In-Context Learning for Natural Language Generation

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- BSc, MSc, Open: MSc
- General Topic Area: Large Language Model, In-Context Learning, Natural Language Generation
- Prerequisites: enthusiasm, Good programming background (preferably python), basic knowledge of Natural Language Processing, Deep Learning, and Pytorch
- Details: Large Language Models (LLM), represented by LLaMA [1], LLaMA 2 [2], and ChatGPT,[1] have exhibited good in-context learning results.

  Recent studies have investigated the pattern of in-context learning in terms of sample selection [3, 4, 5], sample ordering [6], and input-label mapping [7, 8, 9].

  However, these studies mainly focus on classification instead of generation.

  In this thesis, the task is to address one or more of the following research questions.

  - Focusing on a generation task, including but not limited to Summarization, Dialog, Simplification/Compression, Question Answering, Creative Writing, Data-to-Text, and Question Generation.
  - Focusing on an investigation perspective, including but not limited to sample selection, sample ordering, and input-label mapping.

References

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[1] `https://openai.com/blog/chatgpt`

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