

# An adaptive agent-based model of network governance

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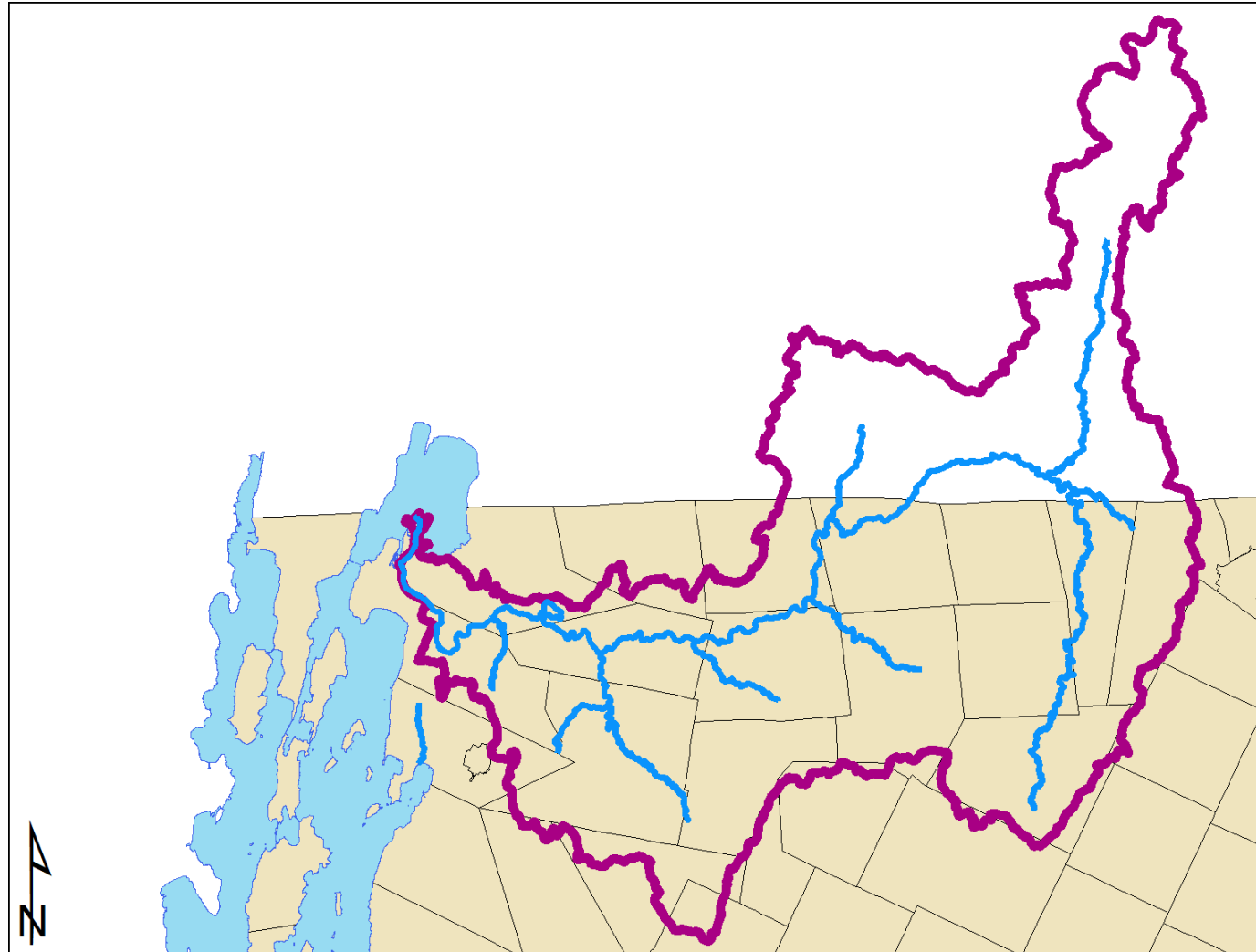
 [@pjbitterman](https://twitter.com/pjbitterman)

# Driving questions

1. How does the structure of governance networks & institutional rules affect adaptability & resilience?
2. How do governance processes respond to environmental change that may be uncertain, slow, or smaller than expected?
3. What if...
  - *alternative rules/regulations were put in place?*
  - *we increased the capacity of local organizations?*
  - *we altered funding structures?*
  - *aligned spatial and temporal lags between social and environmental processes?*

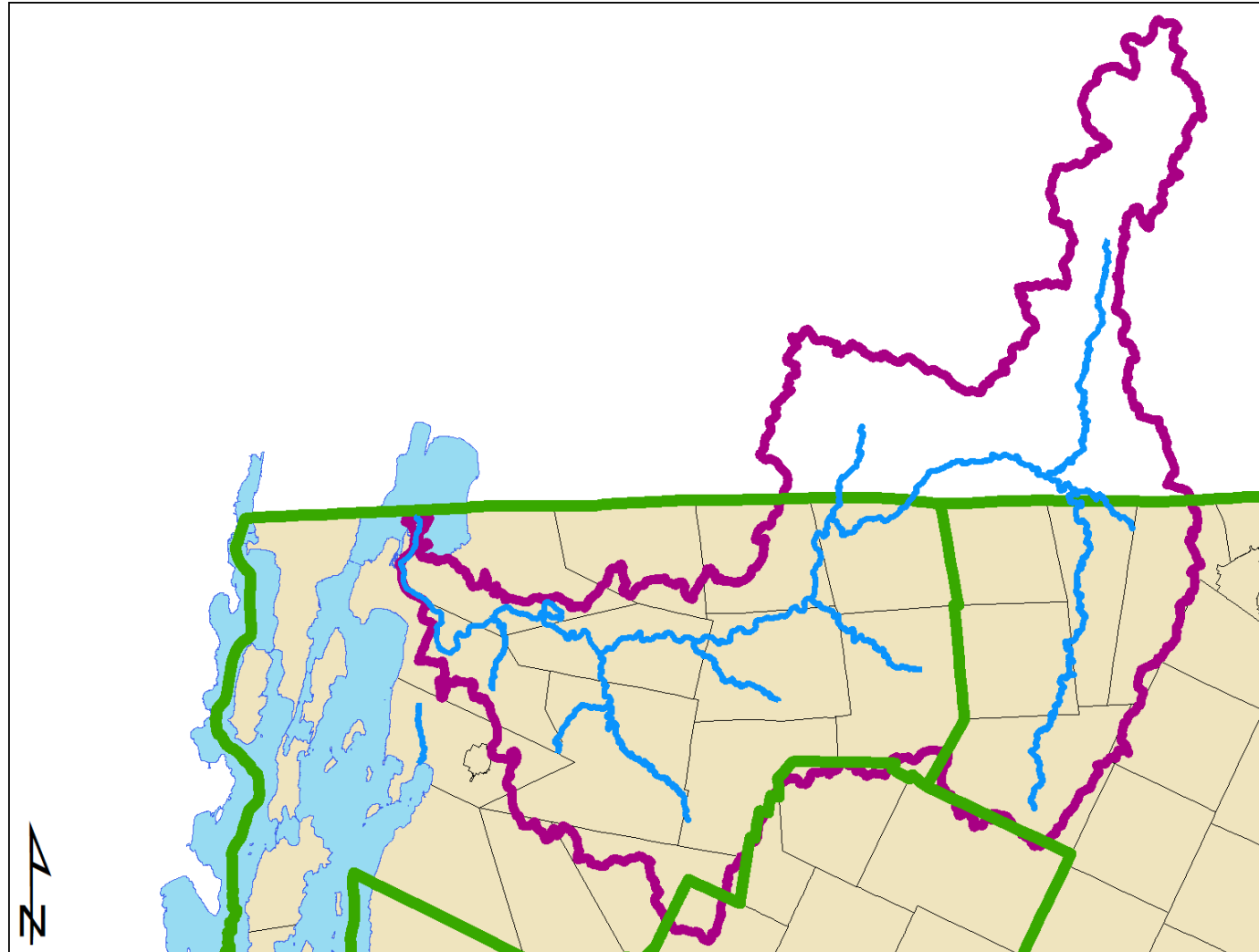
# Modeling challenges

- spatial and temporal lags and mismatches
  - admin./env. units
  - cause and effect
  - expectations and env. processes
- social actors manage both social and environmental systems
- diverse set of social actors and processes at various scales



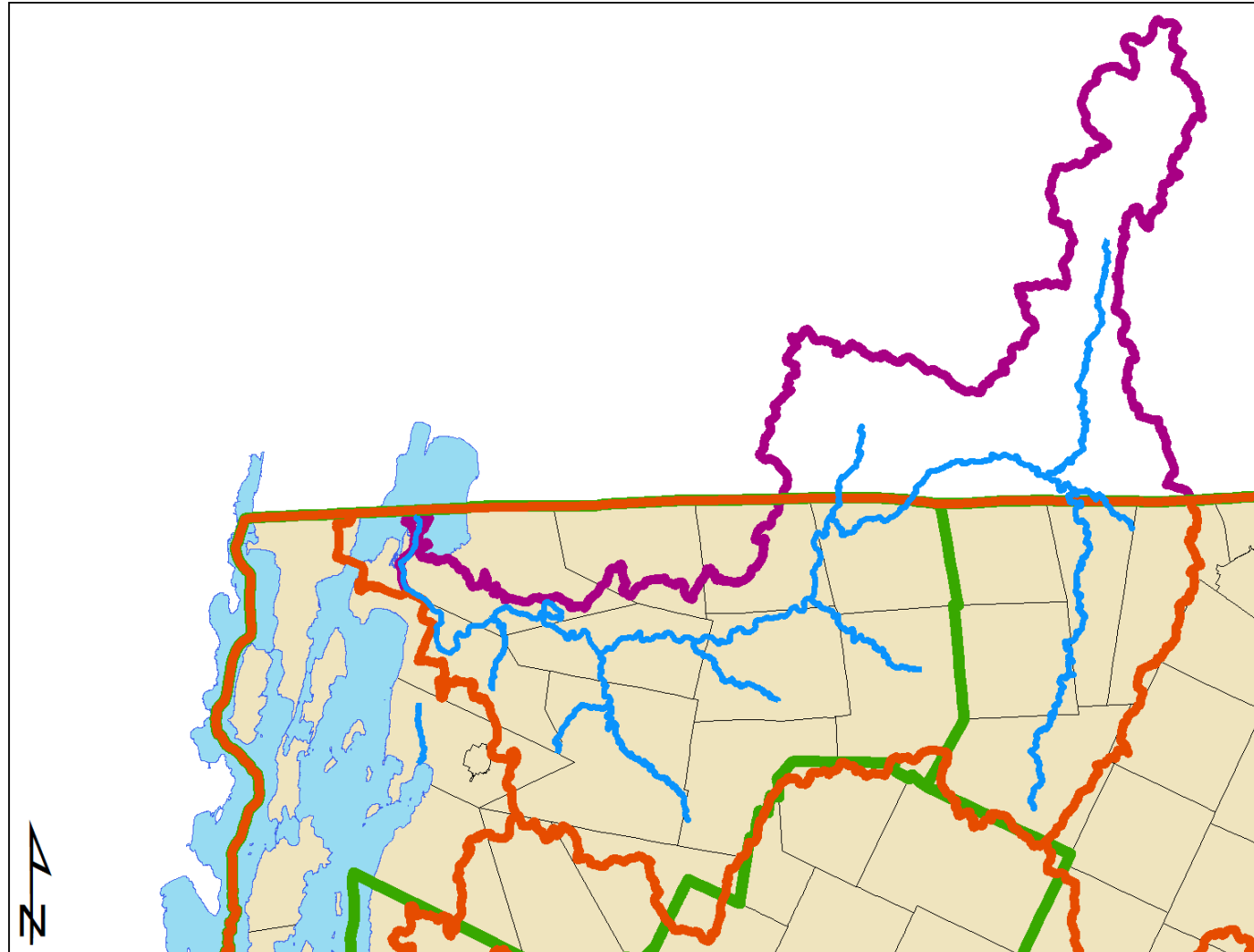
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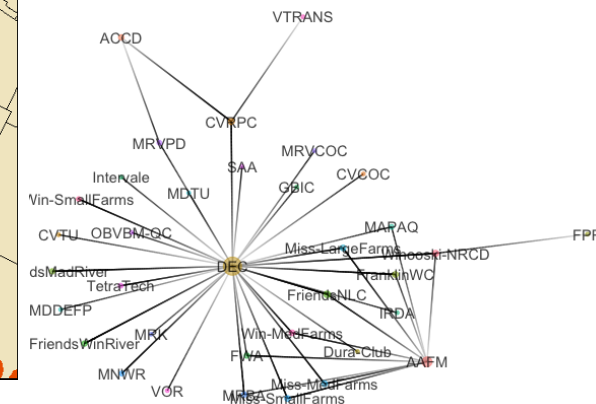


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+ NY, QC, state, federal



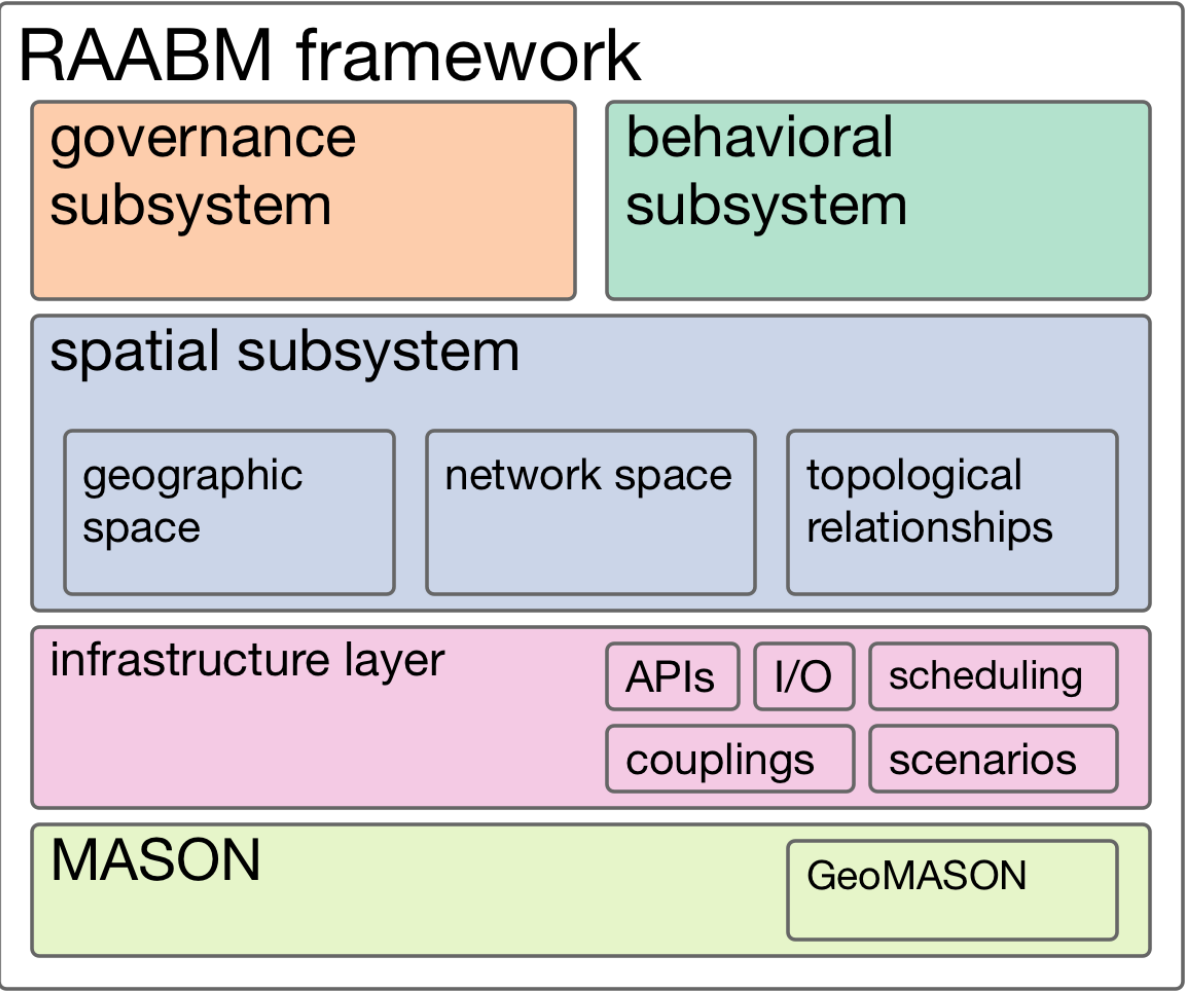
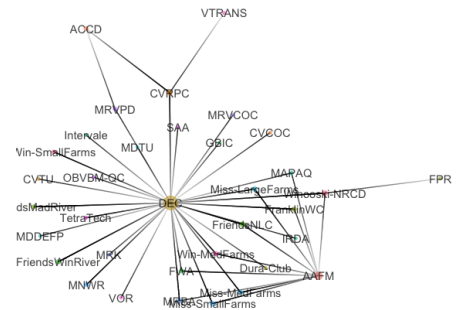
# The Resilience & Adaptability Agent-Based Modeling Framework (RAABM)

**Policy tools** with:

- objectives
- targets
- conditions
- delivery system
- evaluation



SpatialFeature “Missisquoi Bay”



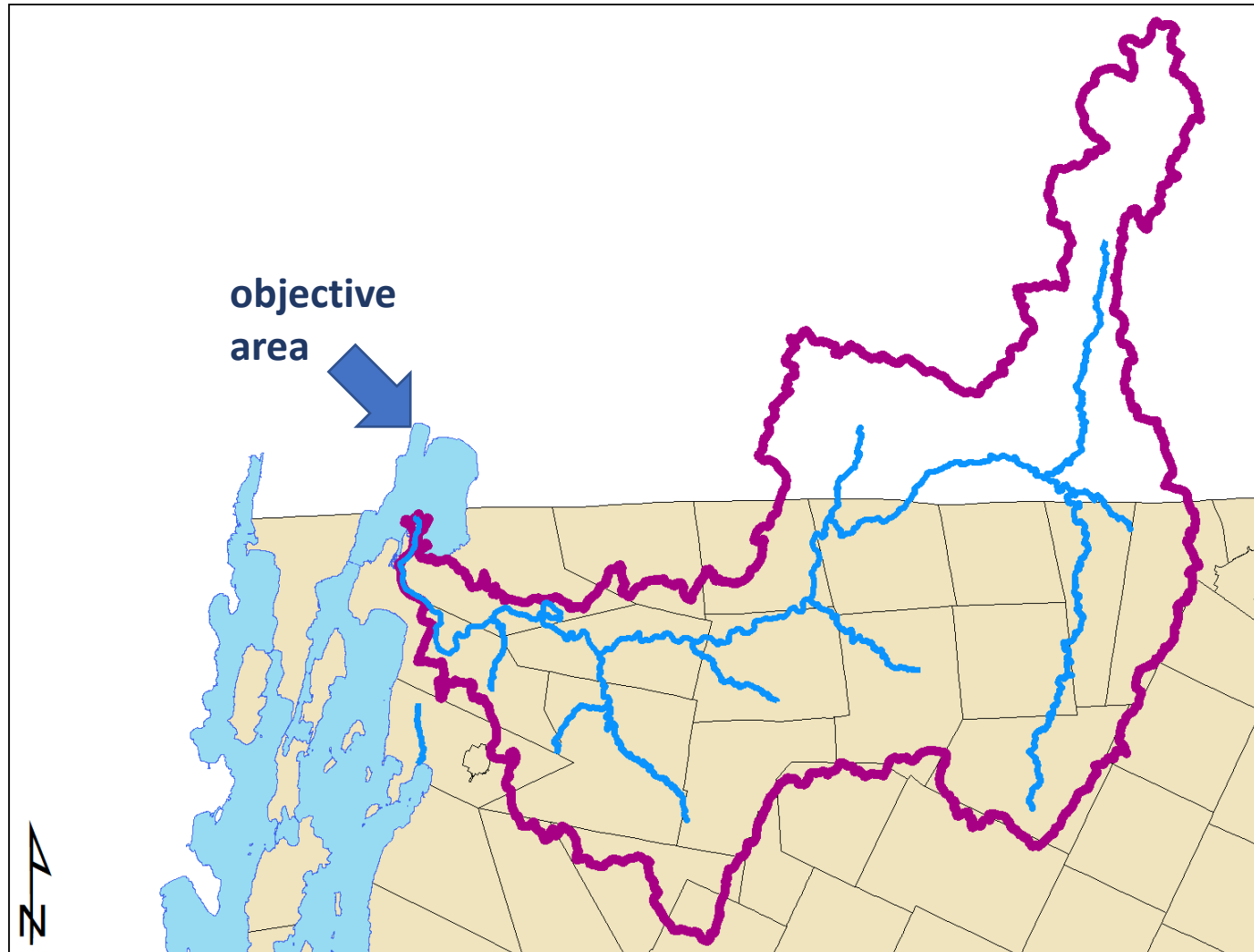
- alternative strategies
- learning
- knowledge diffusion

`relationship.inside(Lake Champlain)`  
`relationship.endpoint(Missisquoi River)`  
`relationship.outlet(Missisquoi Watershed)`

- diverse agent population
- scales to large n
- efficient
- interactive

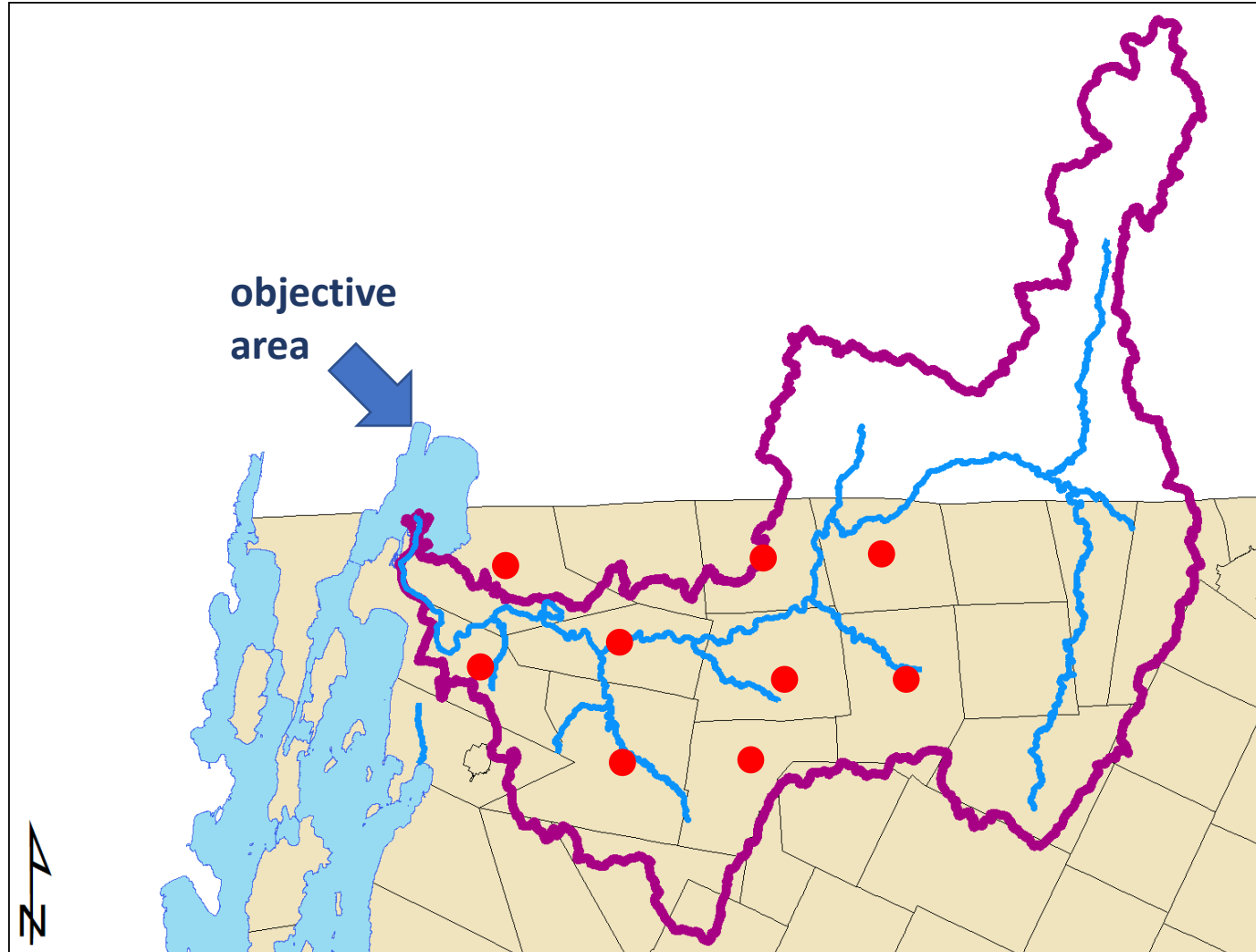
# What does the framework enable?

1. identify objective and objective area



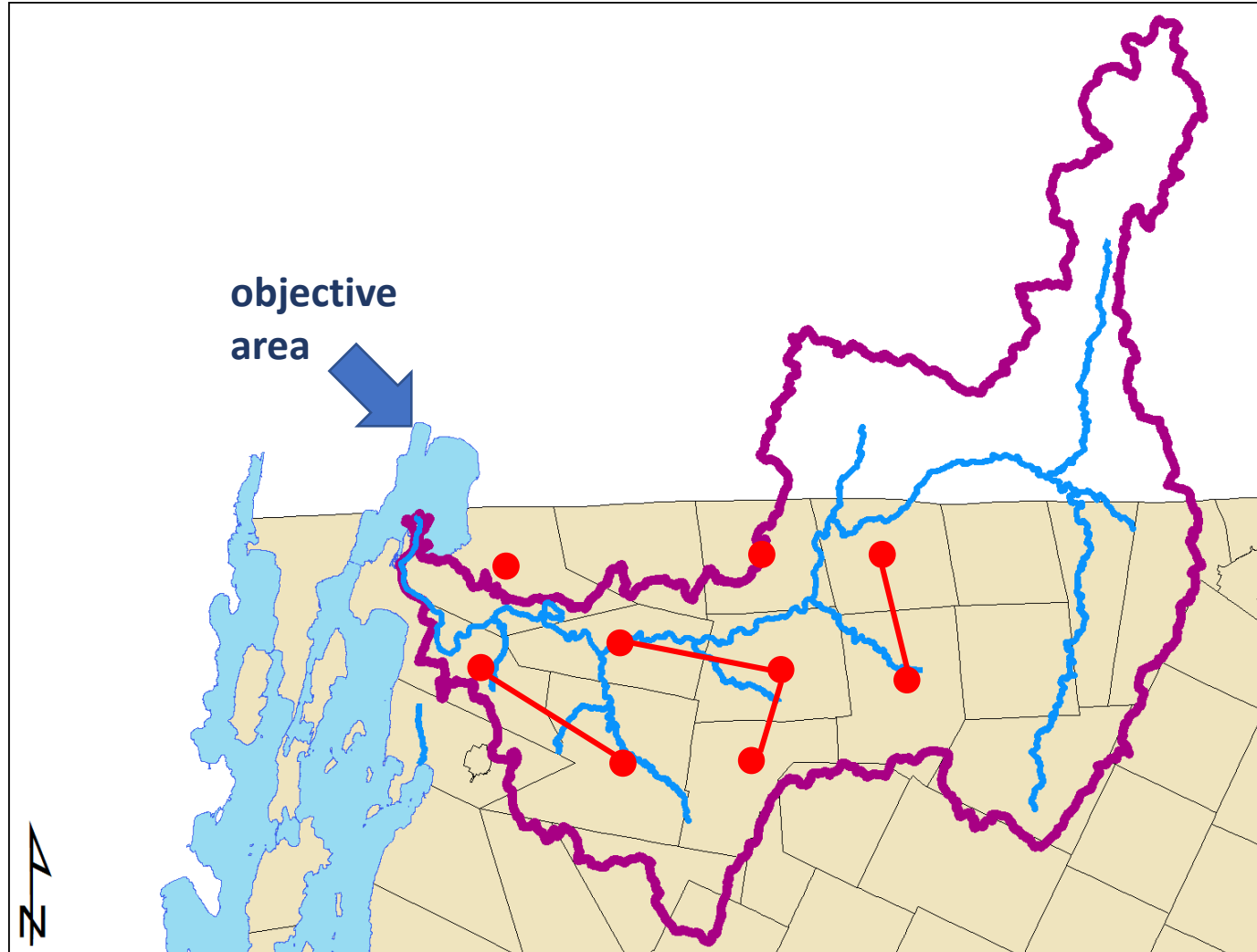
# What does the framework enable?

1. identify objective and objective area
2. identify eligible agents



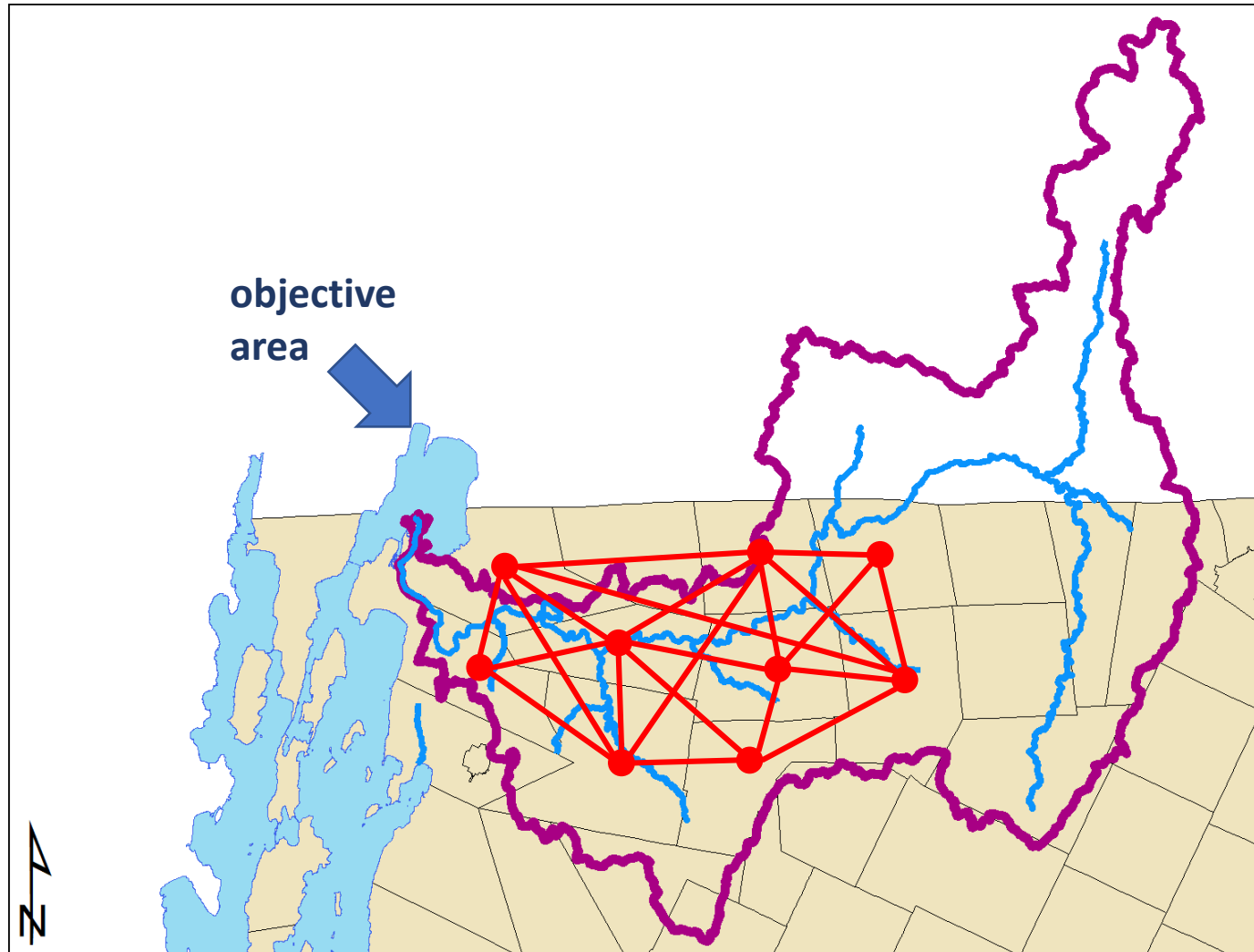
# What does the framework enable?

1. identify objective and objective area
2. identify eligible agents
3. model agent-agent and agent-environment relationships



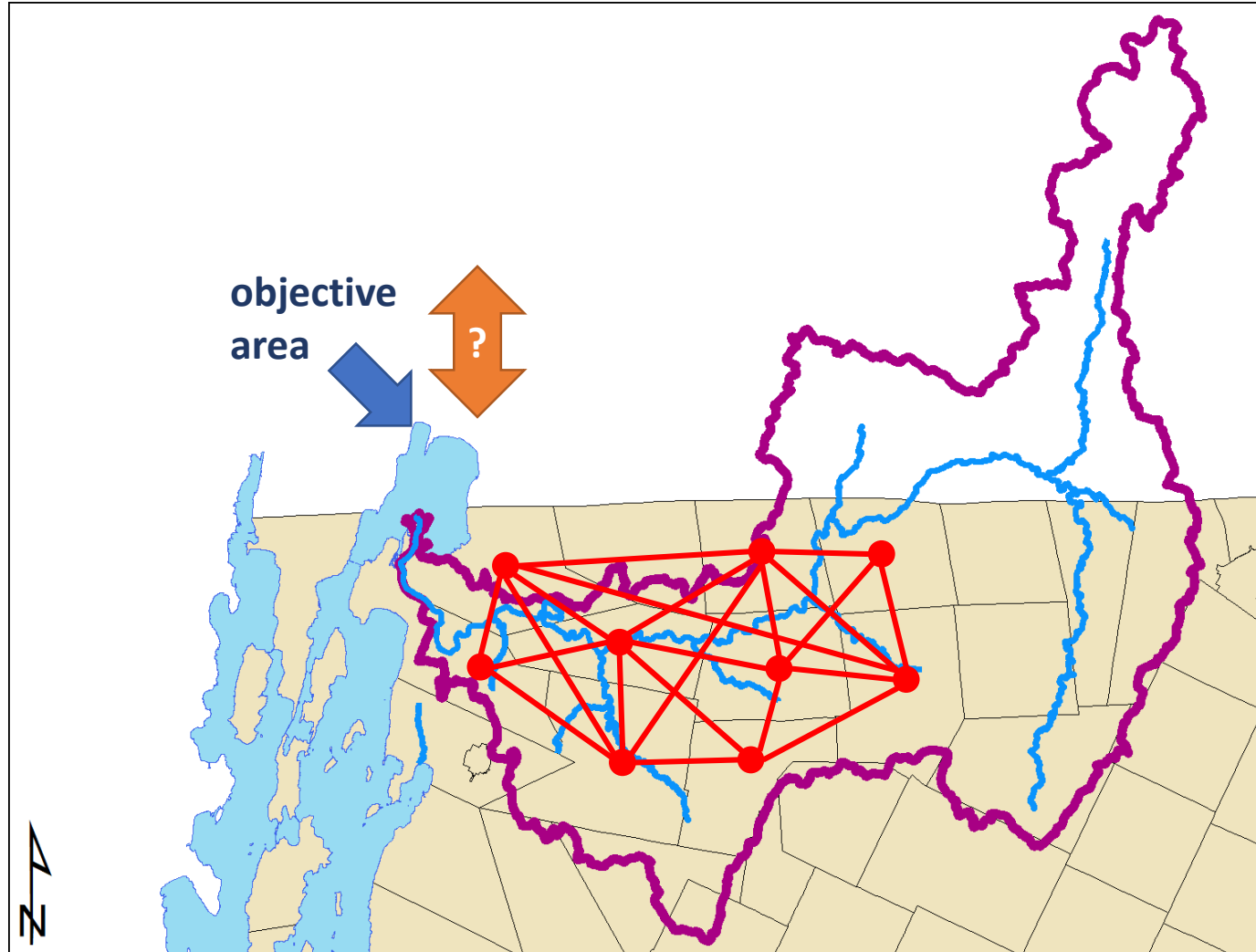
# What does the framework enable?

1. identify objective and objective area
2. identify eligible agents
3. model agent-agent and agent-environment relationships
4. model alternative relationships created by new policy tools

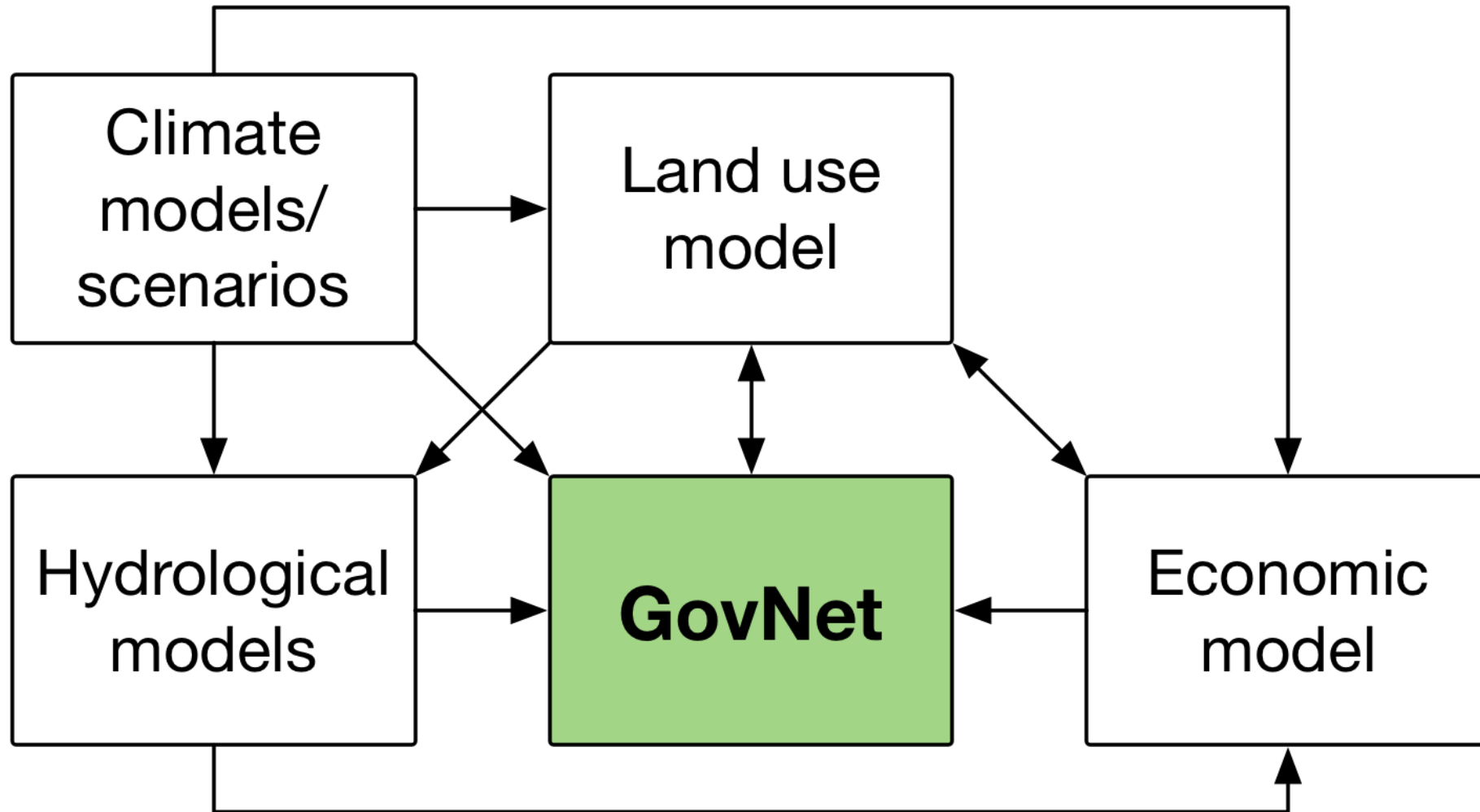


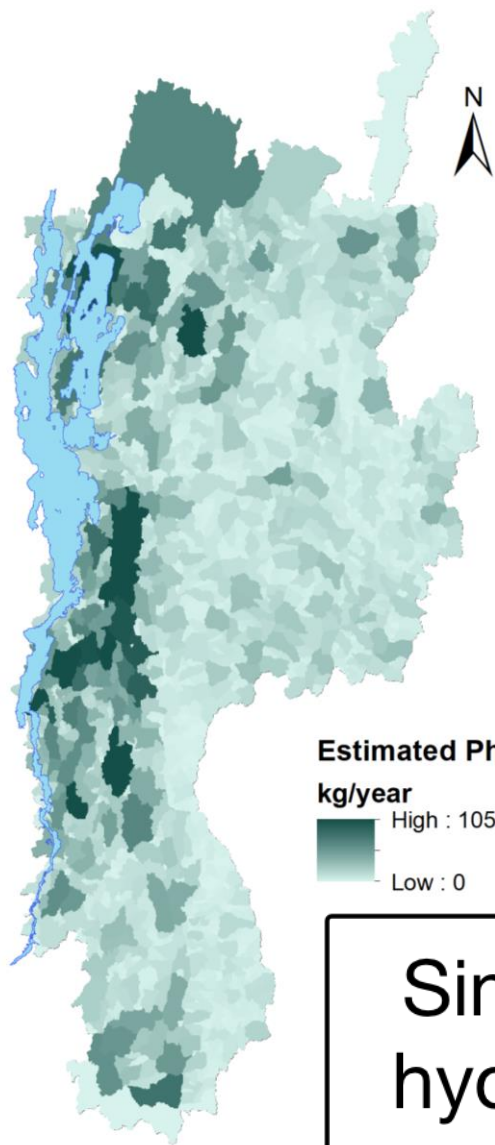
# What does the framework enable?

1. identify objective and objective area
2. identify eligible agents
3. model agent-agent and agent-environment relationships
4. model alternative relationships created by new policy tools
5. model environmental impact

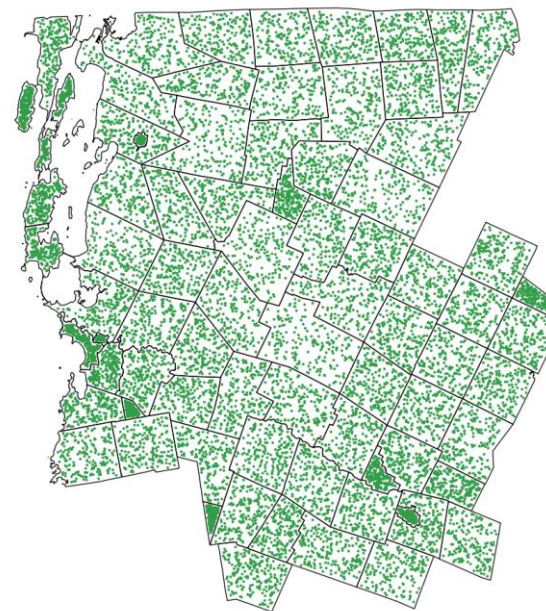
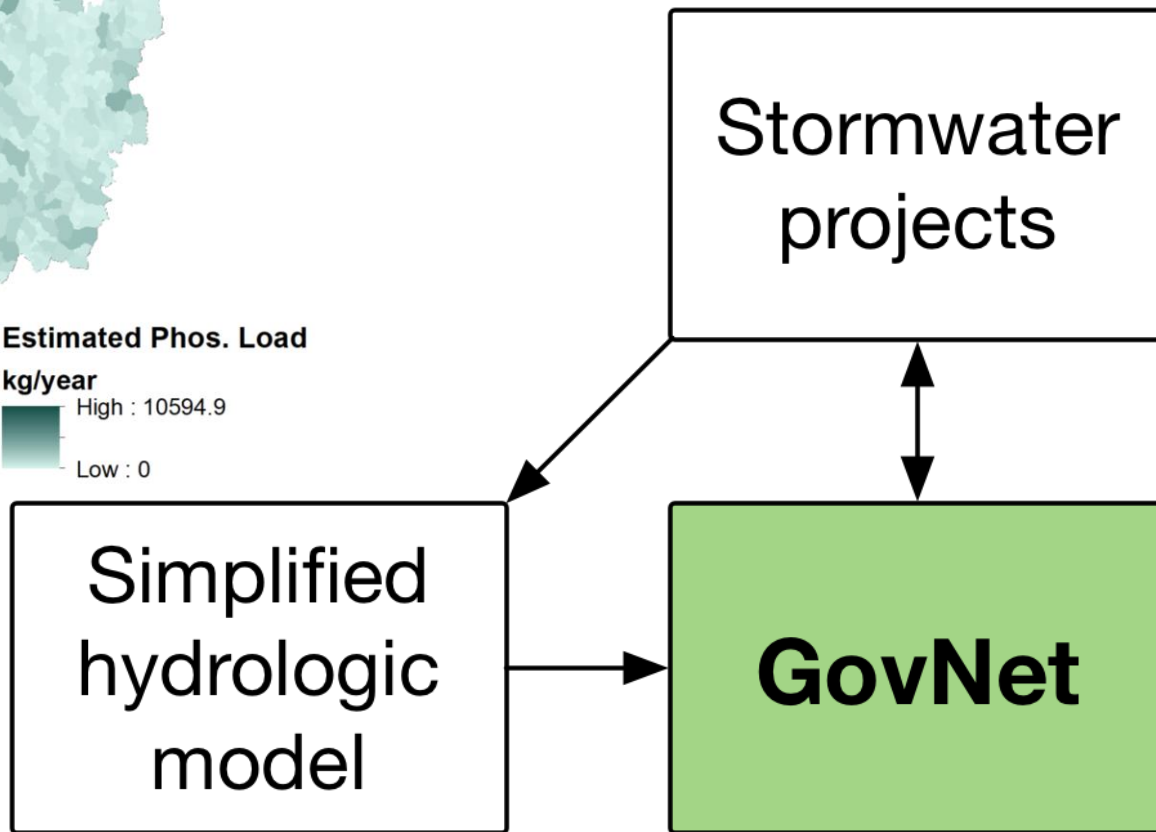


# A view of the IAM





**Estimated Phos. Load**  
**kg/year**  
High : 10594.9  
Low : 0



# Four governance agent types

## Municipalities

(78)

- Plan projects in their jurisdiction
- Cooperate or compete for project funding
- Implement (build) local projects

## State agency

- Evaluate/grade planned projects
- Allocate funding to projects

## Regional actors

(5)

- Facilitate muni cooperation
- Lend supplemental planning capacity
- Supplement project evaluation

## Political (state)

- Allocate clean water \$
- Evaluate water quality program
- Adjust (cut) clean water \$

# Alternative institutional rules (and scenarios)

## Pure cooperation

- Regional actors facilitate cooperation among municipalities in their regions
- Municipalities pool resources
- State agent prioritizes reductions / \$ at basin scale

## Pure competition

- Municipalities compete for clean water funds
- State agent operates as FIFO with limited optimization

## Competition with regional actors working at the margins and semi-independently

- Regional actors share their capacity to plan and evaluate
- State agent operates as FIFO within regional networks

Clean water \$

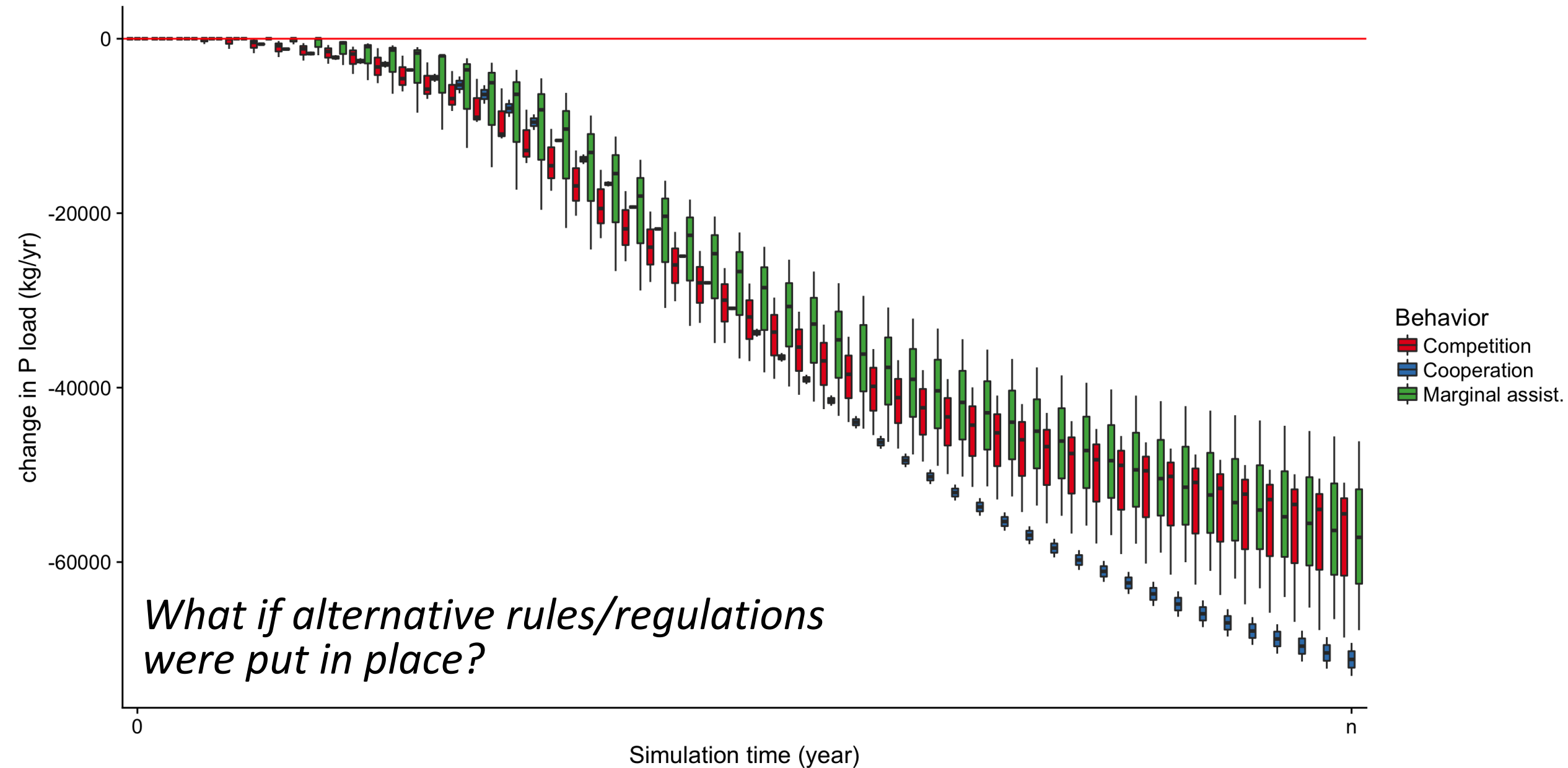
State agent  
capacity

Environmental  
lags

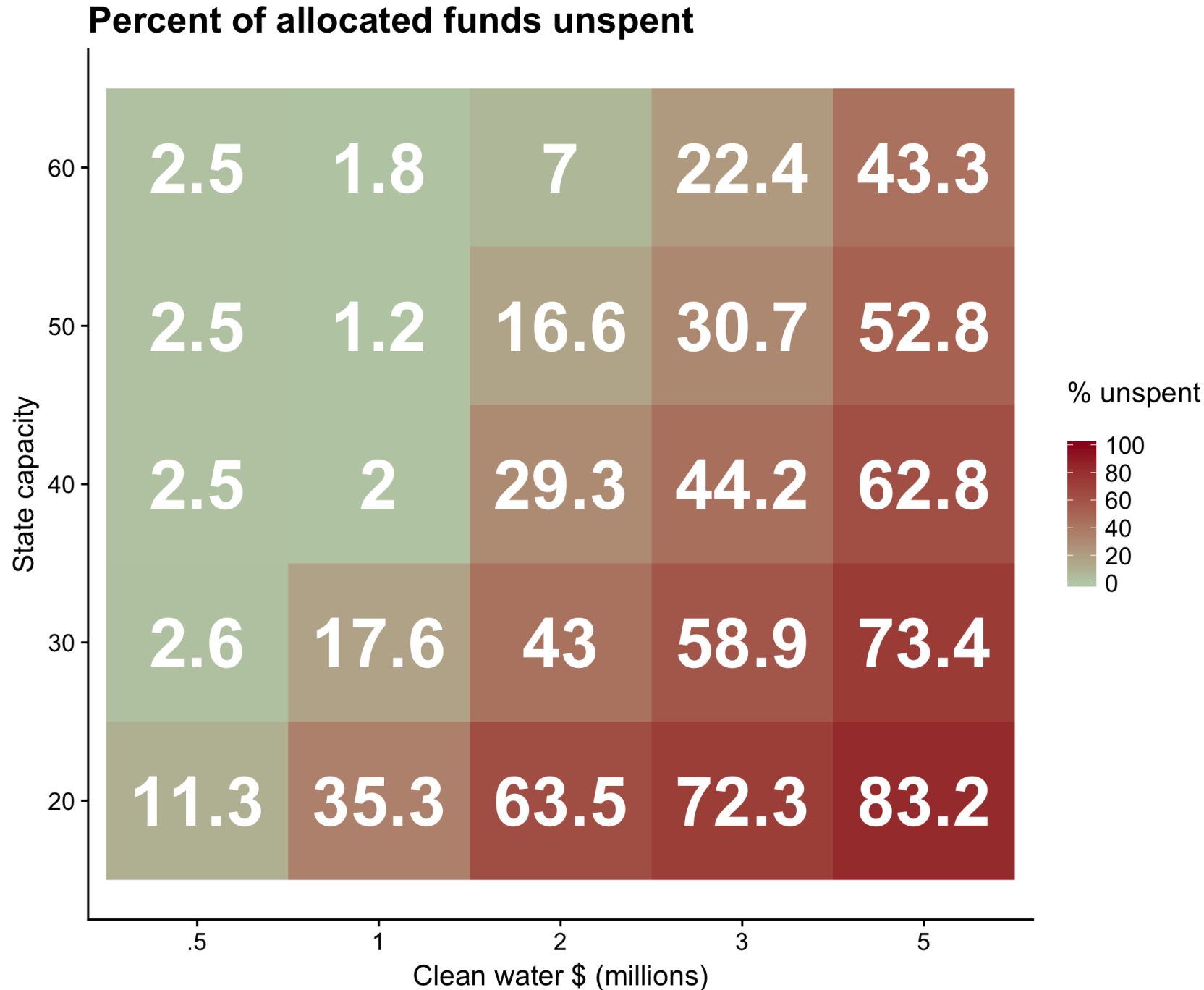
Frequency of  
project  
evaluation

# Change in loads to Lake Champlain by Agent Behavior

Kg/year vs. baseline



Without sufficient capacity, allocated funds can go unspent

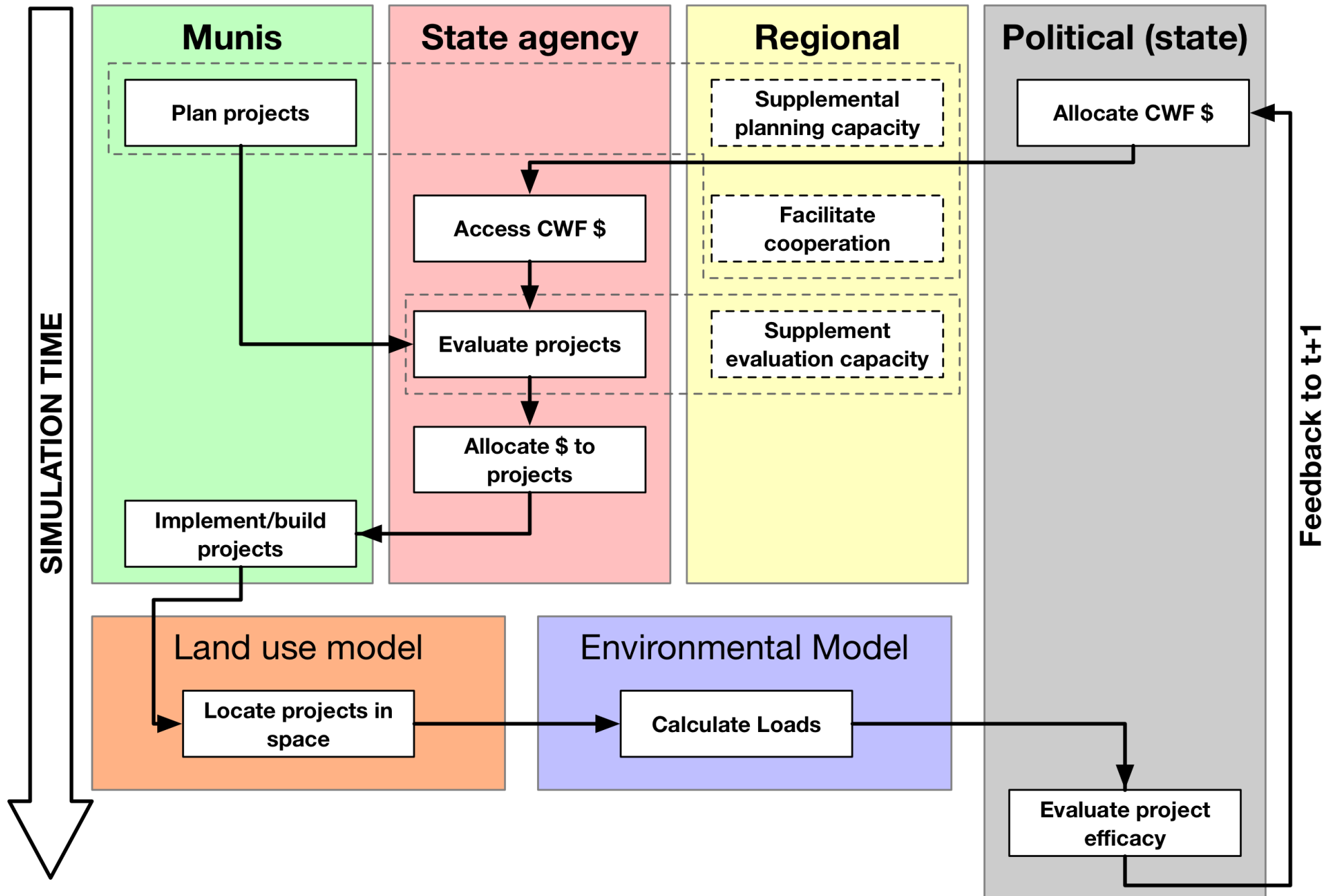


# Conclusions and future work

- Developed a spatially-explicit S-E governance framework and model
  - Modeling how changes to adaptability and resilience result from multiple, complex, and interacting processes
  - Need adaptive institutions & policies to manage lags and mismatches
- 
- Collecting data on resources, rules, and relationships
  - Institutional network refinement via document analysis
  - Further development of capacity & funding models (e.g., cost share)



Thank you



# Governance networks

“...interorganizational networks comprised of multiple actors, often spanning sectors and scale, working together to influence the creation, implementation, and monitoring of public policies.” (Koliba et al. 2011)