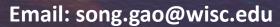


Convergence of CyberGIS and Geospatial Al

Song Gao
Geospatial Data Science Lab
University of Wisconsin–Madison

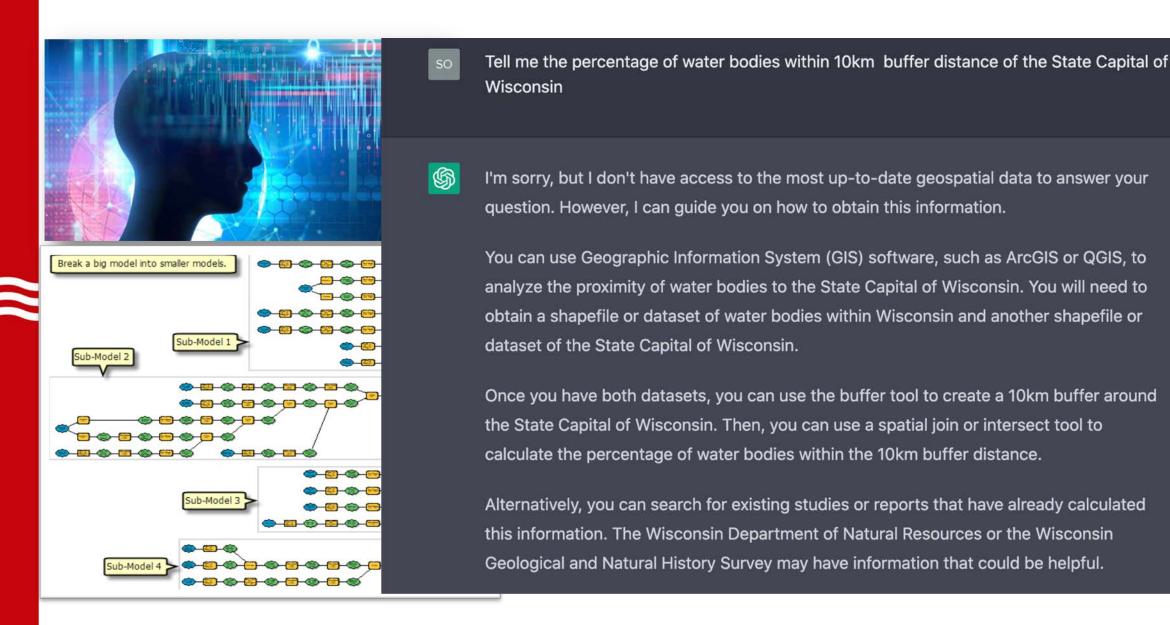




https://geods.geography.wisc.edu/



GeoAl-Enabled GIS Assistant



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Gao & Goodchild (2013). Asking spatial questions to identify GIS functionality.

GeoAl events in the past five years

- IJGIS, GeoInformatica, TGIS GeoAl Special Issues
- ACM SIGSPATIAL GeoAl Workshops

(GeoAl'2017, 2018, 2019, 2021, 2022)

- AAG GeoAl and Deep Learning Symposium (AAG 2018, 2019, 2020, 2022, 2023)
- GIScience GeoKG & GeoAl Workshop (2021 & 2023)
- CPGIS & UCGIS GeoAl Webinar Series
- Trillion Pixel Challenge for GeoAl (ORNL)

Topics: spatially explicit AI models, geographical object detection, spatial scene classification, spatial interpolation and predictions, geospatial semantics, geospatial knowledge graphs, intelligent cartography etc.



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GeoAl: spatially explicit artificial intelligence techniques for geographic knowledge discovery and beyond

Krzysztof Janowicz, Song Gao, Grant McKenzie, Yingjie Hu & Budhendra

To cite this article: Krzyszlof Janowicz, Song Gao, Grant McKenzie, Yingjie Hu & Budhendra Bhaduri (2019): GeoAl: spatially explicit artificial intelligence techniques for geographic knowledge discovery and beyond, International Journal of Geographical Information Science, DOI: 10.1080/13658816.2019.1684500

To link to this article: https://doi.org/10.1080/13658816.2019.1684500





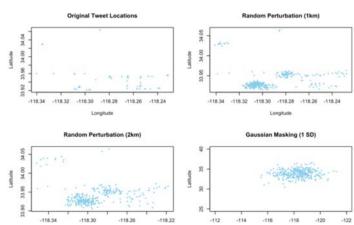
Spatially Explicit AI Models

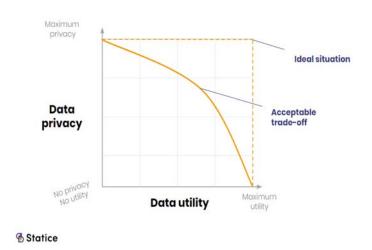
- Invariance test: The results of spatially explicit models are not invariant under relocation of the studied phenomena.
- Representation test: spatially explicit models contain spatial representations
 of the studied phenomena in their implementations (e.g., location encoding)
- Formulation test: spatially explicit models make use of spatial concepts in their formulations, e.g. the notion of a neighborhood.
- Outcome test: spatial structures/forms of inputs and outcomes are different.

Janowicz, Gao, McKenzie, Hu, Bhaduri. (2020) GeoAI: spatially explicit artificial intelligence techniques for geographic knowledge discovery and beyond. *International Journal of Geographical Information Science*, 34(4), pp.625-636.

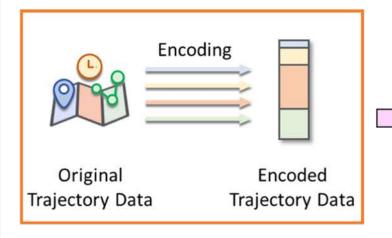
GeoAl for Location Privacy Protection





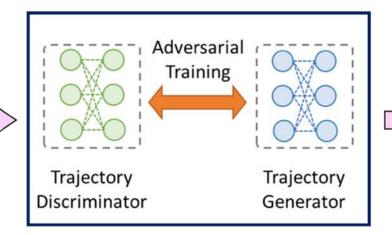


Real Trajectory Data



Trajectory Encoding Model

Trajectory Privacy Protection



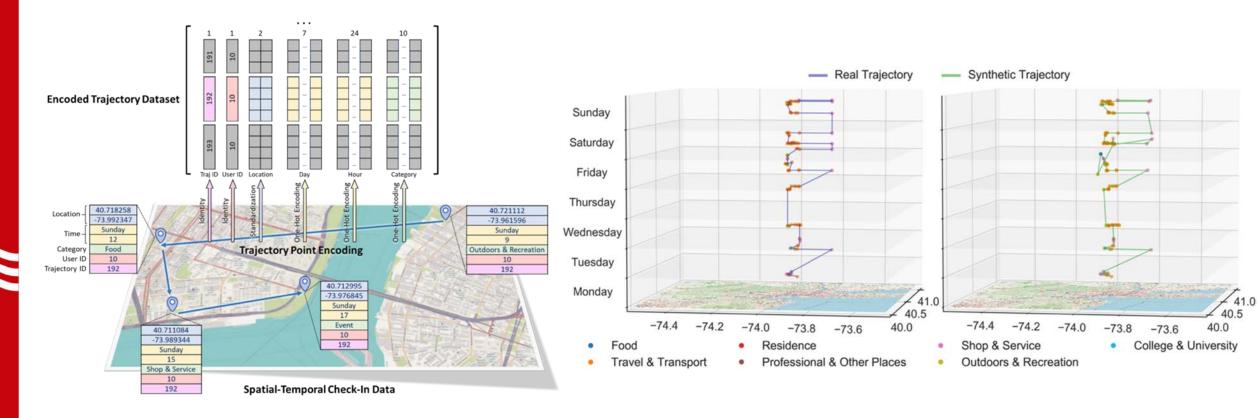
LSTM-TrajGAN Model

Synthetic Trajectory Data



Application Scenarios

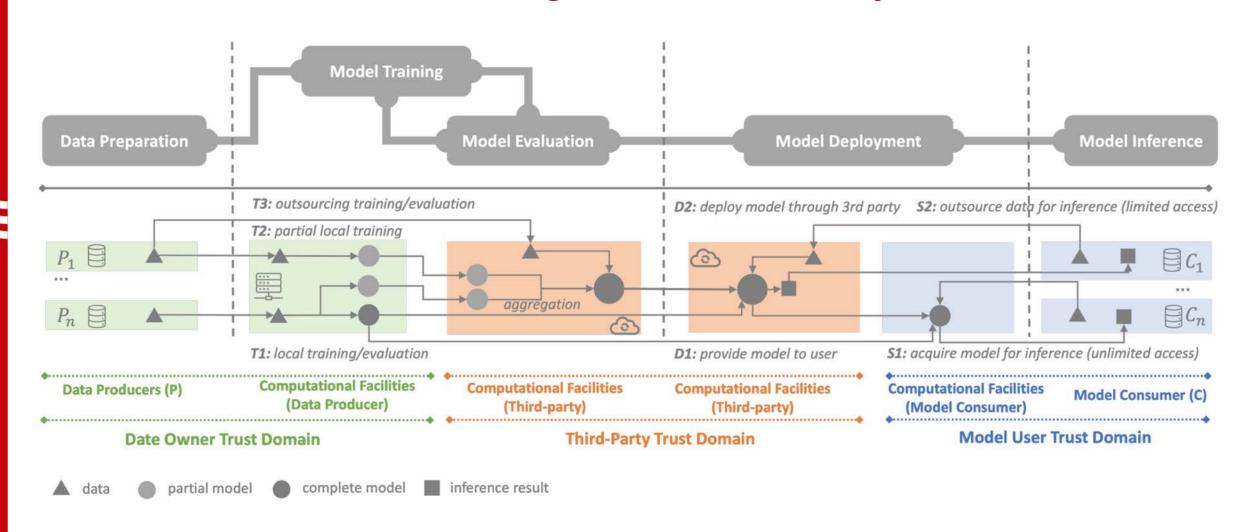
Trajectory Loss Function Design



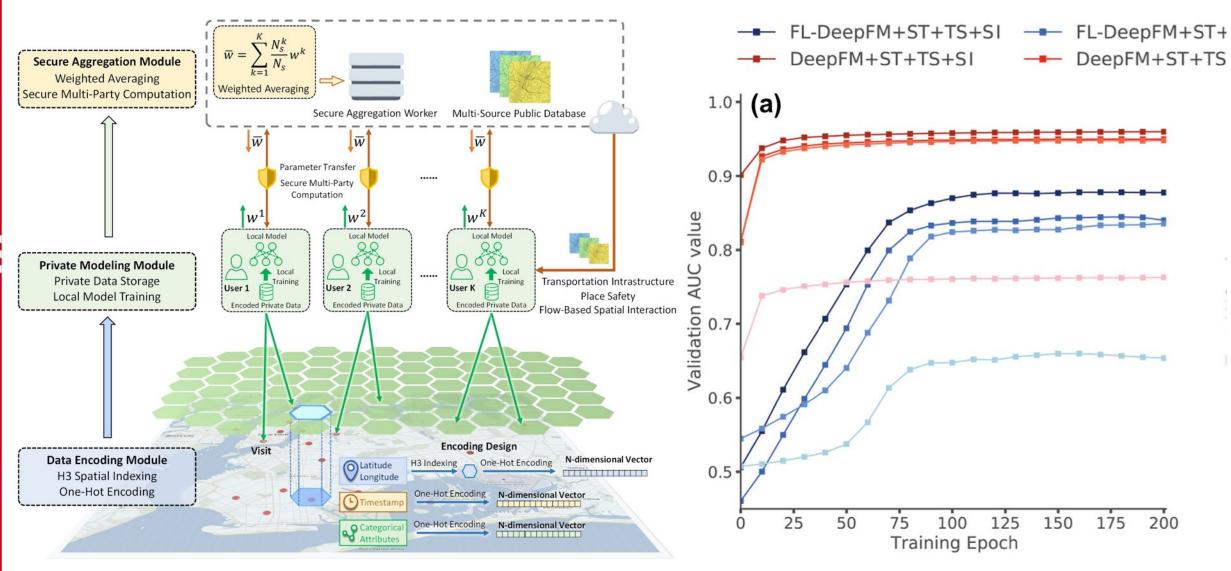
$$TrajLoss(y^r, y^p, t^r, t^s) = \alpha L_{BCE}(y^r, y^p) + \beta L_s(t^r, t^s) + \gamma L_t(t^r, t^s) + cL_c(t^r, t^s)$$

Privacy-Preserving Machine Learning

Build trust in model training and inference on Cyberinfrastructure



Federated Learning-Based Framework



Rao, Gao, Li, & Huang. (2021) A privacy-preserving framework for location recommendation using decentralized collaborative machine learning, *Transactions in GIS*



National AI institute for Intelligent Cyberinfrastructure with Computational Learning in the Environment (ICICLE)



