CEN 5016: Software Engineering

Fall 2024



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Week 7- Class I: More LLMs & Open Source Software



Administrivia



- Assignment 4
 - Due Monday, October 7th
 - Exploring Static Analysis Tools and CI with a simple Python app
 - Accept the Assignment on GitHub Classroom
- SDE Project Part 2
 - Due Tuesday, October 15th (updated deadline!)
 - Dr. Moran is working on Feedback
 - Two parts:
 - Process & Implementation Snapshot
 - Checkpoint Presentation



Today's Presentation Overview



- Input: Prompt Engineering
- How do LLMs generate Output?
- LLM Evaluation
- Accessing LLM
- Productizing LLM







- Rewording text prompts to achieve desired output. Lowhanging fruit to improve LLM performance!
- Popular prompt styles:
 - <u>Zero-shot:</u> instruction + no examples
 - Few-shot: instruction + examples of desired input-output pairs
 - Chain of Thoughts: Breaking down into multiple prompts



Task: Classify the following bug report as either a "Bug" or a "Feature Request."

Few-shot Prompt:

Example 1:

- Bug Report: "The application crashes every time I try to open the settings menu."
- Classification: Bug

Example 2:

- Bug Report: "It would be great if the app supported dark mode for better visibility at night."
- Classification: Feature Request

Example 3:

- Bug Report: "The app doesn't save my preferences after closing it, and I have to set them again."
- Classification: Bug

Example 4:

- Bug Report: "Can you add a function to export data in CSV format?"
- Classification: Feature Request

New Input:

- Bug Report: "The app freezes when I try to upload a file larger than 10MB."
- Classification: [MODEL OUTPUT: Bug]



- Few-shot prompting strategy
 - Example responses include reasoning
 - Useful for solving more complex word problems [arXiv]

• Example:

Q: A person is traveling at 20 km/hr and reached his destiny in 2.5 hr then find the distance? Answer Choices: (a) 53 km (b) 55 km (c) 52 km (d) 60 km (e) 50 km

A: The distance that the person traveled would have been 20km/hr * 2.5 hrs = 50km The answer is (e).



Problem: A school is organizing a field trip and they need to arrange transportation for 120 students. They can rent vans that can hold 12 students each or buses that can hold 40 students each. If the school rents 2 buses, how many vans are needed to transport the remaining students?

Prompt 1: Restate the problem and break it down.

Response 1: There are 120 students in total, and we are renting 2 buses. Each bus can hold 40 students. We need to find out how many vans, which can hold 12 students each, are required for the remaining students



Prompt 2: Compute the number of students accommodated by the buses.

<u>Response 2</u>: Each bus can hold 40 students, and we are renting 2 buses. So, 2 buses can transport $2 \times 40 = 80$ students.

Prompt 3: Subtract the number of students already accommodated from the total number of students.

<u>Response 3</u>: We have 120 students, and 80 of them can be transported by the buses. Therefore, there are 120 - 80 = 40 students remaining.

Prompt 4: Calculate how many vans are required for the remaining students.

Response 4: Each van can hold 12 students, so we need to divide the remaining 40 students by 12 to see how many vans are needed. $40 \div 12 = 3.33$. Since we can't have a fraction of a van, we round up to 4 vans





- Retrain part of the LLM with your own data
- Create dataset specific to your task
- Provide input-output examples (>= 100)
- Example:
 - I have a online store that sells books
 - A Human agent replies all customers' query
 - How can I replace the agent with an LLM?



- RAG: Retrieval-Augmented Generation
- Used when you want LLMs to interact with a large knowledge base (e.g. codebase, company documents)

 Store chunks of knowledge base in Vector DB
 Retrieve most "relevant" chunks upon query, add to prompt

- Pros: Only include most relevant context → performance, #tokens
- Cons: Integration, Vector DB costs, diminishing returns

Information Retrieval and RAG



• 1. Store semantic embeddings of documents





• Embeddings are a representation of text aiming to capture semantic meaning.





 2. Retrieve most relevant embeddings, combine with prompt









• First, do we have a labeled dataset?





Textual Comparison: Embeddings



• Embeddings are a representation of text aiming to capture semantic meaning.











- Suppose we don't have an evaluation dataset.
- What do we care about in our output?
- Example: creative writing
 - Lexical Diversity (unique word counts)
 - Semantic diversity (pairwise similarity)
 - Bias



1. Correctness of Test Cases

- Quality: The unit tests should correctly cover the intended functionality of the code, ensuring that the assertions and logic align with the expected behavior.
- Heuristic:
 - Manual Review: Perform a code review to check if the assertions correctly match the expected behavior for each function.
 - **Automated Pass/Fail**: Run the generated unit tests on a set of known-good code implementations to see if they pass or fail correctly based on expected outcomes.

2. Code Coverage

- Quality: The generated tests should cover a significant portion of the codebase, including edge cases and all branches of logic.
- Heuristic:
 - Code Coverage Tool: Use a tool like pytest-cov or JaCoCo to measure how much of the code is covered by the generated unit tests. Target a high percentage of branch and statement coverage.





- Web Interface
- API



- LLM returns sequence of calls to your function
 Supported on GPT-3.5, GPT-4
- 1. List all APIs/functions the LLM has access to.
- Additional prompt to figure out which APIs to use



- 1. Specify Available Functions
- Example from OpenAl

```
"model": "gpt-3.5-turbo-0613",
"messages": [
 {"role": "user", "content": "What is the weather like in Boston?"}
"functions": [
   "name": "get_current_weather",
   "description": "Get the current weather in a given location",
    "parameters": {
      "type": "object",
     "properties": {
       "location": {
         "type": "string",
         "description": "The city and state, e.g. San Francisco, CA"
       },
       "unit": {
          "type": "string",
         "enum": ["celsius", "fahrenheit"]
      "required": ["location"]
```

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- 1. Specify Available Functions
- Example from OpenAl







- 1. Model Response Contains Function Calls
- Example from OpenAl

```
{
    "id": "chatcmpl-123",
    ....
    "choices": [{
        "index": 0,
        "message": {
            "role": "assistant",
            "content": null,
            "function_call": {
                "name": "get_current_weather",
                "arguments": "{ \"location\": \"Boston, MA\"}"
            },
            "finish_reason": "function_call"
            }]
            }
```



```
curl https://api.openai.com/v1/chat/completions -u :$OPENAI_API_KEY -H 'Content-Type: application/json' -d '{
  "model": "gpt-3.5-turbo-0613",
  "messages": [
    {"role": "user", "content": "What is the weather like in Boston?"},
   {"role": "assistant", "content": null, "function_call": {"name": "get_current_weather", "arguments": "{ \"location\": \"Boston, MA\"}"}},
   {"role": "function", "name": "get_current_weather", "content": "{\"temperature\": "22", \"unit\": \"celsius\", \"description\": \"Sunny\"}"
  ],
  "functions": [
      "name": "get_current_weather",
      "description": "Get the current weather in a given location",
      "parameters": {
        "type": "object",
        "properties": {
          "location": {
            "type": "string",
            "description": "The city and state, e.g. San Francisco, CA"
          },
          "unit": {
           "type": "string",
           "enum": ["celsius", "fahrenheit"]
        },
        "required": ["location"]
```







- Most LLMs will charge based on prompt length.
- Use these prices together with assumptions about usage of your application to estimate operating costs.
- Some companies (like OpenAI) quote prices in terms of tokens chunks of words that the model operates on.
- GCP Vertex Al Pricing
- OpenAl API Pricing
- Anthropic Al Pricing



- Making inferences using LLMs can be slow...
- Strategies to improve performance:
- Caching store LLM input/output pairs for future use
- Streaming responses supported by most LLM API providers. Better UX by streaming response line by line.



- Was the data used to train these LLMs obtained illegally?
- Who owns the IP associated with LLM outputs?
- Should sensitive information be provided as inputs to LLMs? ARTIFICIAL INTELLIGENCE / TECH / LAW

ARTIFICIAL INTELLIGENCE / TECH / CREATORS

Al art tools Stable Diffusion and Midjourney targeted with copyright lawsuit



/ The suit claims generative AI art tools violate copyright law by scraping artists' work from the web without their consent.

The lawsuit that could rewrite the rules of AI copyright



Microsoft, GitHub, and OpenAl are being sued for allegedly violating copyright law by reproducing open-source code using AI. But the suit could have a huge impact on the wider world of artificial intelligence.

Whoops, Samsung workers accidentally leaked trade secrets via ChatGPT

ChatGPT doesn't keep secrets.

Open-Source Software



Learning Goals



- Distinguish between open-source software, free software, and commercial software.
- Identify the common types of software licenses and their implications.
- Distinguish between copyright and intellectual property.
- Express an educated opinion on the philosophical/political debate between open source and proprietary principles.
- Describe how open-source ecosystems work and evolve, in terms of maintainers, community contribution, and commercial backing
- Identify various concerns of commercial entities in leveraging open-source, as well as strategies to mitigate these.

The Importance of Open-Source











- Source code availability
- Right to modify and creative derivative works
- (Often) Right to redistribute derivate works

Common Misconceptions about Open Source



- Quality
 - Myth: Lower quality than proprietary
 - **Reality:** Often meets or exceed industry standards
- Support and Maintenance
 - Myth: Lack of Professional support
 - **Reality:** Robust support community
- Security
 - Myth: Less secure because code is public
 - **Reality:** Transparency allows quicker identification and fixing

Benefits of Open Source Software



• For Individuals

- Learning opportunities
- Customization
- Cost Saving
- For Business
 - Flexibility
 - Security
 - Community Support



- **Copyleft:** Requires derivatives to maintain the same license (e.g., GPL)
- **Permissive:** Allows proprietary use of modified code (e.g., MIT, Apache)



Type: Copyleft

Key Terms:

- Any derivative work must be distributed with the same GPL license.
- The source code must be made available to users, enabling them to modify and redistribute it.
- Commercial use is allowed, but any distributed version of the software (including commercial ones) must adhere to the GPL terms.





Type: Permissive

Key Terms:

- The software can be used for personal, commercial, or open-source purposes.
- There's no requirement to release derivative works as open source.
- The original copyright notice and license must be included in all copies or substantial portions of the software.
- No warranties or liability are provided by the authors of the software.



Type: Permissive with additional patent rights

Key Terms:

- Users can use the software for both open-source and proprietary purposes.
- The license includes an express grant of patent rights, ensuring that contributors cannot sue users for patent infringement related to their contributions.
- Modifications to the original software must be clearly marked.
- The original copyright notice and license must be included in any derivative works.

Contrast with Proprietary Software: A Black Box

- Intention is to be used, not examined, inspected, or modified.
- No source code only download a binary (e.g., an app) or use via the internet (e.g., a web service).
- Often contains an End User License Agreement (EULA) governing rights and liabilities.
- EULAs may specifically prohibit attempts to understand application internals.

Contrast with Proprietary Software: A Black Box



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Free Software vs. Open Source



- Free software origins (70-80s ~Stallman)
 - Cultish Political goal
 - Software part of free speech
 - free exchange, free modification
 - proprietary software is unethical
 - security, trust
 - GNU project, Linux, GPL license
- Open source (1998 ~O'Reilly)
 - Rebranding without political legacy
 - Emphasis on internet and large dev/user involvement
 - Openness toward proprietary software/coexist
 - (Think: Netscape becoming Mozilla)





Perception (from some):

- Anarchy
- Demagoguery
 - Ideology
 - Altruism

Open-Source Ecosystems



The Cathedral and the Bazaar







Cathedral

- Developed centrally by a core group of members
- Available for all once complete (or at releases)
- Examples: GMU Emacs, GCC (back in the 1990s)
- "Sort of" examples today: Chrome Intellij

<u>Bazaar</u>

- Developed openly and organically
- Wide participation (in theory, anyone can contribute)
 Examples: Linux



• Core members

- Often (but not always) includes the original creators
- Direct push access to main repository
- May be further split into admin roles and developers
- External contributors
 - File bug reports and report other issues
 - Contribute code and documentation via pull requests
- Other supporters
 - Beta testers (users)
 - Sponsors (financial or platform)
 - Steering committees or public commenters (for standards and RFCs)
- Spin-offs
 - Maintainers of forks of the original repository



- Mature OSS projects often have strict contribution guidelines
 - Look for CONTRIBUTING.md or similar
- Common requirements:
 - Coding style (recall: linters) and passing static checks
 - Inclusion of test cases with new code
 - Minimum number of code reviews from core devs
 - Standards for documentation
 - Contributing licensing agreements (more on that later)





- Some OSS projects are managed by for-profit firms
 Examples: Chromium (Google), Moby (Docker), Ubuntu (Canonical), TensorFlow (Google), PyTorch (Meta), Java (Oracle)
 - Contributors may be a mix of employees and community volunteers
 - Corporations often fund platforms (websites, test servers, deployments, repository hosting, etc.)
 - Corporations usually control long-term vision and feature roadmap
- Many OSS projects are managed by non-profit foundations or ad- hoc communities
 Examples: Apache Hadoop/Spark/Hbase/Kafka/Tomcat (ASF), Firefox (Mozilla), Python (PSF), NumPy (community)
 - Foundations fund project infrastructure via charitable donations
 - Long-term vision often developed via a collaborative process (e.g., Apache) or by benevolent dictators (e.g., Python, Linux)
- Corporations still heavily rely on community-owned OSS projects
 Many OSS non-profits are funded by Big Tech (e.g., Mozilla by Google)

Example: Apache



WHAT MAKES THE APACHE WAY SO HARD TO DEFINE?

The Apache Way is a living, breathing interpretation of one's experience with our community-led development process. Apac unique, diverse, and focused on the activities needed at a particular stage of the project's lifetime, including nurturing comm building awareness. What is important is that they embrace:

- Earned Authority: all individuals are given the opportunity to participate, but their influence is based on publicly earne community. Merit lies with the individual, does not expire, is not influenced by employment status or employer, and is r project cannot be applied to another). More on merit.
- Community of Peers: individuals participate at the ASF, not organizations. The ASF's flat structure dictates that roles ar
 equal weight, and contributions are made on a volunteer basis (even if paid to work on Apache code). The Apache com
 with respect in adherence to our Code of Conduct. Domain expertise is appreciated; Benevolent Dictators For Life are o
 participation.
- Open Communications: as a virtual organization, the ASF requires all communications related to code and decision-m
 asynchronous collaboration, as necessitated by a globally-distributed community. Project mailing lists are archived, put
 - dev@ (primary project development)
 - user@ (user community discussion and peer support)
 - commits@ (automated source change notifications)
 - occasionally supporting roles such as marketing@ (project visibility)

...as well as restricted, day-to-day operational lists for Project Management Committees. Private decisions on code, policies, or discourse and transactions must be brought on-list. More on communications and the use of mailing lists.

- Consensus Decision Making: Apache Projects are overseen by a self-selected team of active volunteers who are contril Projects are auto-governing with a heavy slant towards driving consensus to maintain momentum and productivity. W establish at all times, holding a vote or other coordination may be required to help remove any blocks with binding dec More on decision making and voting.
- Responsible Oversight: The ASF governance model is based on trust and delegated oversight. Rather than detailed ru
 governance is principles-based, with self-governing projects providing reports directly to the Board. Apache Committer
 reviewed commits, employing mandatory security measures, ensuring license compliance, and protecting the Apache
 abuse. More on responsibility.



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Corporate Outlook Towards Open-source





Redmond top man Satya Nadella: 'Microsoft LOVES Linux'

Open-source 'love' fairly runneth over at cloud event





MapReduce: Simplified Data Processing on Large Clusters

Jeffrey Dean and Sanjay Ghemawat

jeff@google.com, sanjay@google.com

Google, Inc.

Abstract

MapReduce is a programming model and an associated implementation for processing and generating large data sets. Users specify a *map* function that processes a key/value pair to generate a set of intermediate key/value pairs, and a *reduce* function that merges all intermediate values associated with the same intermediate key. Many real world tasks are expressible in this model, as shown in the paper.

Programs written in this functional style are automatically parallelized and executed on a large cluster of commodity machines. The run-time system takes care of the details of partitioning the input data, scheduling the program's execution across a set of machines, handling magiven day, etc. Most such computations are conceptually straightforward. However, the input data is usually large and the computations have to be distributed across hundreds or thousands of machines in order to finish in a reasonable amount of time. The issues of how to parallelize the computation, distribute the data, and handle failures conspire to obscure the original simple computation with large amounts of complex code to deal with these issues.

As a reaction to this complexity, we designed a new abstraction that allows us to express the simple computations we were trying to perform but hides the messy details of parallelization, fault-tolerance, data distribution and load balancing in a library. Our abstraction is inspired by the *map* and *reduce* primitives present in Lisp



Use of Open-Source Software in Companies



- Is the license compatible with our intended use?
 - More on this later
- How will we handle versioning and updates?
 - Does every internal project declare its own versioned dependency or do we all agree on using one fixed (e.g., latest) version?
 - Sometimes resolved by assigning internal "owners" of a third-party dependency, who are responsible for testing updates and declaring allowable versions.
- How to handle customization of the OSS software?
 - Internal forks are useful but hard to sync with upstream changes.
 - One option: Assign an internal owner who keeps internal fork up-todate with upstream.
 - Another option: Contribute all customizations back to upstream to maintain clean dependencies.
 - Security risks? Supply chain attacks on the rise.

Use of Open-Source Software in Companies









Note: I am not a lawyer (this is not legal advice)









GNU General Public License: the Copyleft License



- Nobody should be restricted by the software they use. There are four freedoms that every user should have:
 - the freedom to use the software for any purpose,
 - the freedom to change the software to suit your needs,
 - the freedom to share the software with your friends and neighbors, and
 - the freedom to share the changes you make.
- Code must be made available
- Any modifications must be relicensed under the same license (copyleft)



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• Software must be a library

 Similar to GPL but does not consider dynamic binding as "derivative work"

 So, proprietary code can depend on LGPL libraries as long as they are not being modified

• See also: GPL with classpath exception (e.g., Oracle JDK)

MIT License



- Simple, commercial-friendly license
- Must retain copyright credit
- Software is provided as is
- Authors are not liable for software
- No other restrictions



- Sun open-sourced OpenOffice, but when Sun was acquired by Oracle, Oracle temporarily stopped the project.
- Many of the community contributors banded together and created LibreOffice
- Oracle eventually released OpenOffice to Apache
- LibreOffice changed the project license so LibreOffice can copy changes from OpenOffice but OpenOffice cannot do the same due to license conflicts

Copyright vs. Intellectual Property



- IP and Patents cover an idea for solving a problem
 - Examples: Machine designs, pharma processes to manufacture certain drugs, (controversially) algorithms
 Have expiry dates. IP can be licensed or sold/
 - transferred for \$\$\$.
- Copyrights cover particular expressions of some work
 - Examples: Books, music, art, source code
 - Automatic copyright assignment to all new work unless a license authorizes alternative uses.
- Exceptions for trivial works and ideas.

Contributor License Agreements (CLA)



- Often a requirement to sign these before you can contribute to OSS projects
- Scoped only to that project
- Assigns the maintainers specific rights over code that you contribute
- Without this, you own the copyright and IP for even small bug fixes and that can cause them legal headaches in the future





- Open-source software harnesses the collective power of stakeholders not directly associated with main developers
- Open-source ecosystems thrive in many application domains where reuse is common (e.g., platforms, frameworks, libraries)
- Corporations rely on open-source even if they develop proprietary software or services.
- Open-source licenses must be chosen carefully to align with intended use case.
- You will all contribute to OSS in this class!