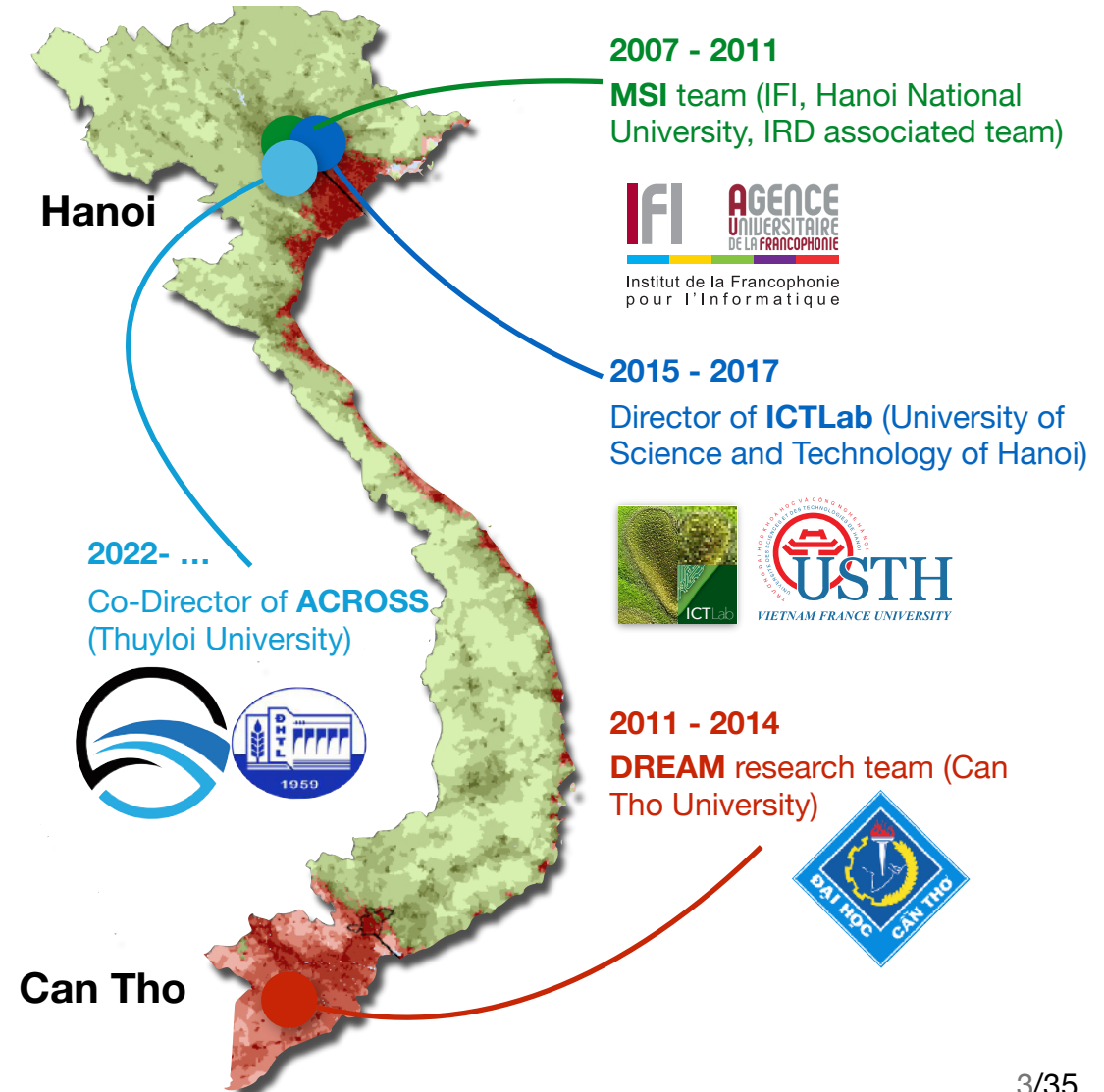


ComMod (Participatory Simulations)



# I moved in 2005 to , for which I have been working in Vietnam since 2007.

- As the head of 4 joint research teams (MSI, ICTLab, DREAM, ACROSS)
- As the designer of the GAMA modelling and simulation platform
- As the deputy director of the maths/computer science team UMMISCO hosted by Sorbonne Université





# is a French public institute that undertakes research & capacity building activities in sustainability science

- 75 research units (jointly with other institutions)
- 77 International laboratories (in partner countries)
- 850 researchers (60% abroad) and a community of 7000 researchers
- Over 2000 publications/year, 60% in co-publication with partners

**ECOBIO** Ecology, biodiversity and functioning of continental ecosystems

**OCEANS** Oceans, Climate and Resources

**DISCO** Internal dynamics and continents surface

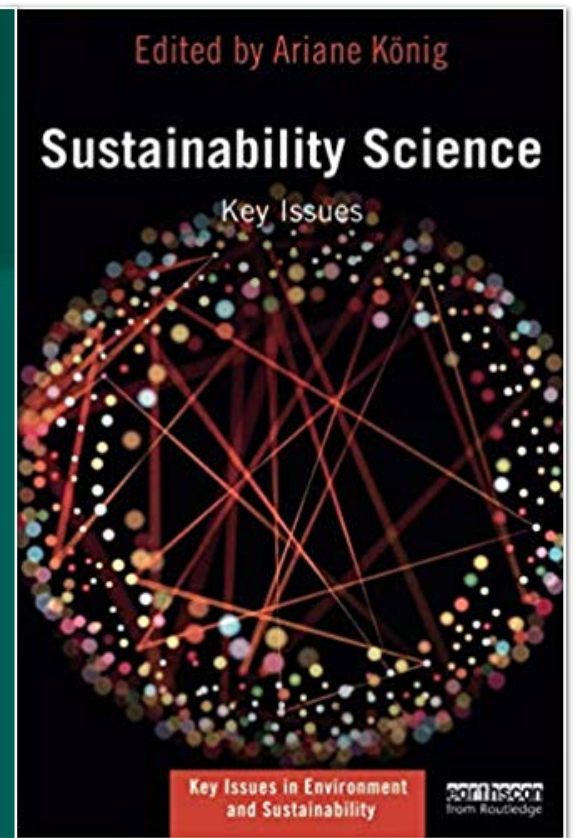
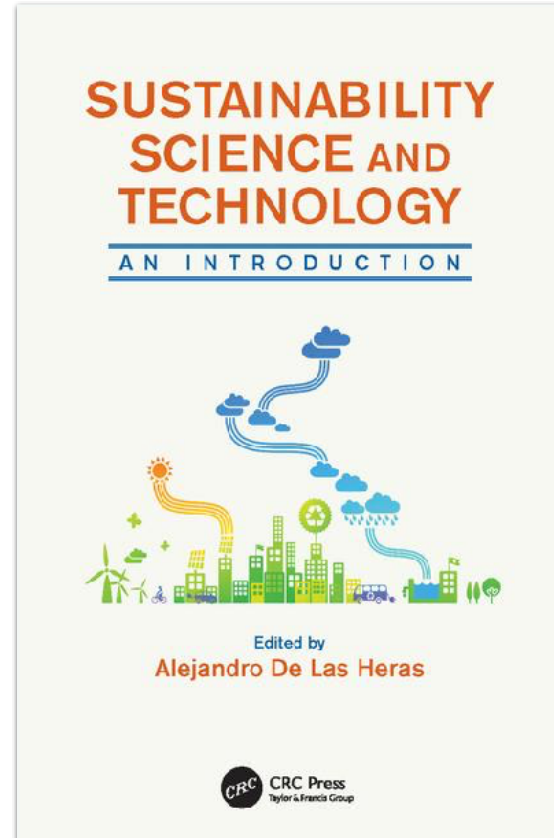
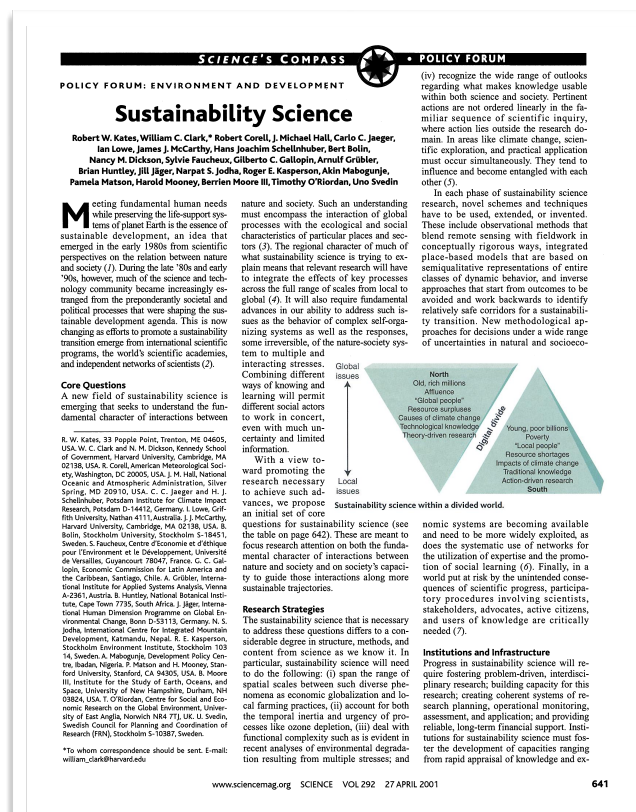
**SOC** Societies and globalisation

**SAS** Health and Societies





# "Sustainability science" was introduced as an emerging research field with a seminal article in 2001.



Kates, R.; Clark, W.; Corell, R.; Hall, J.; Jaeger, C.; et al. (2001). "Sustainability science". Science. 292 (5517): 641–642.

# Sustainability science is an **interdisciplinary research domain** seeking to facilitate the design of interventions that foster shared prosperity and reduced poverty while protecting the environment



Sustainability science is **science about sustainability**, to understand how complex physical, biological and social systems function; and it is **science for sustainability**, to support sustainable policies and positive social transformations.

**UNESCO**, Sept. 2023

<https://www.unesco.org/fr/management-social-transformations-most-programme/sustainability>



<https://sdgs.un.org/gsdrgsd2023>

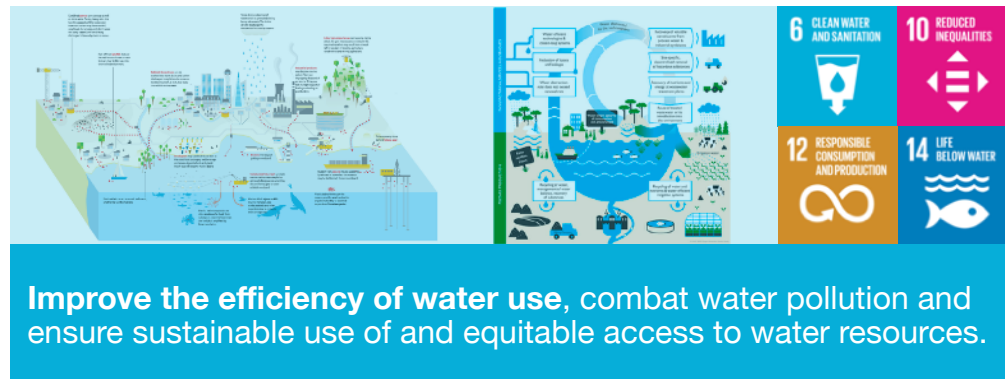


It is characterised by the use of **transdisciplinary methodologies**, [based] on the co-construction of knowledge and know-how, based on collaboration between scientists from different disciplines and non-academic players, in a participatory and committed approach.

**IRD**, June 2020

<https://www.ird.fr/en/sciencedeladurabilite>

# The problems tackled by sustainability science are therefore characterised by the concomitant objectives of understanding and decision support, as well as by attention to stakeholder participation.



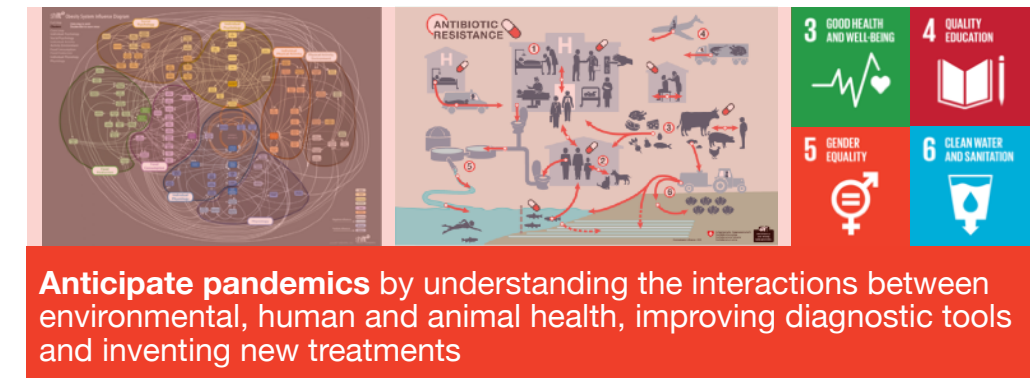
Pham Van, C., & Nguyen-Ngoc, D. (2022). Multiple linear regression and long short-term memory for evaluating water levels in irrigation and drainage systems: an application in the Bac Hung Hai irrigation and drainage system. *Water Supply*, 22(12), 8587-8602.



Traore Cheick Amed Diloma Gabriel, Delay Etienne, Diop Djibril, Bah Alassane. 2024. Sahelian transhumance simulator (STS). *Software Impacts*, 19:100627, 4 p. <https://doi.org/10.1016/j.simpa.2024.100627>



A Laatabi et al., Assessing Public Transport Strategies in Marrakesh using ABMS, in *The 15th International Conference on Ambient Systems, Networks and Technologies (ANT)*, *Procedia Computer Science*, 2024

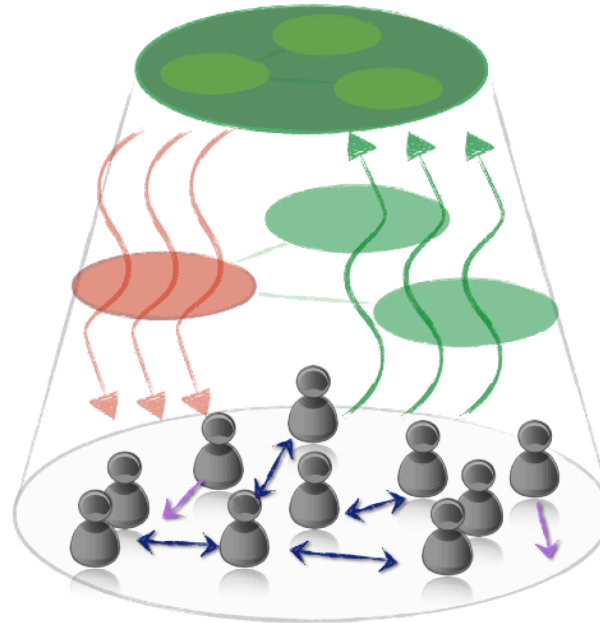


J. Azanzi, H. Tapamo, G. Camara, Combining Scrum and Model Driven Architecture for the development of an epidemiological surveillance software, *Revue Africaine de Recherche en Informatique et Mathématiques Appliquées*, 2023,



# However, understanding, decision-making and participation come up against the complexity of the systems studied

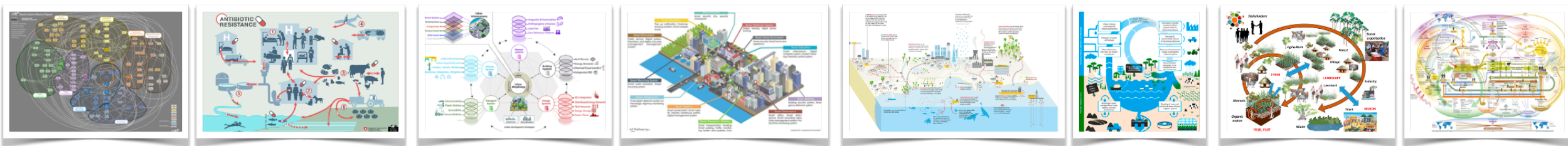
**Multiple components**, players, interests, points of view, scales of analysis depending on the issue.



**Emergence of collective structures** and behaviours that cannot be deduced from the individual properties of components

Evolution dependent on the **self-organisation** of components and **non-linear interactions** between them.

**Dynamic adaptation** and changes of state, with no predefined plan or scheme



Hedelin, B. **Complexity is no excuse**. Sustainability Science 14, 733–749 (2019). <https://doi.org/10.1007/s11625-018-0635-5>

# We need to offer tools and methods that support interdisciplinarity, different scales and viewpoints in order to:



**Improve understanding** of the emerging dynamics of the systems studied,  
**Explore trajectories and scenarios** of development of these systems,



**Anticipate the impact** of policies or interventions on their development,  
**Support public decision-making** on sustainable development,



**Provide platforms for interdisciplinary experimentation**, collaboration and creativity,  
**Provide mediation and negotiation tools** to the stakeholders concerned.

# Which methods ? Which tools ? Let's start with a quiz !

**Final resolution of COP28 in 2023 ?**

*We recognize that a global equilibrium can become a reality only if the lot of the so-called developing countries is substantially improved (...). We affirm that the global issue of development is (...) closely interlinked with other global issues (...), including in particular those of man's relationship with his environment.*

**Presentation of SDGs by the UN in 2015 ?**

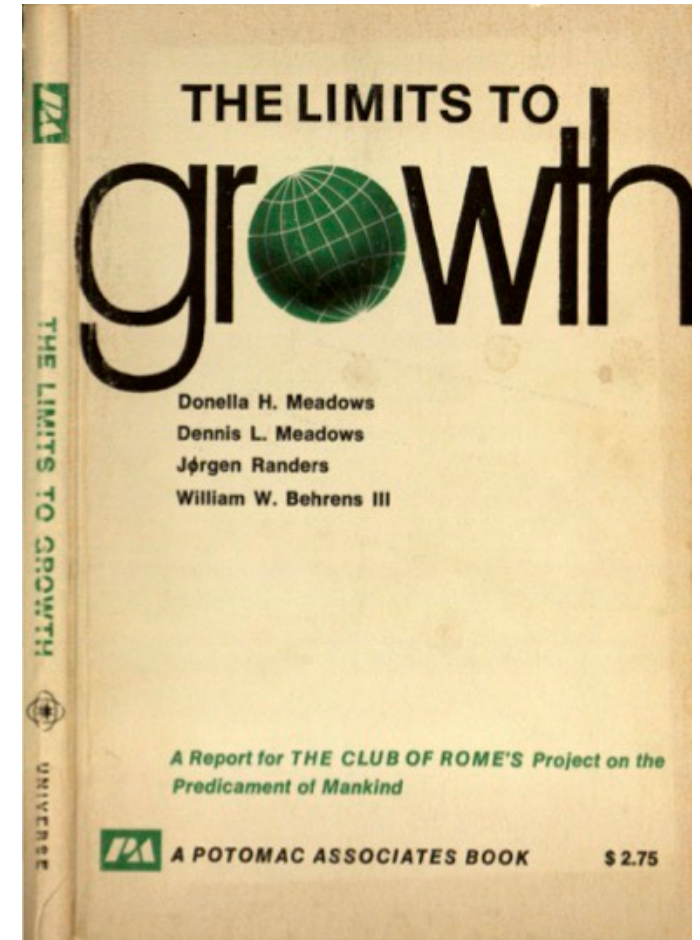
*We are unanimously convinced that rapid, radical redressment of the dangerously deteriorating world situation is the primary task facing humanity. (...) This supreme effort is a challenge for our generation. It cannot be passed on to the next. The effort must be resolutely undertaken without delay, and significant redirection must be achieved during this decade.*

**Last IPCC report in 2023 ?**



# "Limits to Growth" / "Meadows' report" in 1972

- Commissioned from MIT by the Club of Rome in 1970, published in 1972
- Realisation of the unsustainability of exponential growth in a finite environment by linking :
  - accelerating industrialisation ;
  - strong growth in the world's population ;
  - persistent global malnutrition ;
  - depletion of non-renewable natural resources;
  - environmental degradation.
- **First (public) references to concepts such as sustainable development, ecological footprint (or collapse)**



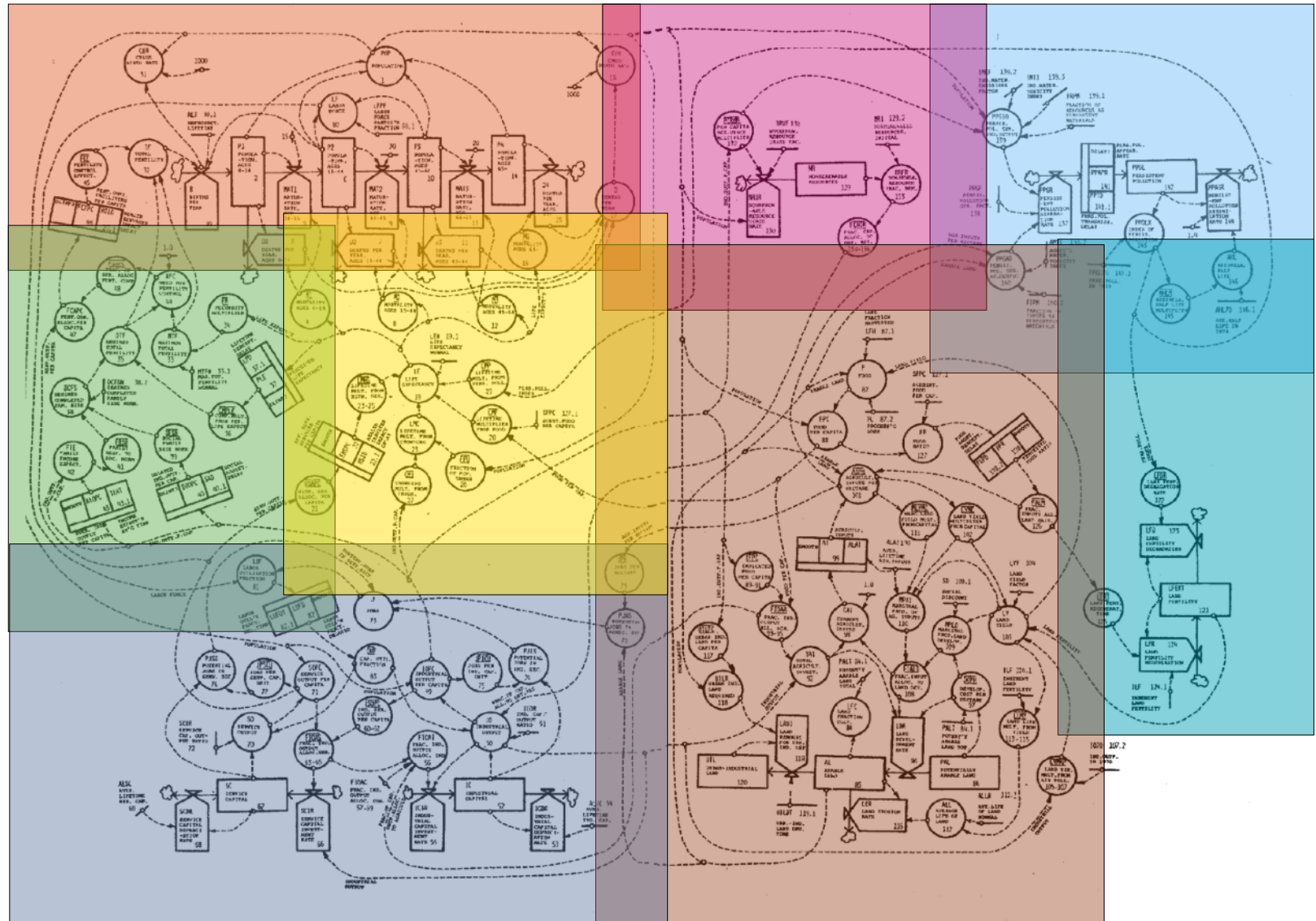
<http://www.donellameadows.org>

# World3

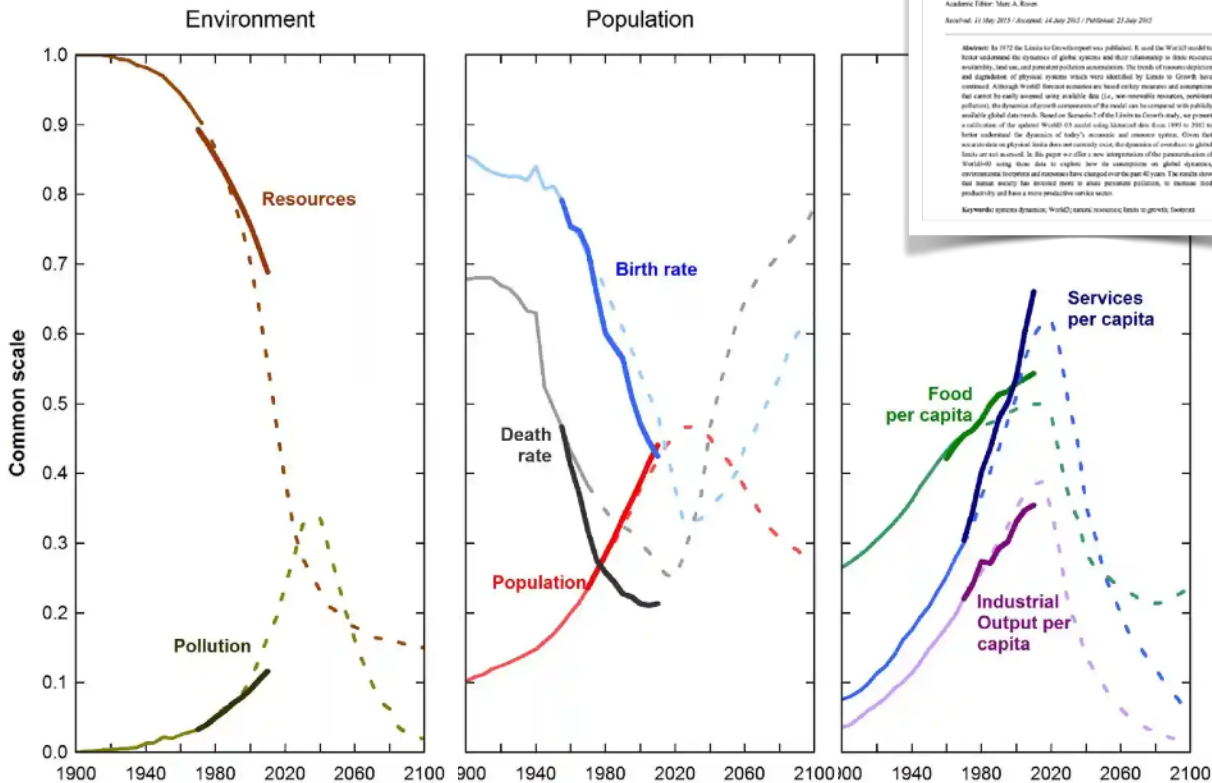
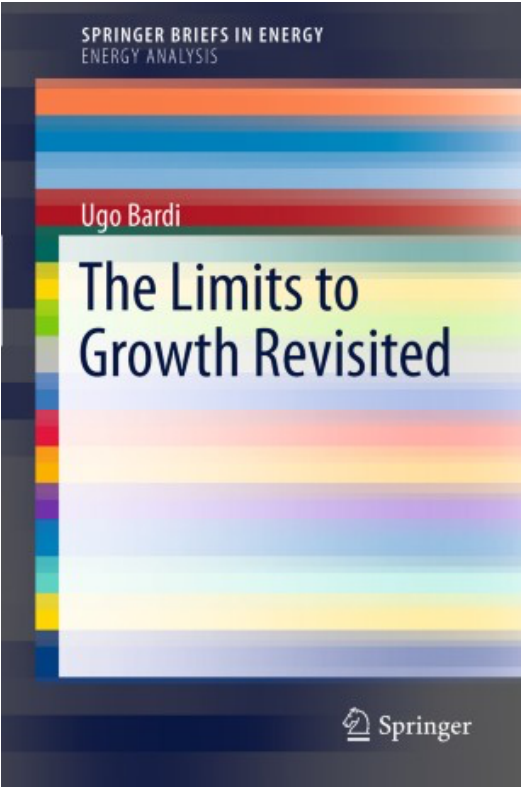
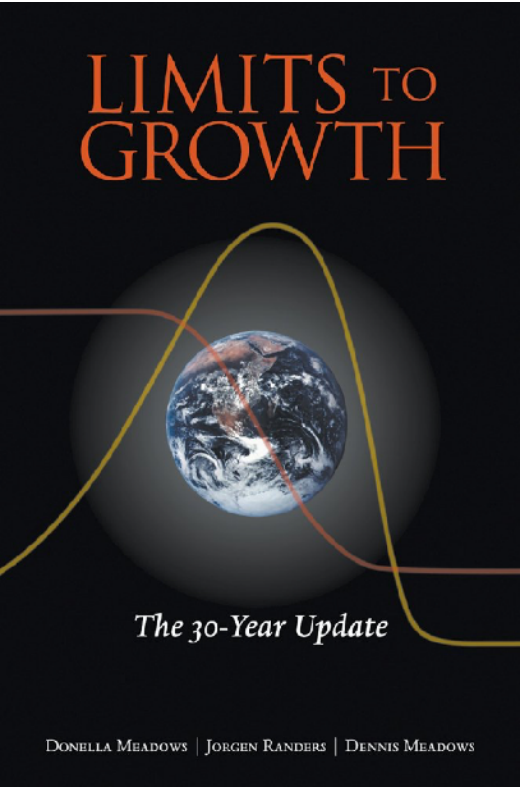
World3 is a set of interconnected thematic sub-models linked by non-linear feedback loops.



**Open Modelica  
implementation  
available here:**



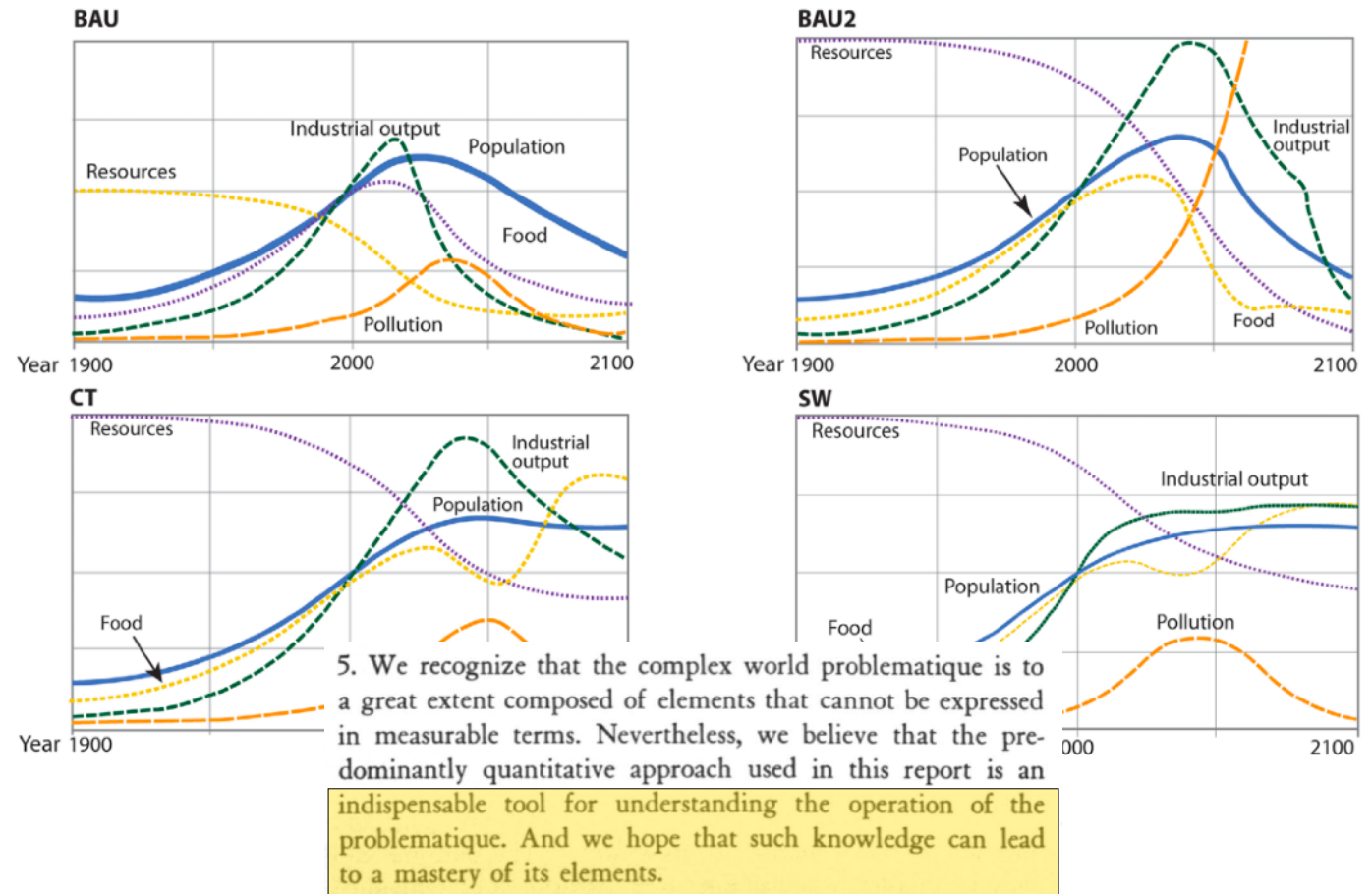
# LTG's merit: since 1972, the debate on "sustainability" is no longer based on intellectual posturing, but on the results of simulations of models available to everyone.





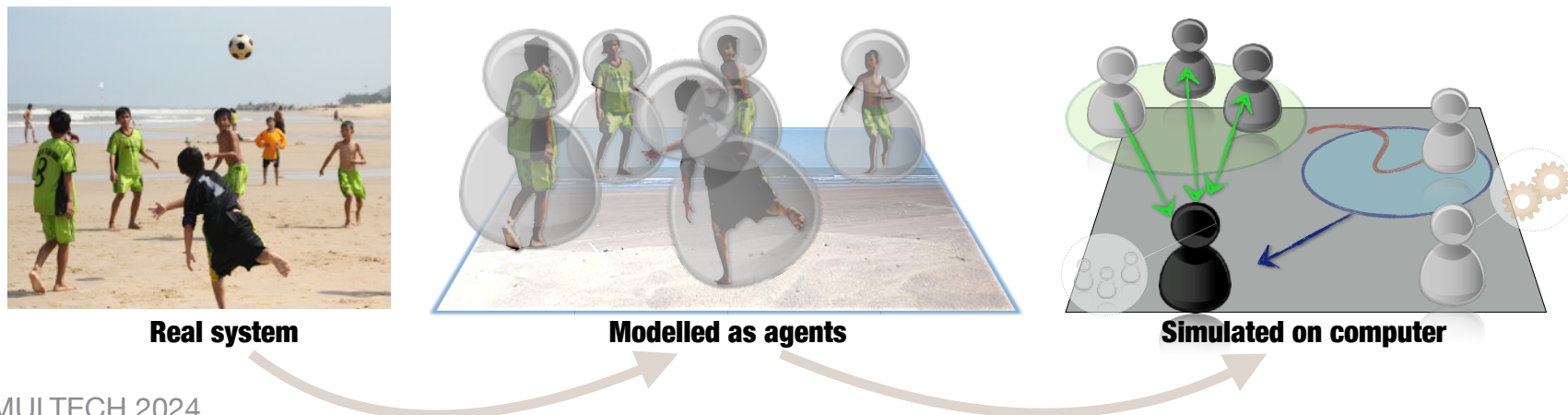
# However, if World3 is helpful in identifying different scenarios it cannot support decision-making

- The role of World3 is to raise awareness on global problems, not to represent and help formulate their (generally) local solutions
- If we want to have an impact, with models, on the design of sustainable solutions, **we need to embrace in models the various scales at which solutions can be formulated** and understand their effects



# One solution for addressing complex sustainability problems is to use **Agent-Based Models (ABM)** as a basis for integrated models

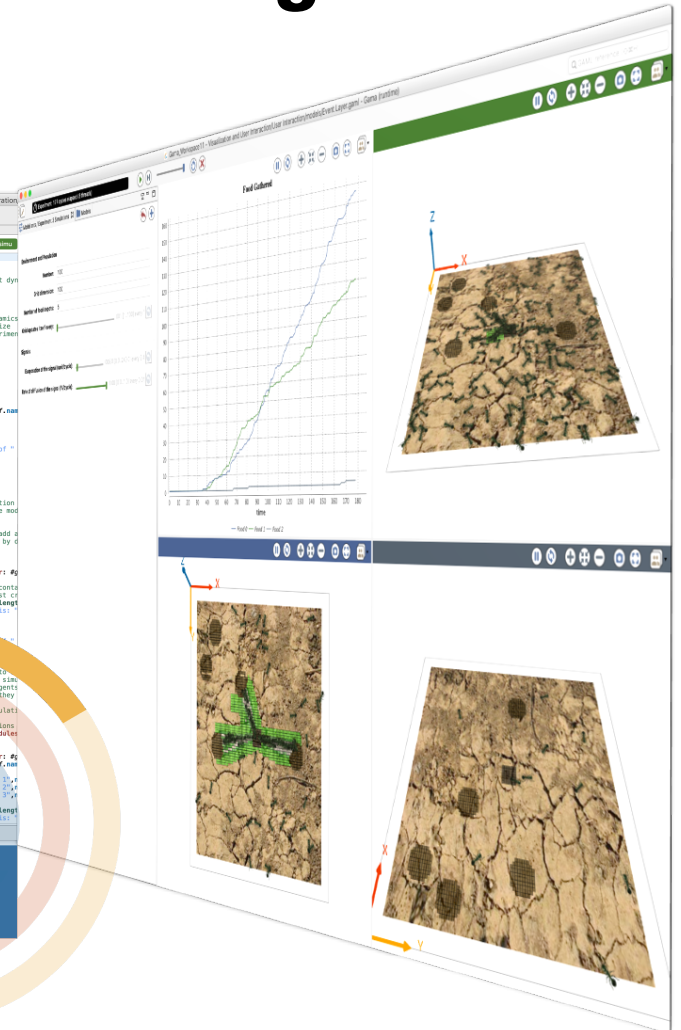
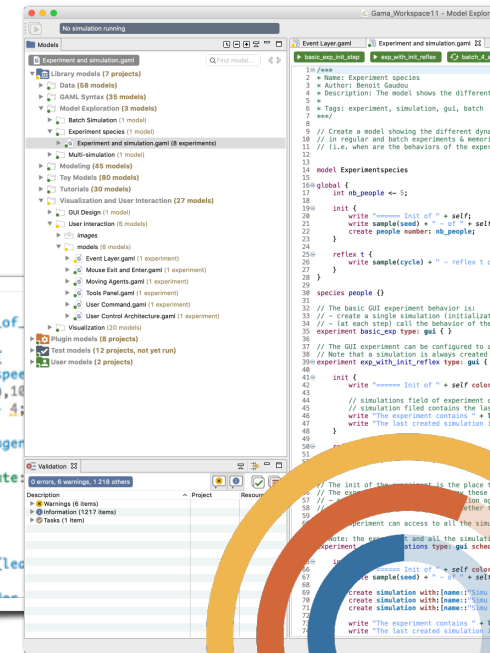
- **ABM is a versatile data-driven approach:** in addition to quantitative data one can incorporate qualitative data, e.g. rules, narratives, or social knowledge;
- **ABM is generative:** allows to explore "what-if" scenarios and the emergence of properties in virtual worlds;
- **ABM is modular:** the ability to add or remove entities during simulations provides flexibility when building a model;
- **ABM is agnostic:** any formalism can be used to express the dynamics of agents, and different modelling approaches can coexist in the same model.
- **ABM accepts heterogeneity:** agents can represent any entity or aggregation of entities, at any time / space scales



# ABM platforms like GAMA support building integrated models that combine multiple modelling paradigms, including physical models, and operate on real data



```
environment width: width_and_height_of...
ities {
  species cells skills: [moving] {
    const speed type: float <- speed
    rgb color <- [100 + rnd(155), 100 + rnd(155), 100 + rnd(155)]
    float size min: 1 max: 10 <- 4
    int strength <- 0
    float range min: range_of_agents
    cells leader <- self
    int heading <- rnd(359) update:
    reflex move {
      do move
    }
    reflex change_leader when: (leader < 0)
    if grow_leader {
      create_simulation_with_name: "grow_leader"
    }
  }
}
```



<https://gama-platform.org>

Taillandier, P., Gaudou, B., Grignard, A., Huynh, Q. N., Marilleau, N., Caillou, P., ... & Drogoul, A. (2018). Building, composing and experimenting complex spatial models with the GAMA platform. *GeoInformatica*, 1-24.



# GAMA is a **free and open-source** modelling and simulation platform created in Vietnam in 2007, developed since then by an international consortium



## France

IRD (PI), CNRS, INRAE, University of Toulouse 1 Capitole, University of Paris Sud, University of Rouen

A. Drogoul, B. Gaudou, P. Taillandier, N. Marilleau, K. Chapuis, P. Caillou, A. Brugière, Nguyen Huu Tri, Y. Sklab, JD Zucker



## USA

MIT Media Lab  
Cambridge, MA

A. Grignard



**Netherlands**  
Delft University of  
Technology

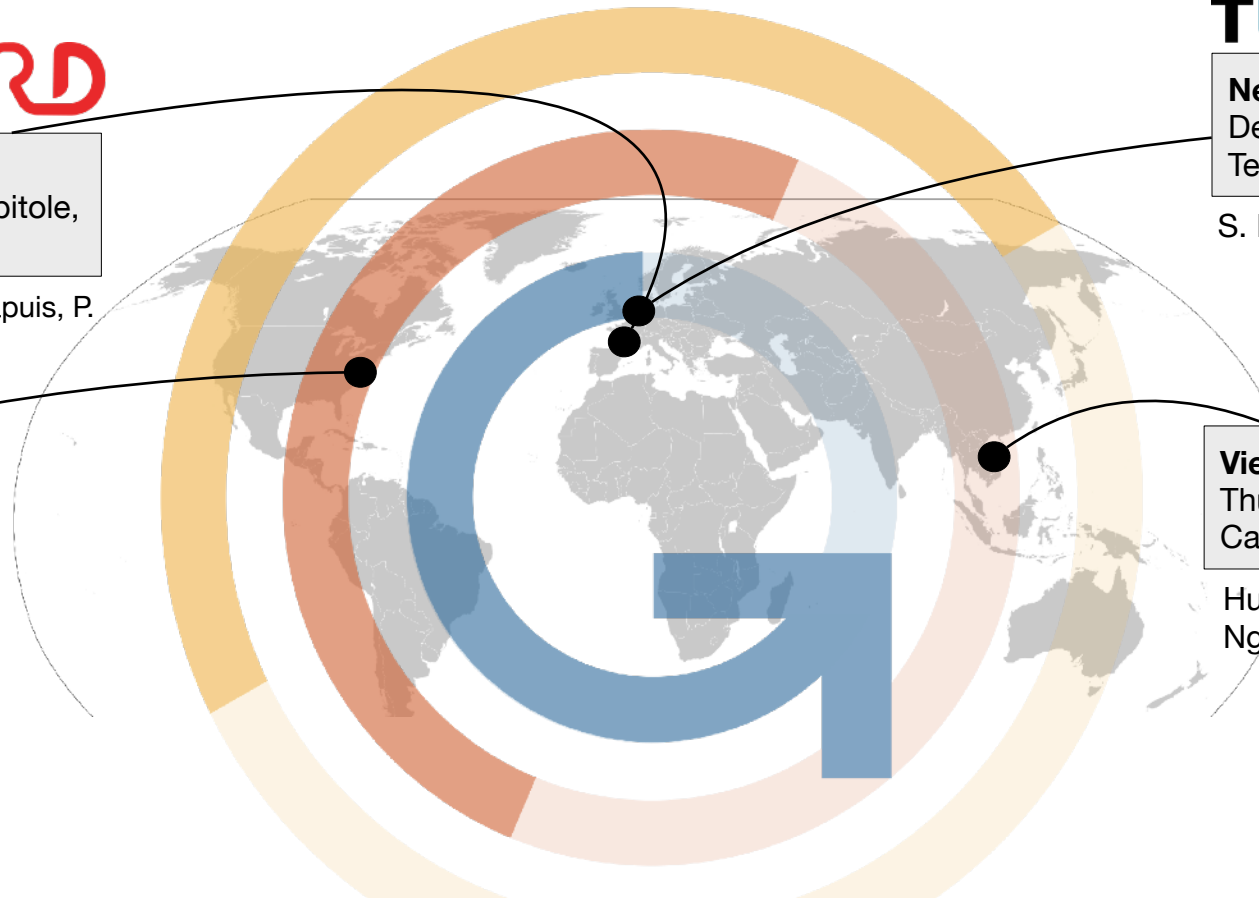
S. Bhamidipati



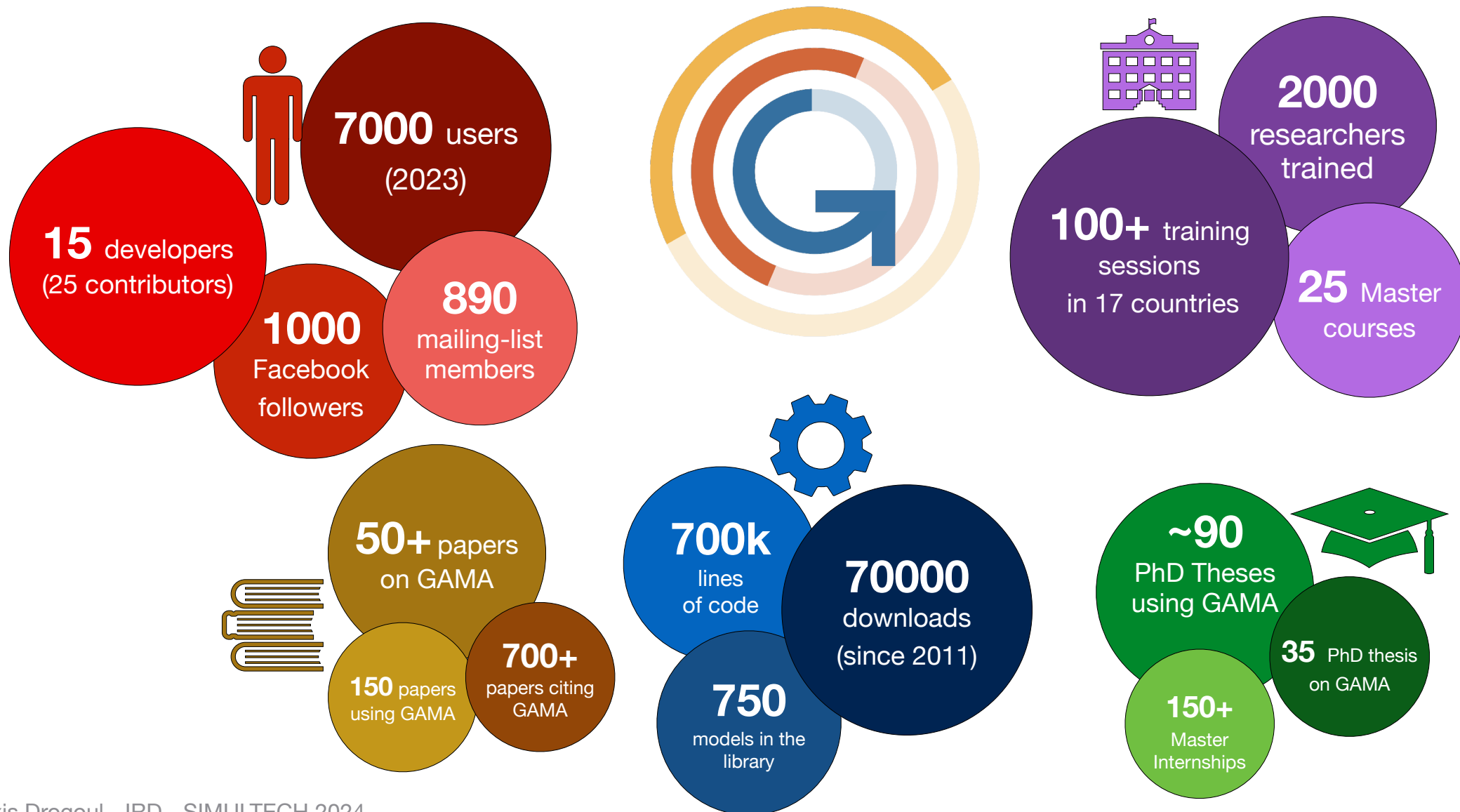
## Vietnam

Thuyloi University,  
Can Tho University

Huynh Quang Nghi,  
Nguyen Ngoc Doanh

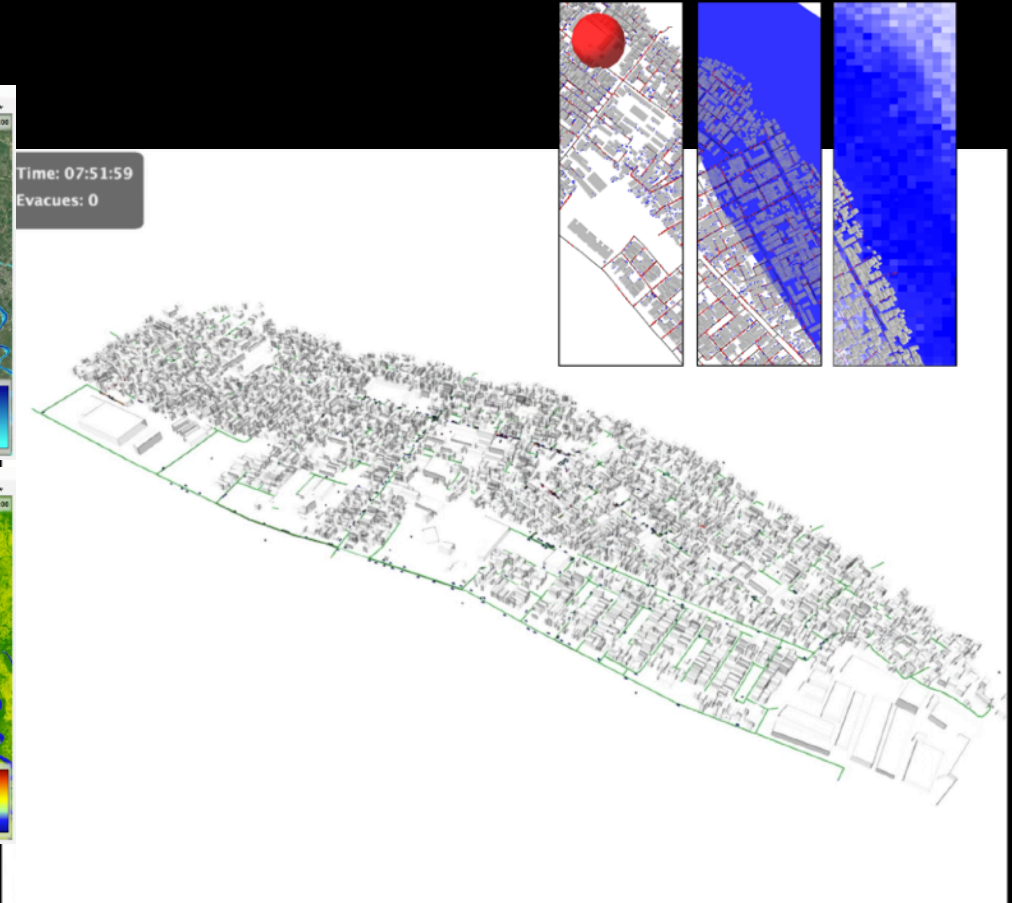
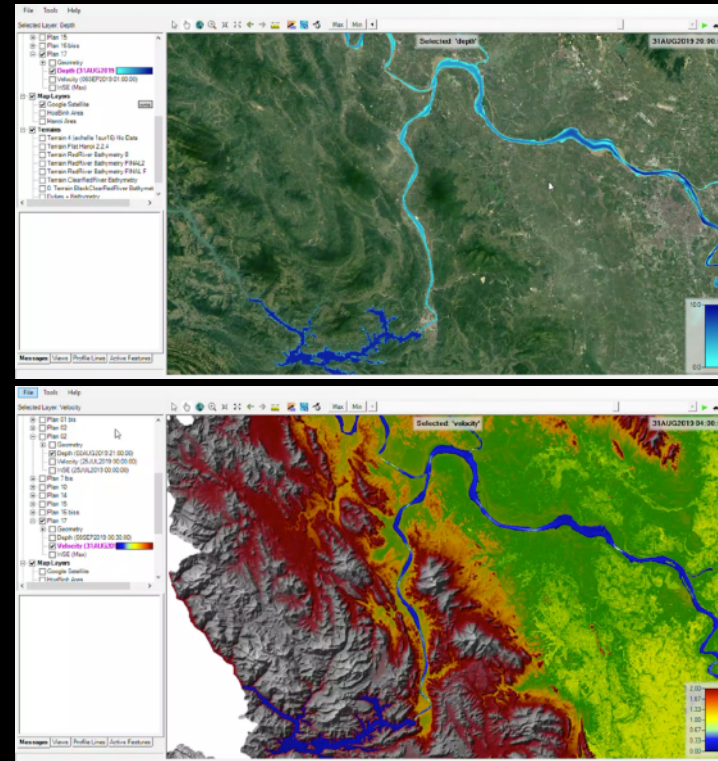


# GAMA in a few figures



# Example : ESCAPE, exploring the best evacuation strategies in different scenarios in Phuc Xa

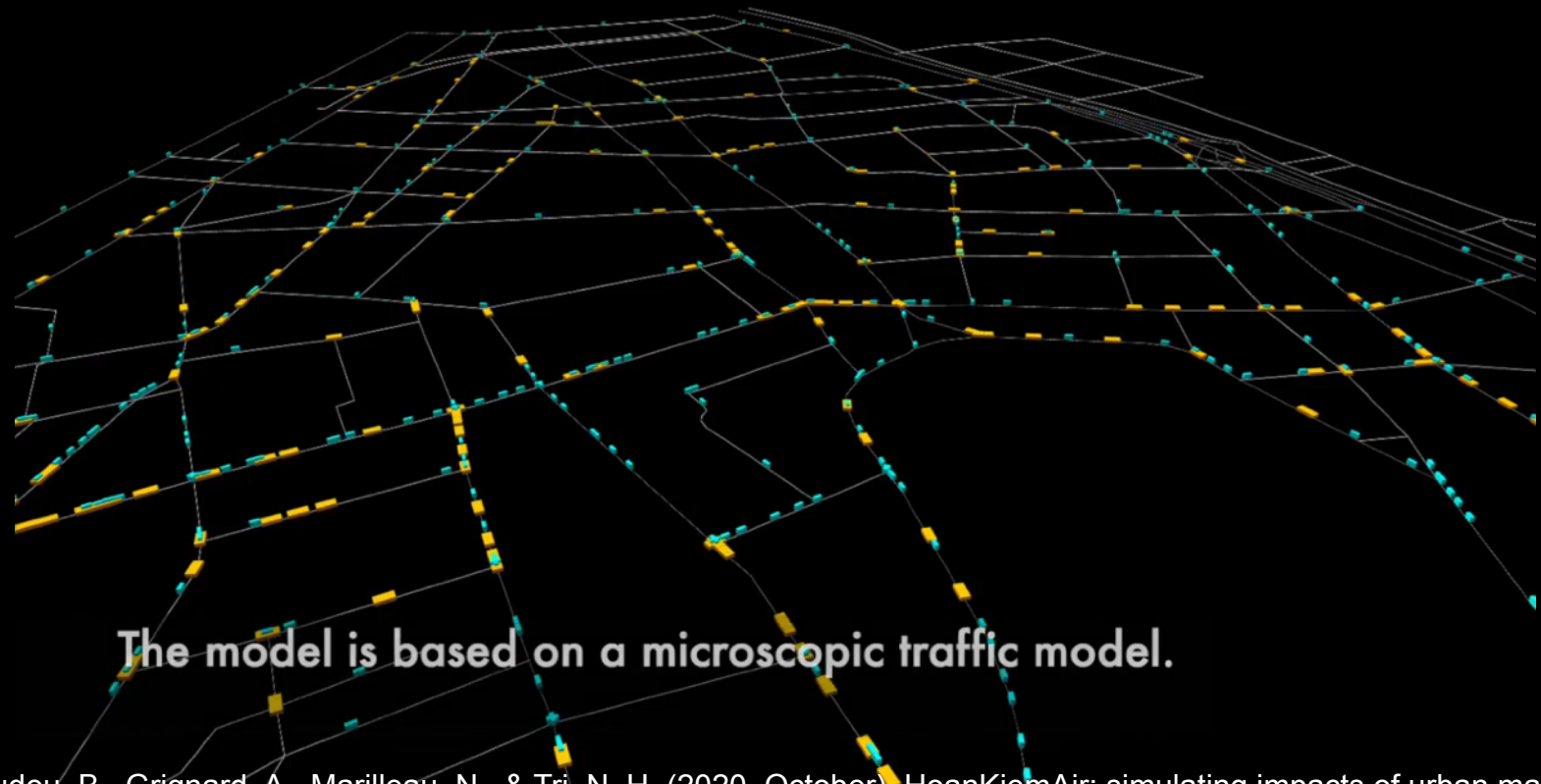
- A project dedicated to exploring the best evacuation strategies in different scenarios of flooding
- Case study in Phuc Xa, a district in Hanoi that borders the Red River, with scenarios of a large dam break in Hoa Binh



Chapuis, K., Minh-Duc, P., Brugière, A., Zucker, J. D., Drogoul, A., Tranouez, P., ... & Taillandier, P. (2022). Exploring multi-modal evacuation strategies for a landlocked population using large-scale agent-based simulations. *International Journal of Geographical Information Science*, 36(9), 1741-1783.

# Example: HoanKiem Air, linking air pollution with traffic and measuring the impact of pedestrian zones in Hanoi

- An integrated model in GAMA built with Hanoi Transport Department in 2019
- Used both to support policymakers' decisions and to raise awareness on the impact of pedestrian zones on traffic displacement and air pollution.



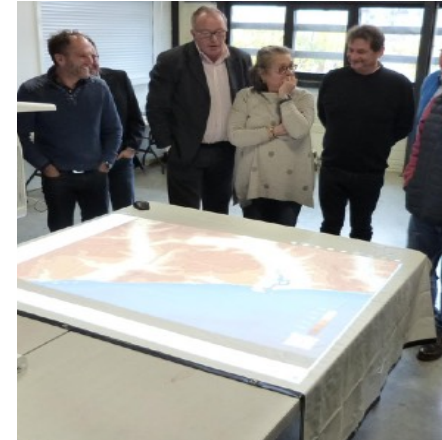
The model is based on a microscopic traffic model.

Duc, P. M., Chapuis, K., Drogoul, A., Gaudou, B., Grignard, A., Marilleau, N., & Tri, N. H. (2020, October). HoanKiemAir: simulating impacts of urban management practices on traffic and air pollution using a tangible agent-based model. In 2020 RIVFConference Proc. pp. 1-7. IEEE.



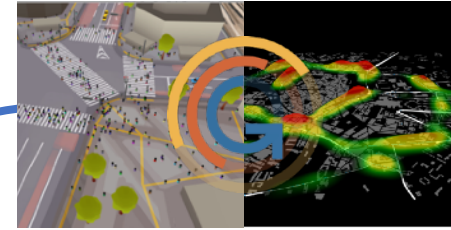
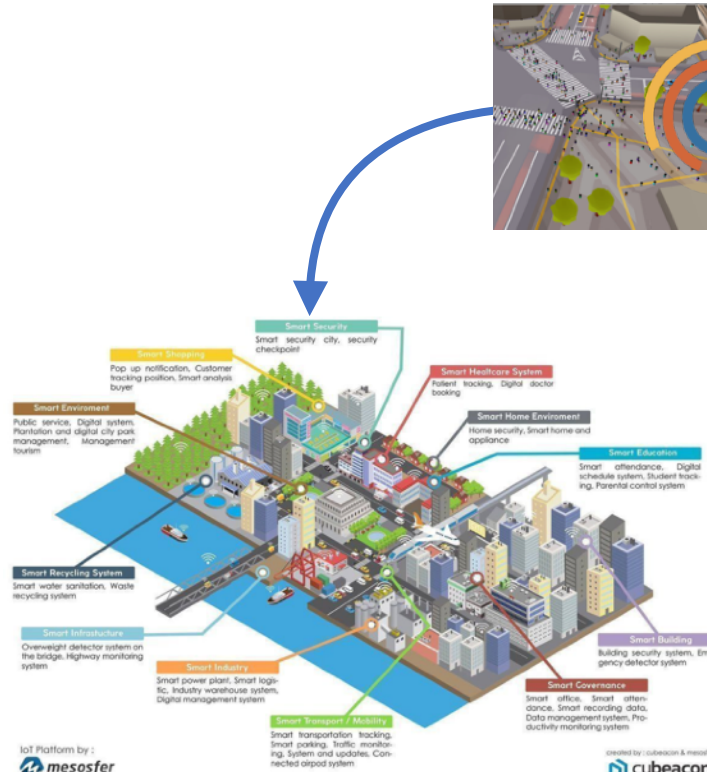
# Challenge #1: combining models and participatory methods to **improve stakeholder involvement in decision-making** (the 3rd pillar of sustainability science)

- Models are mainly produced by scientists for scientists, and their outcomes take the form of scientific articles or reports for deciders (e.g. IPCC), but they should also aid in making better, more informed decisions about sustainability challenges.
- However, sustainable solutions can only be accepted if they are somehow co-constructed or at least shared in advance with the beneficiaries
- Inventing participatory scenarios supported by models for individual exploration or group deliberation is then essential to involve stakeholders.



# ABM offers an advantage by providing natural support for participatory approaches

- In GAMA, the same models can be used for scientific research and to support real-time interactions with users.
- Users can play roles in the simulations, interact with the agents, manipulate them and directly see the potential impact of their choices.
- Can improve mediation and decision-making processes



Taillandier, P., Grignard, A., Marilleau, N., Philippon, D., Huynh, Q. N., Gaudou, B., & Drogoul, A. (2019). Participatory modeling and simulation with the gama platform. *Journal of Artificial Societies and Social Simulation*, 22(2), 1-19.

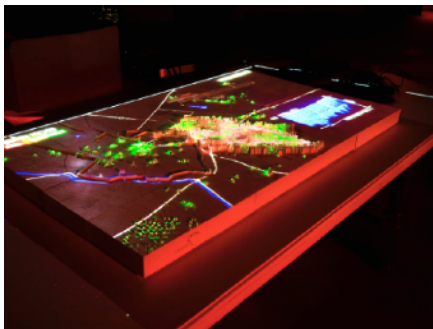


# Thanks to its extensibility and openness, GAMA supports the exploration of new "human-model interfaces" to encourage participation

- Exploring beyond charts/graphs, traditional 2D/3D displays and UI (mouse, sliders, interactive components) to engage people and allow multiple users to use models as a mediation tool.
- Technologies such as tactile and tangible interfaces open up new possibilities for the interactive visualisation of complex models and stakeholder participation.



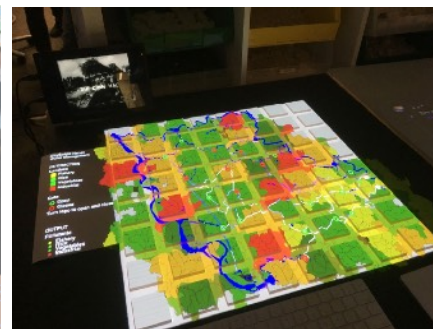
CityScope project IRD/MIT MediaLab



MarrakAir



HoanKiemAir



Bac Hung Hai



Lyon



LittoSim

# As part of the **SIMPLE** project, any GAMA model will soon be easily translatable into one or several **VR universes**

- Allows to offer a complete immersion in the models in order to support learning, awareness-raising and mediation.
- SIMPLE is supported by the EU and implemented in schools in Cambodia, Laos, Thailand and Vietnam, to raise awareness among children, via VR activities coupled with scientific models, on the sustainability of solutions for preventing and mitigating environmental problems.



Co-funded by  
the European Union



<https://project-simple.eu>





# Challenge #2: supporting understanding of and **confidence in models** though openness

As their influence on policy-making becomes widespread, the design of **very detailed and realistic models** raises different challenges, among which :

- the necessity to be as **transparent** and manipulable as possible in order to support multidisciplinary contributions;
- the necessity to remain **understandable** by stakeholders invited to participate in the design and assessment of strategies and policies;
- the necessity to be **trustable** by users: let people understand that there is no magic behind a model, and be able to unveil untold hypotheses

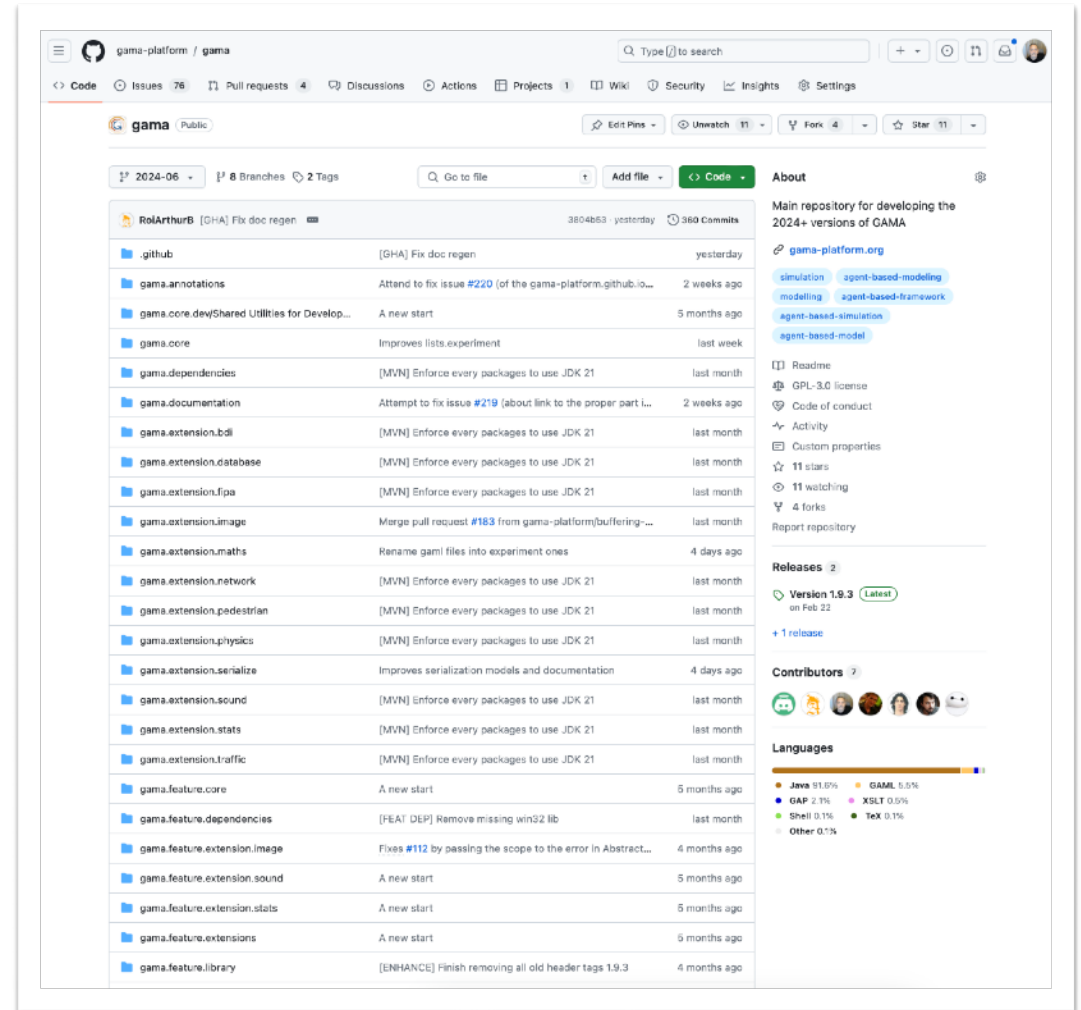


# The openness of platforms, data, models and visualisation tools can **improve reproducibility** and thus **stakeholder confidence** in the outcomes of simulations

- Particularly **critical in sustainability science** because policy decisions may be at stake and because we deal with systems where validation on past data is neither always possible or even wanted (*the past is not always the best predictor of the future in complex systems*)
- Openness allows researchers to have **access to the "black box" of simulators**: random number generators, scheduling algorithms, primitives, etc., which can have a strong influence on the outcomes of simulations.
- Openness should increase the reliability of our findings, the confidence of users, and allow the scientific community to build upon each other's work by making it possible to **reuse models**.
- ABM platforms however need mechanisms for sharing models, data, and experimental setups

# GAMA has been free since 2006 and open-source since 2008

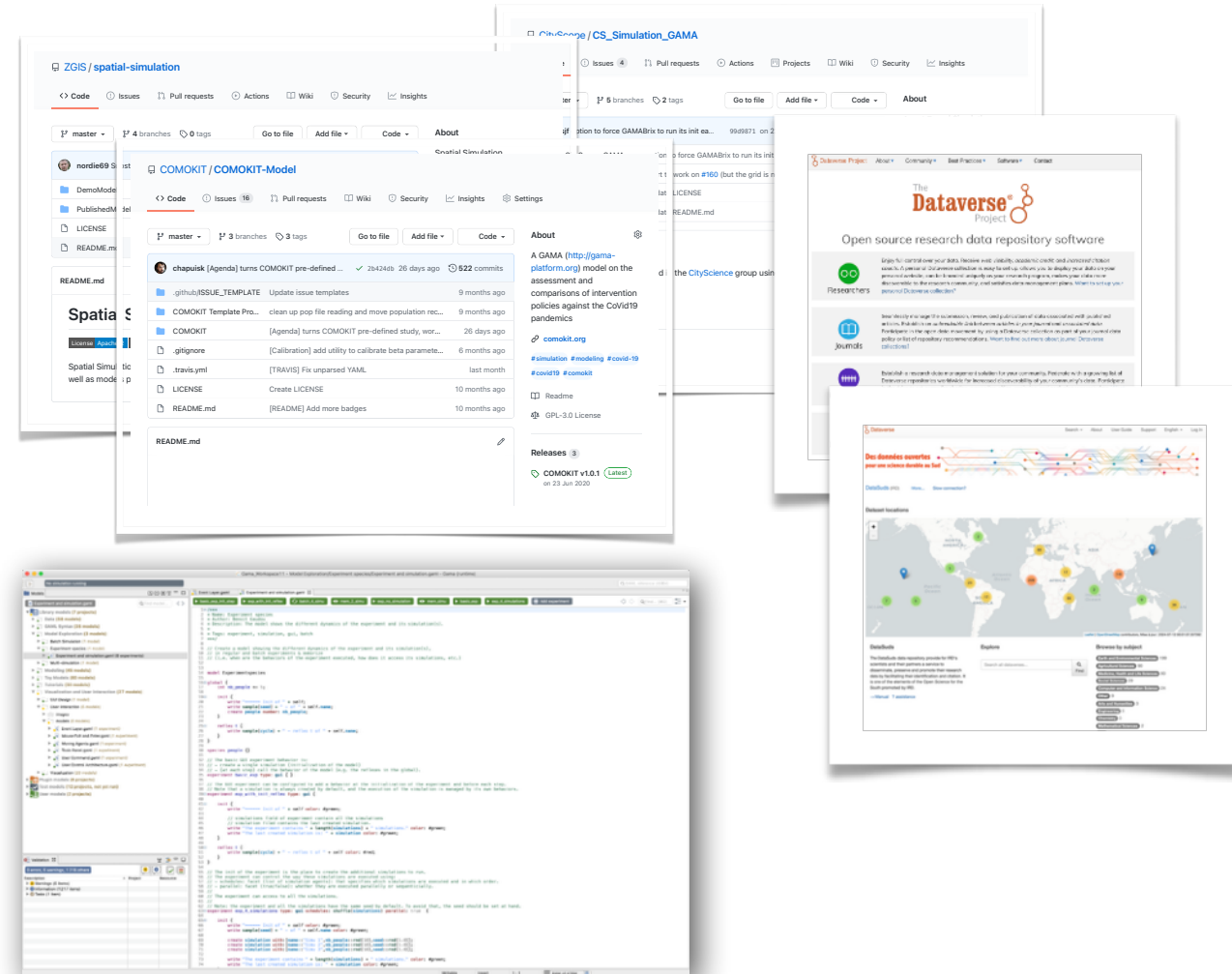
- First because of the **well-known advantages of open-source** (robustness, maintenance, evolution...) in software development
  - Community-driven development ensures flexibility and responsiveness to user needs.
  - Open-source fosters collaboration, transparency, and knowledge sharing between the developers.
- Also because an institute like IRD, present in 37 countries, could support distributed cooperative work



<https://github.com/gama-platform/gama>

# From the outset, authors of models written using GAMA have been strongly encouraged to make their **models open-source**

- Modellers are encouraged to use open data when available and also publish the outcomes of simulations as open data (using a Dataverse installation like the one at IRD)
- A radical (and still discussed) choice in GAMA is also to **always make the source code available** for viewing and editing by "users"/modellers, even in "demo" mode.





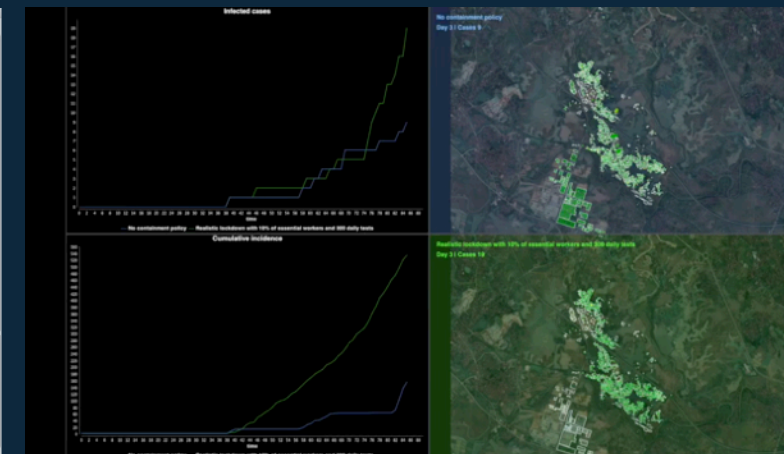
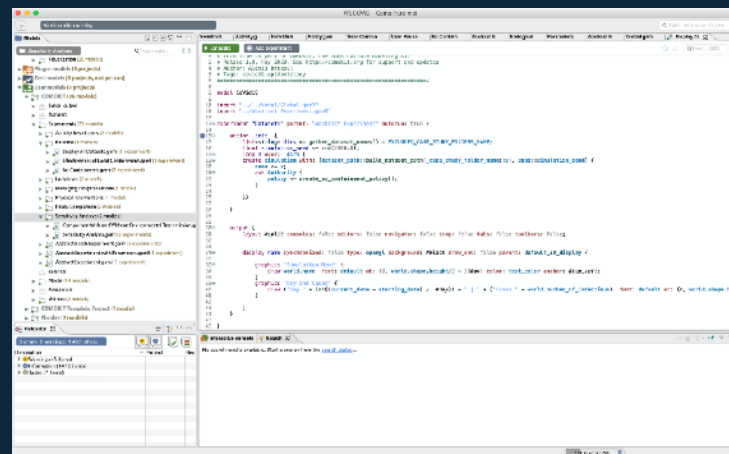
# Example: COMOKIT, developed to support the Vietnamese authorities in their fight against COVID-19



- Designed in March 2020 as part of the efforts of the Rapid Response Team of the National Steering Committee under the Prime Minister Authority
- A generic model to assess and compare mitigation policies and interventions at the level of communes (i.e. ~10.000 inhabitants), taking into account spatial and social heterogeneities.

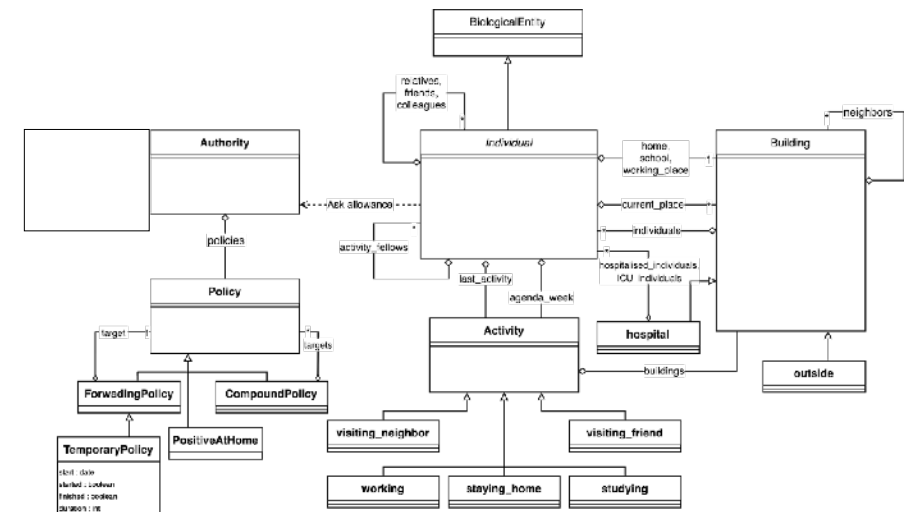
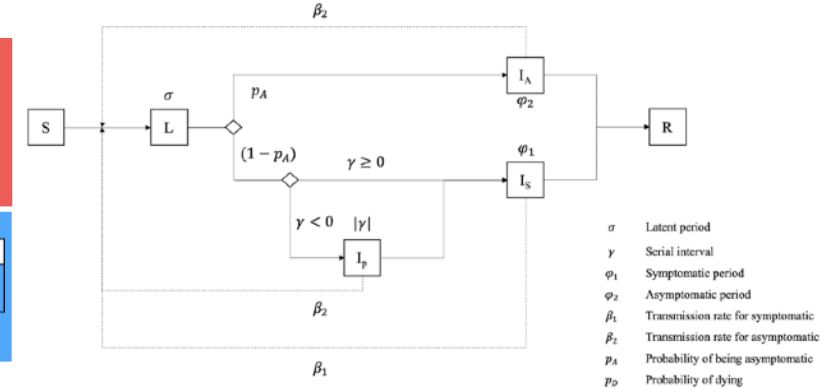
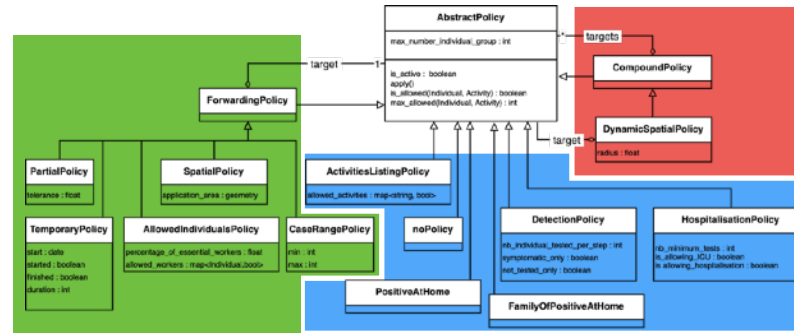
Gaudou B, Huynh NQ, Philippon D, Brugière A, Chapuis K, Taillandier P, Larmande P and Drogoul A (2020) COMOKIT: A Modeling Kit to Understand, Analyze, and Compare the Impacts of Mitigation Policies Against the COVID-19 Epidemic at the Scale of a City. Front. Public Health 8:563247. doi: 10.3389/fpubh.2020.563247

Taillandier P, Chapuis K, Gaudou B, Brugière A, Drogoul A (2024) COMOKIT v2: A multi-scale approach to modeling and simulating epidemic control policies. PLoS ONE 19(3): e0299626. <https://doi.org/10.1371/journal.pone.0299626>



# COMOKIT is an integrated model that couples 4 sub-models that cover epidemiological, spatial, social and policy aspects

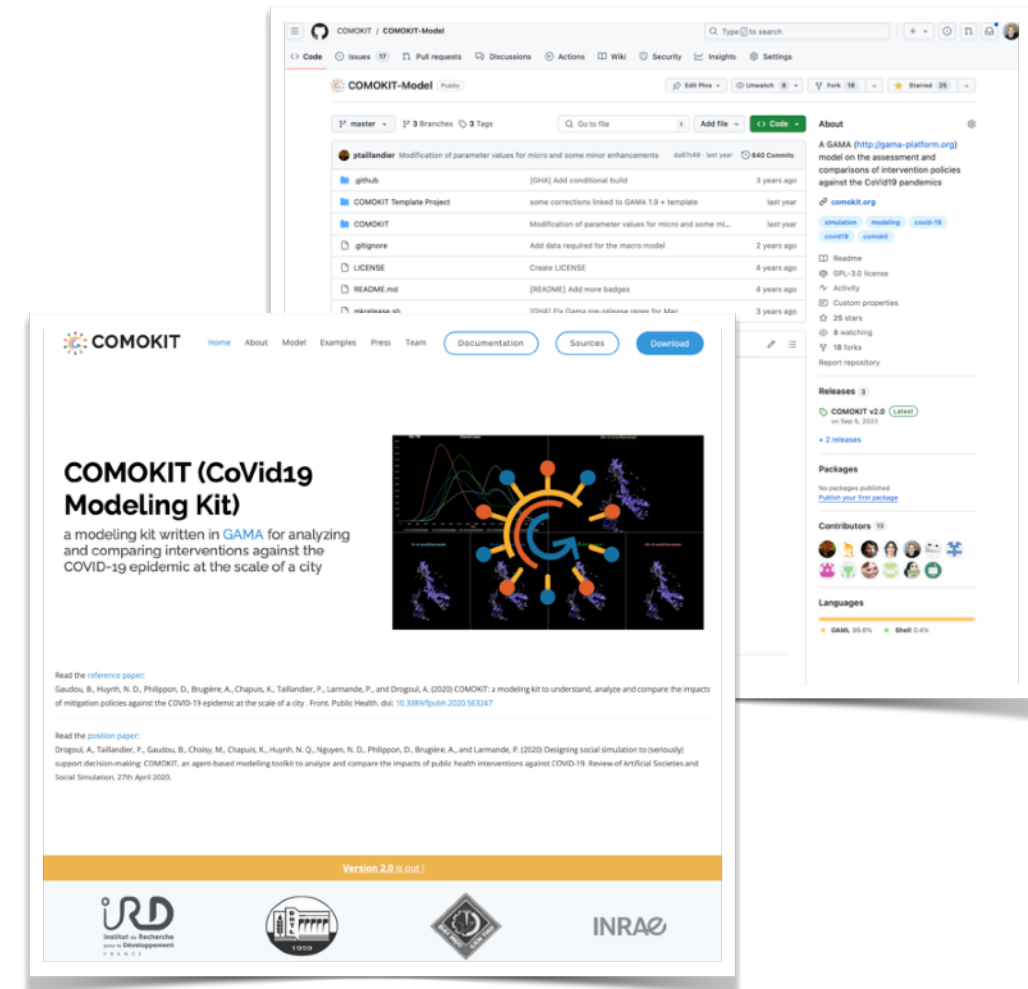
- **Open-sourced from the beginning** to allow scientists and modellers to (1) apply it to other case studies (cities, countries, populations, epidemics); (2) extend it to take into account variations (vaccination, mutations, diseases interaction...)
- Latest version (2.0, Feb. 2024) **allows to take into account multiple scales and infectious diseases**



# COMOKIT 2.0 is available at <http://comokit.org>



- Can be downloaded "as is" with the relevant GAMA runtime, preconfigured with two case studies in Vietnam and several toy examples
- Open to contributions and extensions, among which:
  - Upscaling (population size, case study extent, ...)
  - Addition of realistic urban fluxes (transportation, ...)
  - Addition of more detailed activities
  - Extension to other infectious diseases
  - Coupling with existing models (urban planning, ...)



# However, the effort required to open COMOKIT is significant and **requires a lot of resources**, beyond the 'simple' fact of making the code downloadable

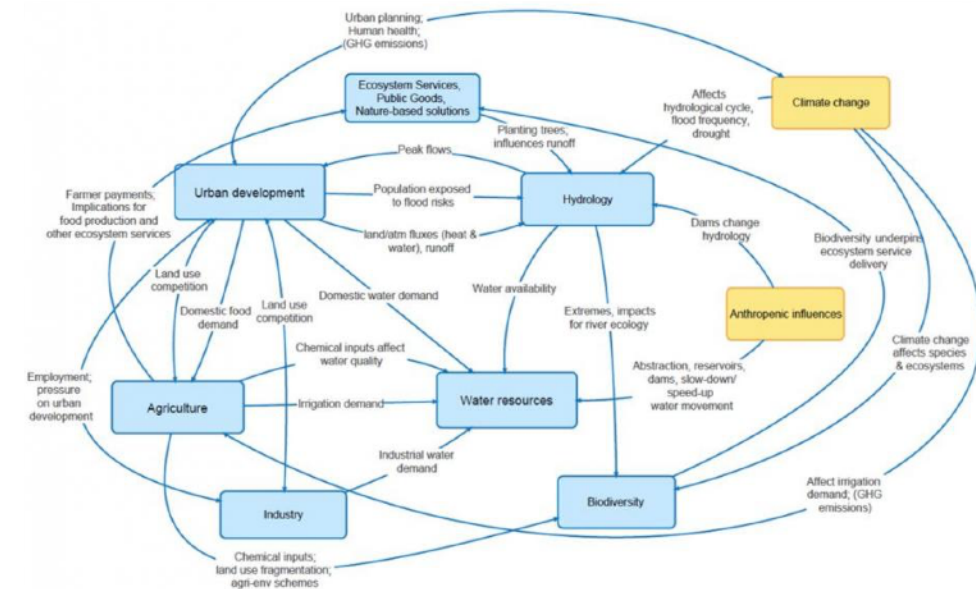
- **Make deposits to the peer-reviewed model library CoMSES** (<https://www.comses.net/>) for keeping trace/history of the running versions (v 2.0 still not yet approved)
- **Write and maintain the ODD documentation** (see <http://jasss.soc.surrey.ac.uk/23/2/7.html>) of the models to provide a readable description of their logic and the questions they answer to improve their reusability
- **Build and maintain a dedicated website** for documenting how to use and how to extend it
- **Maintain GitHub repositories** for sharing the core source, extensions and datasets.

The image displays three overlapping screenshots related to the COMOKIT project. The top screenshot shows the CoMSES Computational Model Library website, featuring the CoMSES logo, navigation links (About, Model Library, Community, Events, Jobs, Resources, Forums), and a breadcrumb trail for the COMOKIT 1.0.1 page. The middle screenshot is the O.D.D. (Overview, Design, Details) description of the COMOKIT model, listing the project name, version (1), date (May 1st 2020), authors (Arthur Brugières, Kevin Chapuis, Marc Choisy, Alexis Drogoul, Benoit Gaudou, Huynh Quang Nghi, Nguyen Ngoc Doan, Pierre Larmande, Damien Philippot, Patrick Taillandier), and affiliations (UMI 209, UMMISCO, IRD, Sorbonne Université, Bondy, France; UR 875, MIAT, INRAE, Toulouse University, Castanet Tolosan, France; UMR 5282, IRD, Université Toulouse 1 Capitole, Toulouse, France). The bottom screenshot shows the COMOKIT Documentation page, which describes the model as a GAMA model for assessing and comparing intervention policies against the COVID-19 pandemics. It includes a sidebar with navigation links (Home, Getting Started, Parameterizing simulations, Applying COMOKIT, Headless execution, Model description, Official COMOKIT extensions, Press, Version 1.0.1) and a main content area with a diagram of the model's structure and a list of topics covered in the documentation: Getting started, Headless execution, and Parameterizing simulations.



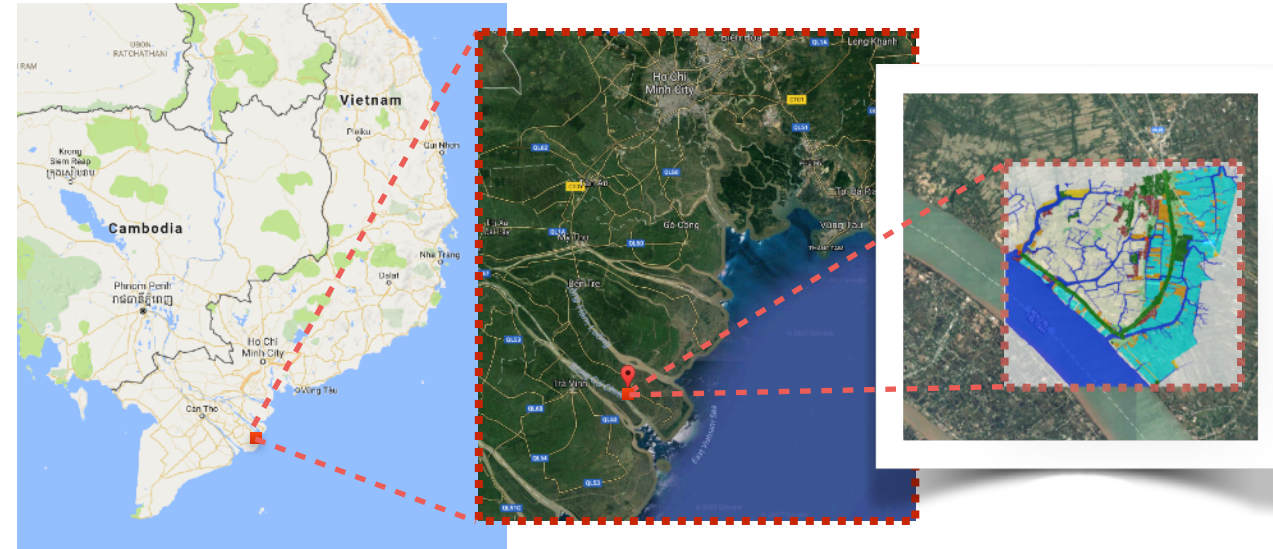
# Challenge #3: offering a **semantic support** for reusing and coupling models

- Sustainability problems do not exist in isolation. For instance, if we want to understand the impact of climate change on water resources, we need to couple weather models, agriculture models, urban development models, hydrological models, etc.
- Operational syntactic issues (data format, languages, protocols, ...) can be solved by standardisation (e.g. HLA), but sharing, open-sourcing and documenting (with loose formalisms such as ODD or more formal ones like DEVS) a model does not solve the ontological problem of **"what this model is really about"**
- Importance of structured knowledge bases and ontologies, with explicit scale support, in making knowledge explicit and reusable between models, exchanging data with compatible spatio-temporal, biophysical and economic dimensions
- An open **ontology-based library of models** is probably what we should be aiming at, prolonging the efforts done in the "digital twin" domain



# Challenge #4: addressing scalability issues in a transparent and efficient way

- The more ambitious the research questions, the larger the models and datasets.
- When handling large-scale simulations with millions of agents, computational power and data management become a concern.
- Platforms need to scale gracefully and offer a **transparent** support for distributed simulation, parallel processing, GPU computing and/or cloud computing.
- Another approach is to dynamically build approximate / surrogate models using AI or ML, especially useful in real-time situations (e.g. participatory simulations).
- **Should not be done at the expense of reproducibility !**



# Conclusion

- Interdisciplinarity is at the heart of sustainability science, and integrated computer models are proving highly effective in supporting it.
- They are however facing four challenges: participation, confidence, reusability and scalability.
- Open-source agent-based platforms such as GAMA address the first two ones, but the last two remain largely open-ended
- **Join the effort and the community !**



<https://gama-platform.org/gama-days-2024/>