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## Emergence of linguistic universals in neural agents via artificial language learning and communication

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### Citation

Lian, Y. (2025, December 12). *Emergence of linguistic universals in neural agents via artificial language learning and communication*. Retrieved from <https://hdl.handle.net/1887/4285152>

Version: Publisher's Version

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**Note:** To cite this publication please use the final published version (if applicable).

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