



# GeoAI and Social Systems Modeling

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# GeoAI and socio-environmental dynamics

“...the application (and development) of ML/AI methodologies to **geospatial** data, science, and technologies...”

## ESRI's sales pitch

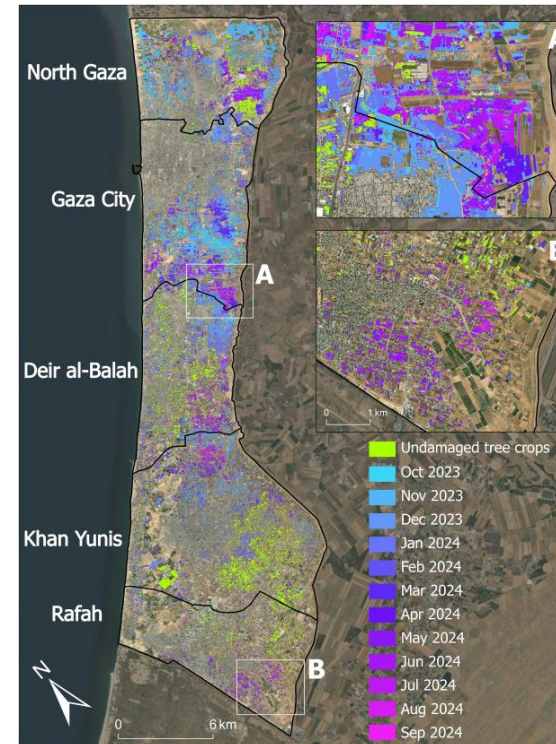


<https://www.esri.com/en-us/capabilities/geoai/overview>

## HESI Lab prelim. project

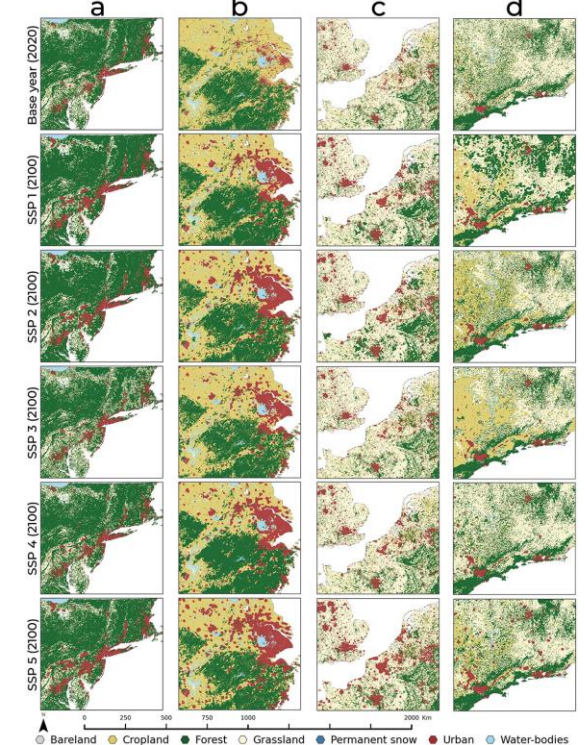


## War-induced damage



Yin, He, Lina Eklund, Dimah Habash, Mazin B. Qumsiyeh, and Jamon Van Den Hoek. "Evaluating war-induced damage to agricultural land in the Gaza Strip since October 2023 using PlanetScope and SkySat imagery." *Science of Remote Sensing* (2025): 100199.

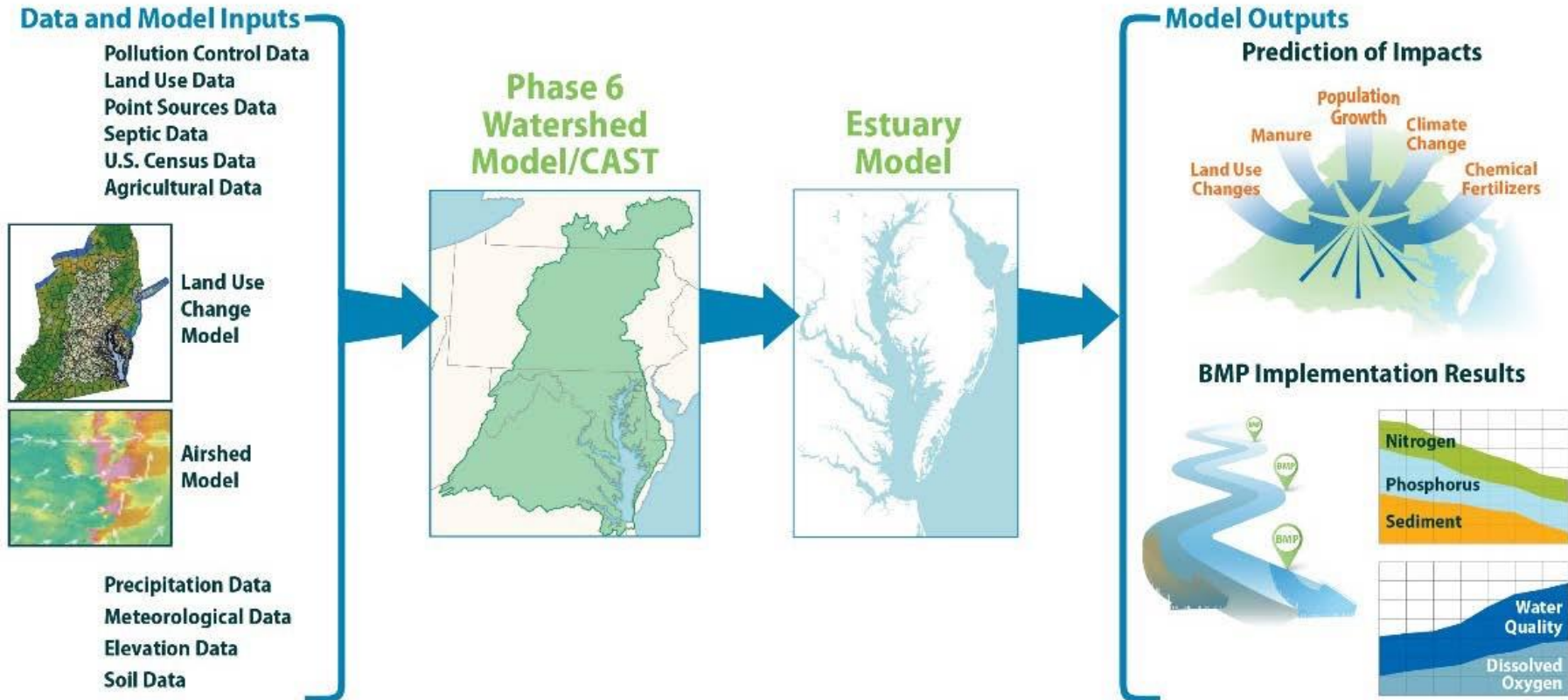
## $\Delta$ LULC projections



Addae, B., Dragičević, S., Zickfeld, K., & Hall, P. (2024). Projecting multiclass global land-use and land-cover change using deep learning and spherical geographic automata model. *Big Earth Data*, 1–28. <https://doi.org/10.1080/20964471.2024.2386091>



# Extending the CBP modeling system

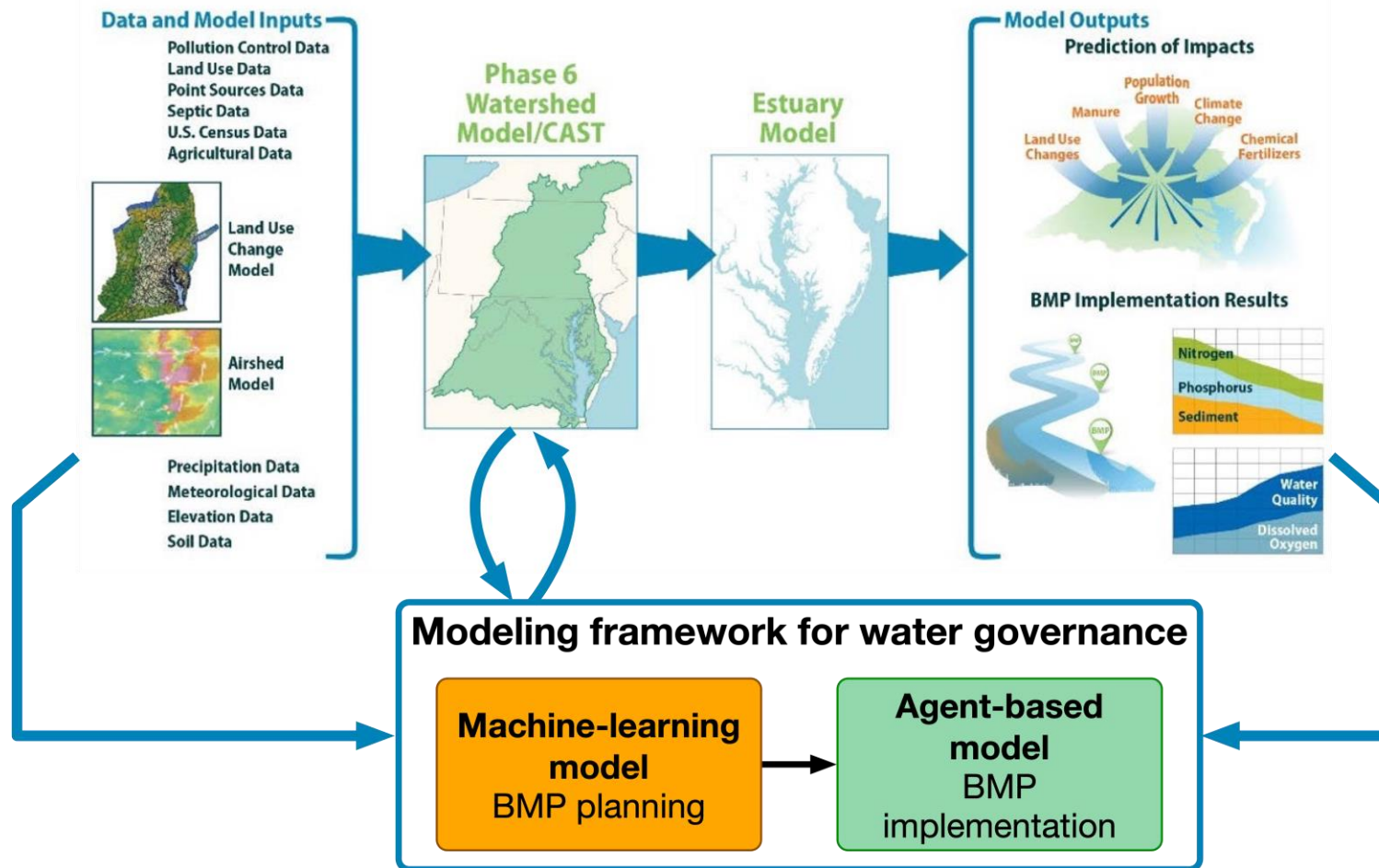


*NSF award #2009248: CNH2-L: Modeling the dynamics of human and estuarine systems with regulatory feedbacks*

Hood, R. R., G. W. Shenk, R. L. Dixon, S. M. C. Smith, W. P. Ball, J. O. Bash, R. Batiuk, K. Boomer, D. C. Brady, C. Cerco, P. Claggett, K. de Mutsert, Z. M. Easton, A. J. Elmore, M. A. M. Friedrichs, L. A. Harris, T. F. Ihde, L. Lacher, L. Li, L. C. Linker, A. Miller, J. Moriarty, G. B. Noe, G. E. Onyullo, K. Rose, K. Skalak, R. Tian, T. L. Veith, L. Wainger, D. Weller, and Y. J. Zhang. 2021. The Chesapeake Bay program modeling system: Overview and recommendations for future development. *Ecological Modelling* 456:109635.

Lim, T. C., P. D. Glynn, G. W. Shenk, P. Bitterman, J. H. A. Guillaume, J. C. Little, and D. G. Webster. 2023. Recognizing political influences in participatory social-ecological systems modeling. *Socio-Environmental Systems Modelling* 5:18509.

# Can we identify/model feedback loops?



## Key *social* processes

1. Allocation

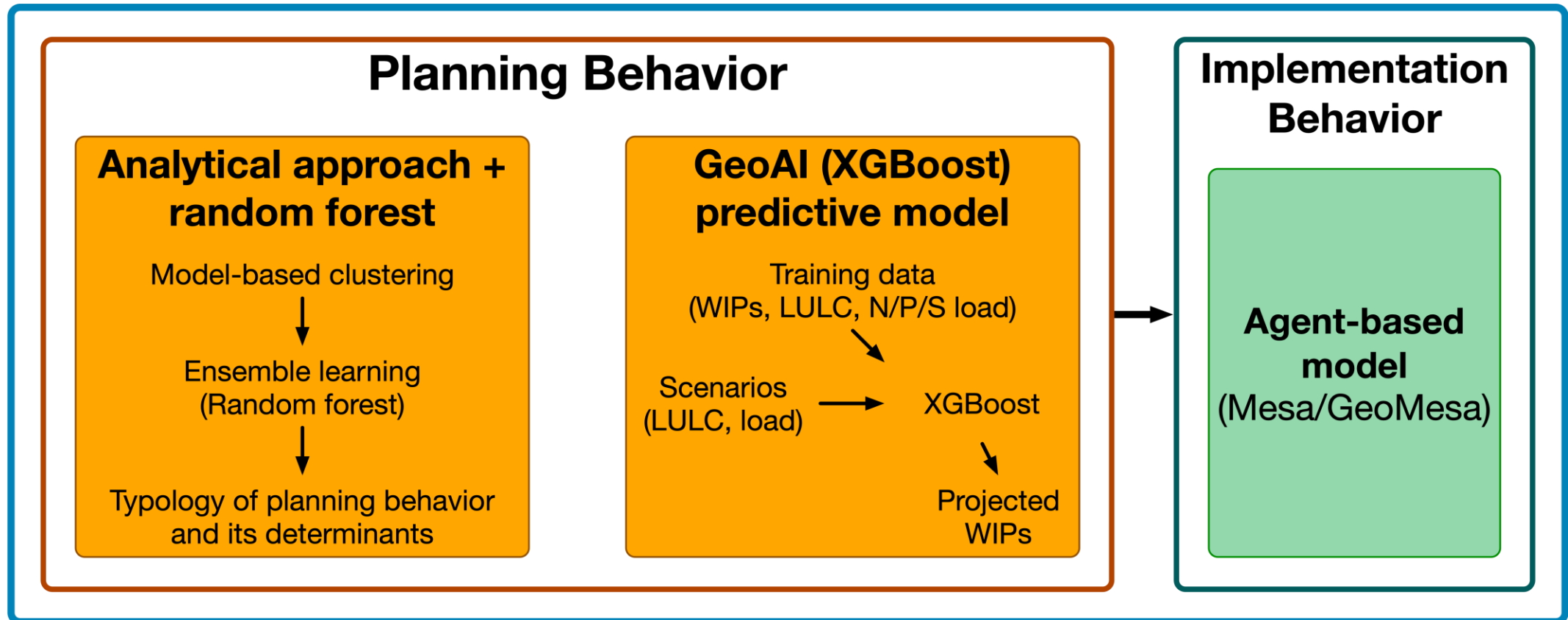
2. Planning BMPs  
(WIP creation)

3. Implementation and  
prioritization

4. Verification

# Computational framework

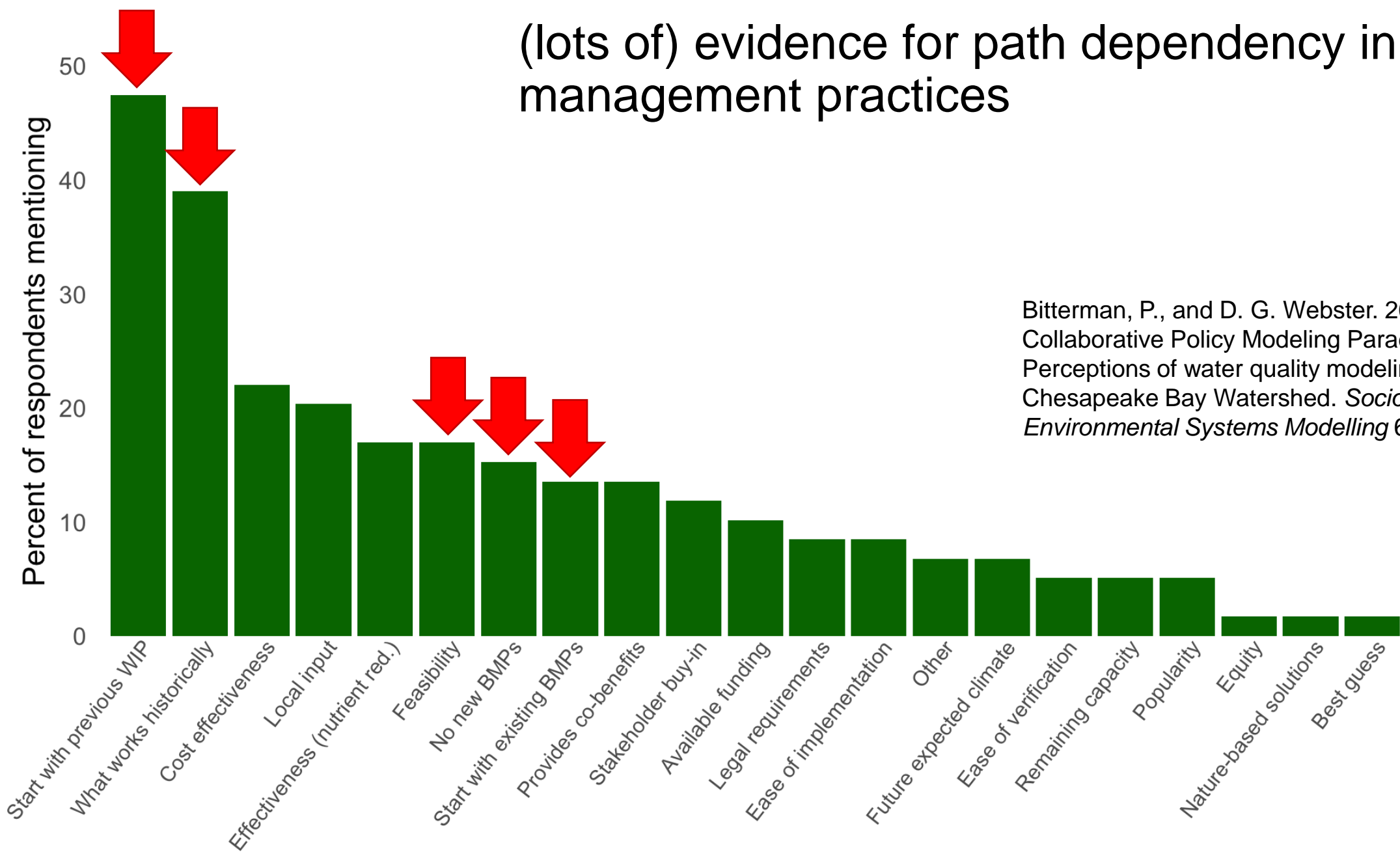
GeoAI + more “traditional” social dynamics models



**Output: management plans and implementation decisions**

- Spatially-explicit (LRS and county scales)
- Reflective of priorities at multiple scales
- Responsive to changes in land use and load

(lots of) evidence for path dependency in management practices



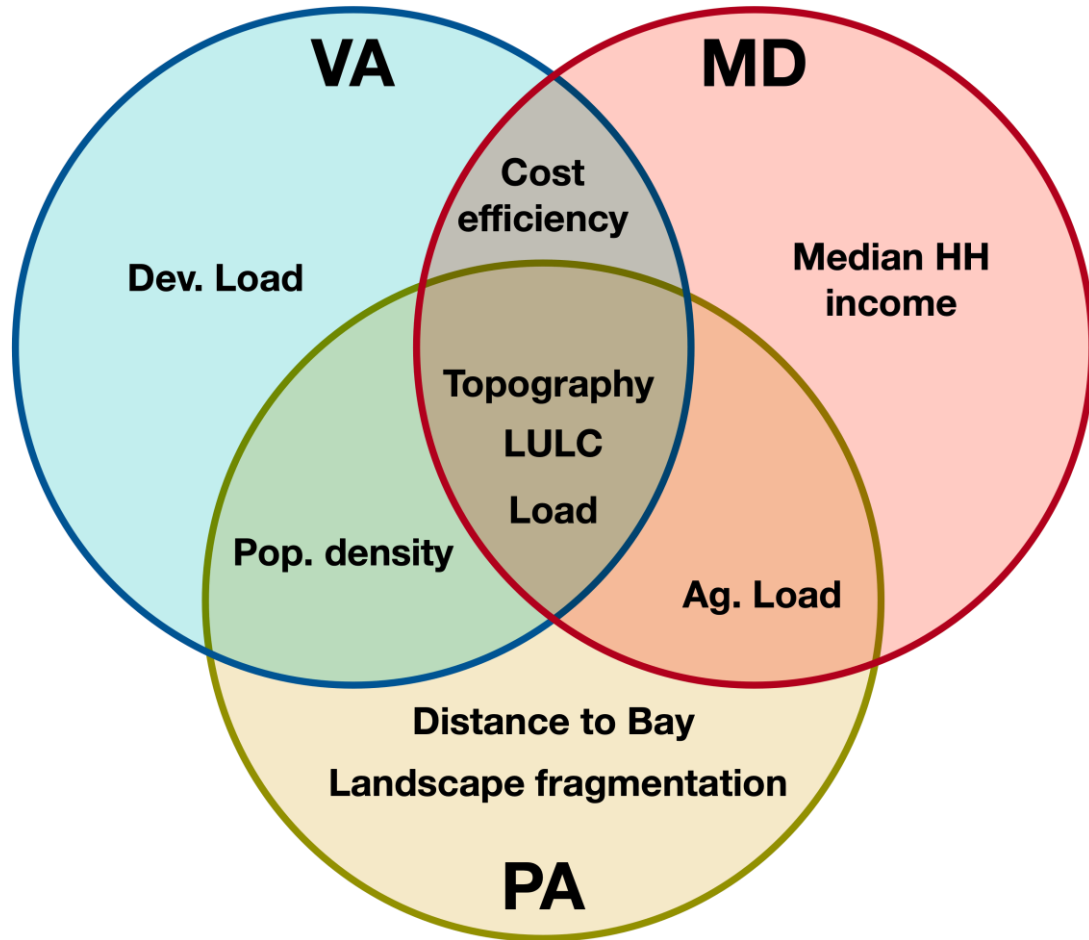
Bitterman, P., and D. G. Webster. 2024. The Collaborative Policy Modeling Paradox: Perceptions of water quality modeling in the Chesapeake Bay Watershed. *Socio-Environmental Systems Modelling* 6:18677.



# Analytical approach + RF

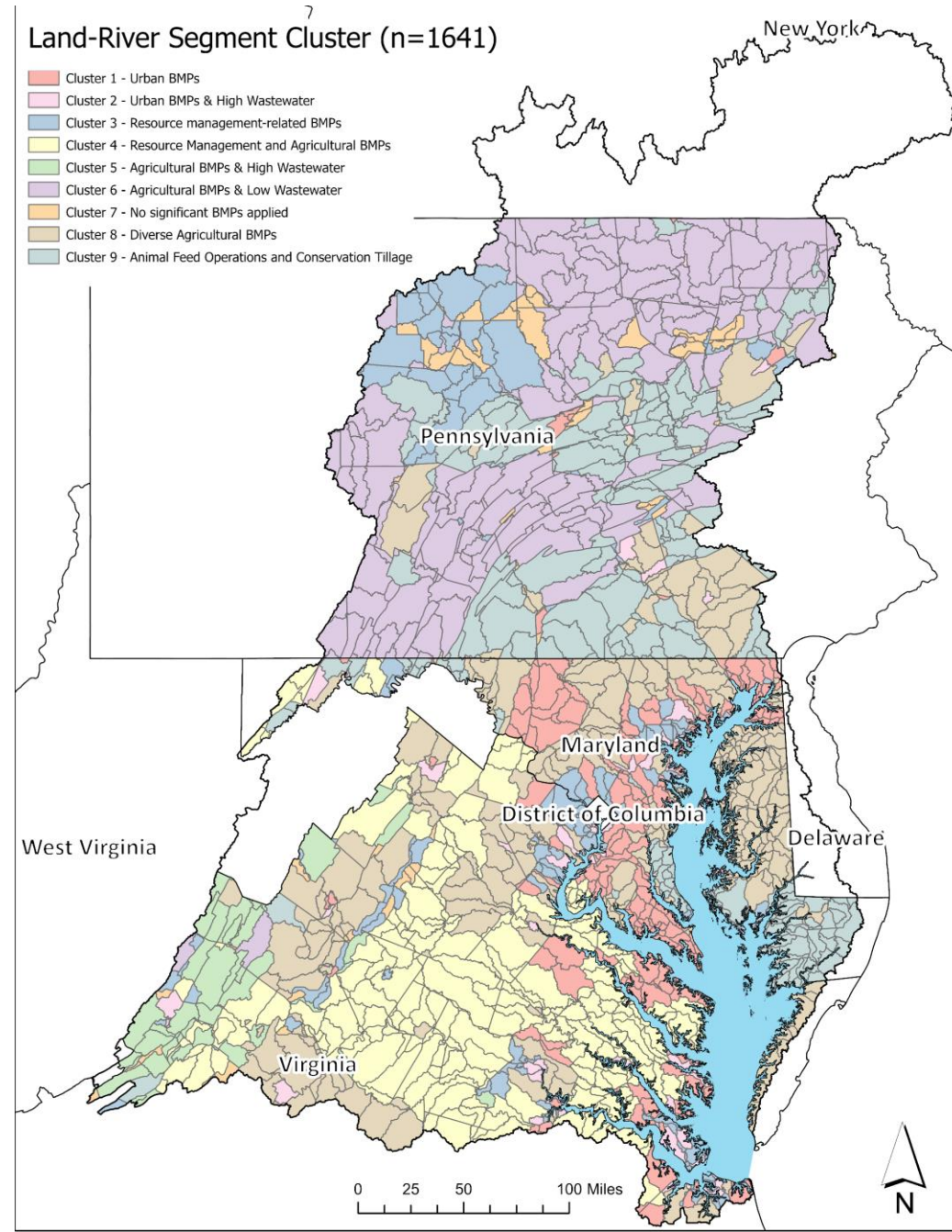
suggests spatial and scalar influences on path dependence

Predictive factors:  $\Delta$ planning behavior



Yoo and Bitterman, under review

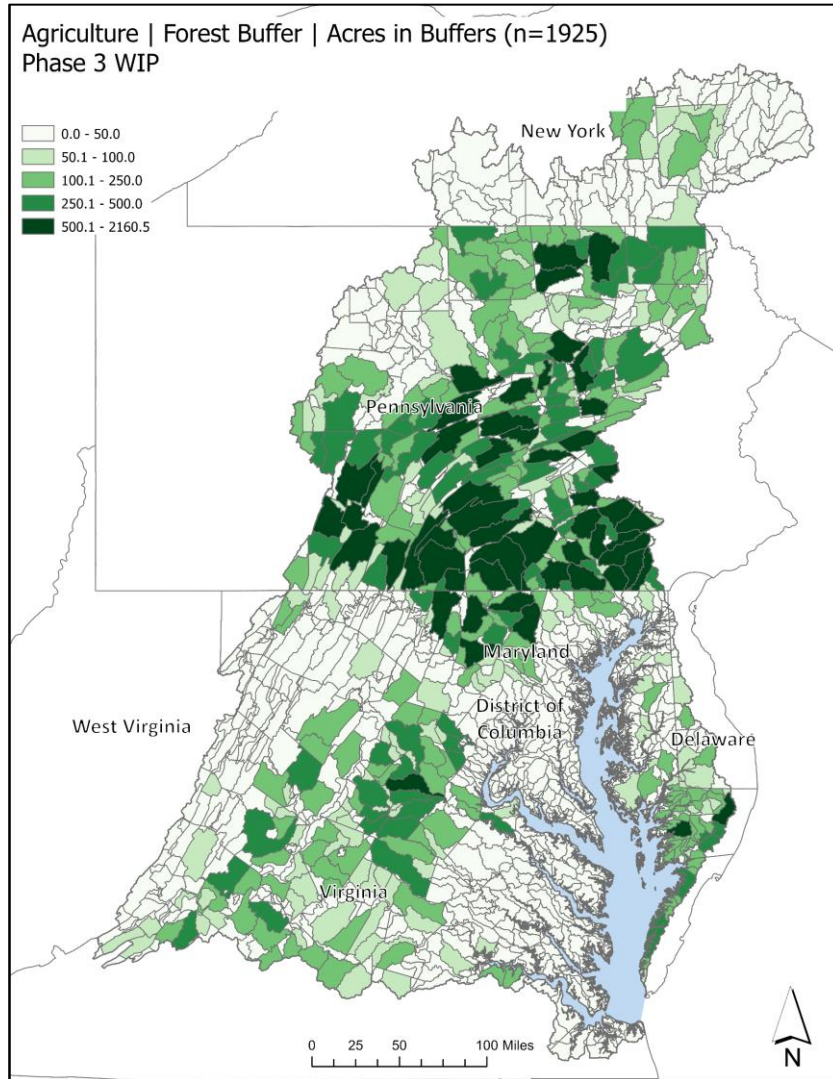
## Clusters of BMP planning behavior



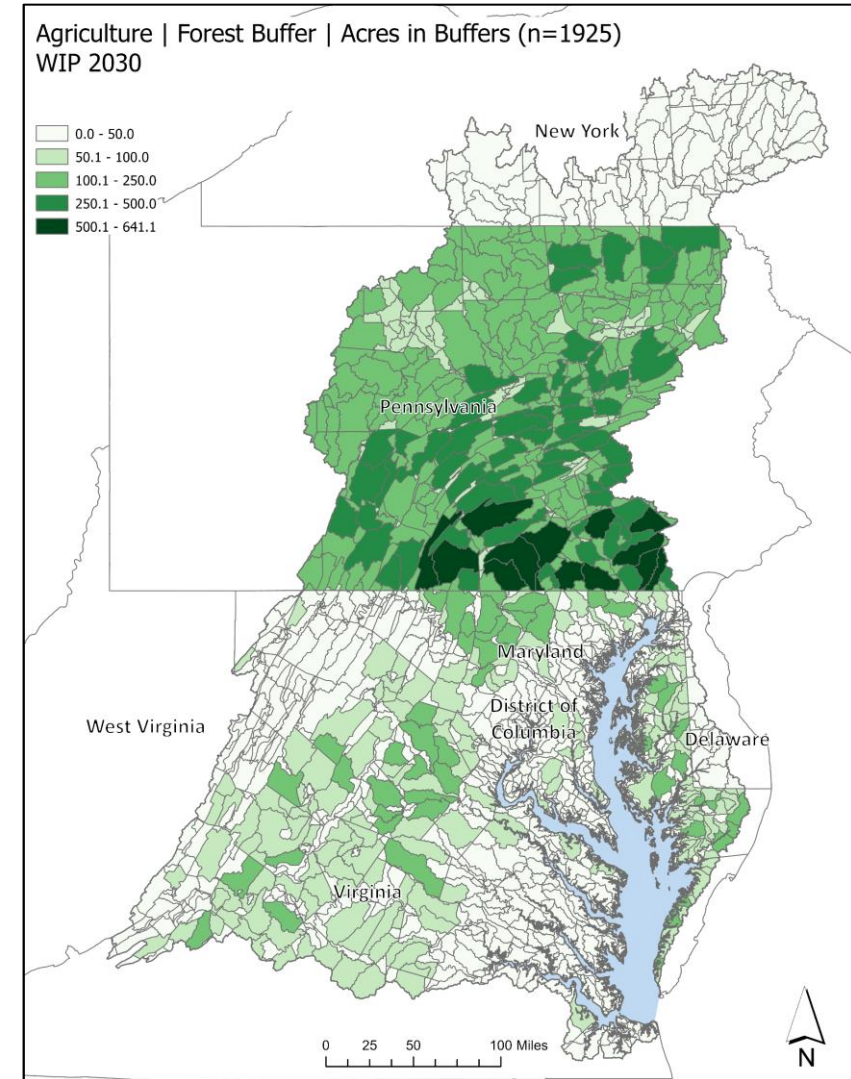
# GeoAI (XGBoost): Spatially-explicit predictions



## Training (WIP3 inputs)



## Prediction (2030 LULC)

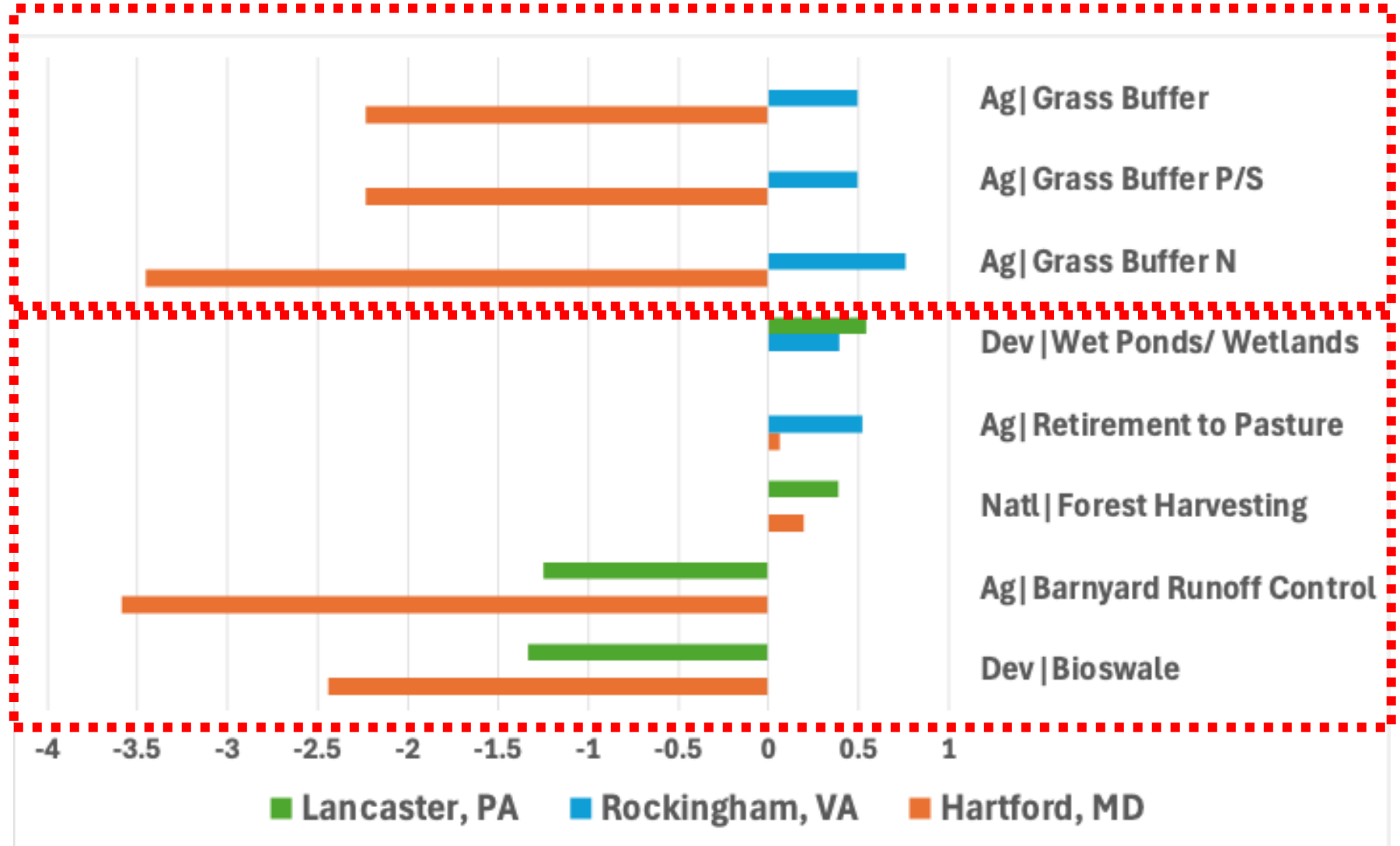




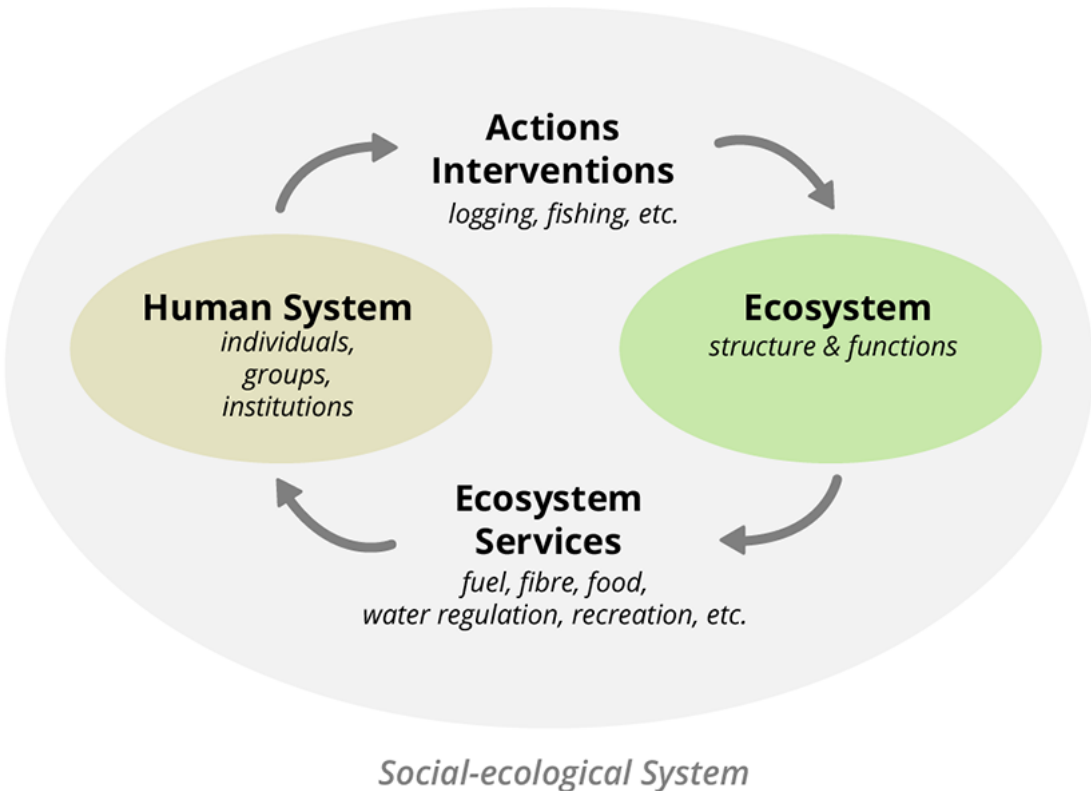
# Model predictions reflect localized past decisions

**3 counties,  
similar  $\Delta$ LULC**

↑ Ag  
↑ Developed  
↓ Natural



# The importance and challenges of integrating social science in social-ecological systems modeling



- Not just **HOW** things change, but also **WHY**  
– drivers rooted in social dynamics
- Social-ecological systems are complex adaptive systems
  - Modeling surprise? Failure? “Black swan” events?
  - If it’s not in the training data, can (geo)AI methods predict its occurrence?
  - **WE NEED MORE DATA ON SOCIAL SYSTEMS!**
- Need to balance quantifiable aspects with the qualitative nuances that shape decision-making

# Thank you!

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NSF award #2009248: CNH2-L: Modeling the dynamics of human and estuarine systems with regulatory feedbacks

NSF award: GCR: Convergent Anthropocene Systems (Anthems) – A System-of-Systems Paradigm