Data-Driven Discovery of Mechanistic Ecosystem Models with LLMs

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Code and Data Availability

- The code for the LEMMA framework is available in a public GitHub reposi-
- tory at https://github.com/s-spillias/EMs-with-LLMs. The repository
- includes all scripts necessary to reproduce the results presented in this pa-
- per, including the genetic algorithm implementation, model evaluation tools,
- 20 and analysis scripts. The time series data used in the case studies are also
- ²¹ available in the repository. The software is released under an MIT license.

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Declaration on Generative AI Usage

- During the preparation of this manuscript, we used Claude-3.5-Sonnet, a
- 24 large language model, to assist with code documentation, manuscript format-
- 25 ting, and language editing. The scientific content, analyses, interpretations,
- 26 and conclusions presented in this paper were developed and validated by the
- 27 human authors.

28 Author Contributions

- 29 SS: Conceptualization, Methodology, Software, Data curation, Formal analy-
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36 Competing Interests

The authors declare no competing interests.