L2M2 2025

The First Workshop on Large Language Model Memorization (L2M2)

Proceedings of the Workshop

The L2M2 organizers gratefully acknowledge the support from the following sponsors.

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ISBN 979-8-89176-278-7

Introduction

The First Workshop on Large Language Model Memorization (L2M2), co-located with ACL 2025 in Vienna, brings together researchers studying the phenomenon of memorization in large language models from multiple perspectives.

Large language models (LLMs) are known to memorize their training data, and this phenomenon has inspired multiple distinct research directions. Some researchers focus on understanding LLM memorization, attempting to localize memorized knowledge or identify which examples are most likely to be memorized. Others aim to edit or remove information that an LLM has memorized. Still others study the downstream implications of LLM memorization, including legal concerns associated with memorizing copyrighted articles, privacy risks associated with LLMs leaking private information, and benchmarking concerns that LLMs are memorizing test data.

This workshop seeks to provide a central venue for researchers studying LLM memorization from these different angles, fostering collaboration and advancing our understanding of this important phenomenon.

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