MSU Trustworthy Al Group

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OurTeam

MSU Trustworthy AI Group

• Collaborators: amazon Meta

Recent research projects:

- Large language model (LLM):
 - Data set: HC-Var [XRH2023] hannxu/hc_var
 - Data memorization [ZLR2023]
- Adversarial attack & defense:
 - Library: DeepRobust (Top-3 in Github) [LJX2021]
 - Poisoning attack [HXR2023a,b,XLW2023]
 - Adversarial training: methodology [HXR2022, XLL2021], theory [XSG2020, XRG2020, XSG2021, XSG2022a, b, c]

Hugging Face

• Watermark: IP protection for pre-training (Diffusion-Shield) and fine-tuning (FT-Shield) [CRX2023, CRL2023]



Our Current Research Interests • Properties of LLM:

- Empirical & theoretical.
- Understand how LLM works.
- In-context learning (ICL).
- Memorization.
- Generated text detection.
- Attack and defense in LLM:
 - Poisoning attack in finetuning and ICL.
 - Jailbreaking attack & defense in ICL.

Circulation revenue has increased by 5% in Finland. // Positive

Circulation revenue has increased by 5% in Finland. // Finance

Panostaja did not disclose the purchase They price. // Neutral Chan

Paying off the national debt will be extremely painful. // Negative

The company anticipated its operating profit to improve. // _____

They defeated ... in the NFC Championship Game. // Sports

Apple ... development of in-house chips. // Tech

The company anticipated its operating profit to improve. // _____







Our Recent Research Project

Memorization of LLM in fine-tuning

Existing literature: LLM can reproduce pre-training data.

Our observation:

- LLM memorizes data in the fine-tuning stage.
- Memorization level depends on <u>the task-specific</u> <u>features</u>.
- <u>Attention score</u> can help quantify the vulnerability of memorization, and <u>multi-task learning</u> alleviates memorization.
- <u>Theory</u>: the level of memorization can be connected to (1) the number of features, (2) sparsity of features.



Our Team MSU Trustworthy Al Group

Highlights

- Our projects are backboned by both theoretical guarantees and strong empirical improvements.
- We have strong expertise in attack & defense, and we are the first batch to study theories in LLM & ICL.
- Our team has contributed a lot to the open-source community with data sets and tools.





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