

两种不同解决策略:

RAG VS Finetune

- 低成本
- 可实时更新
- 受基座模型影响大
- 单次回答知识有限
- 可个性化微调

動概·主持 💇

- 知识覆盖面广
- 成本高昂
- 无法实时更新

RAG:外挂知识库,把检索的文章和用户提示词一起交给大模型,占用上下文长度大

RAG过程:

RAG: 检索增强生成 文本向量化 匹配相似文本段

基于LangChain:



RAG方案优化建议

⑩ 附生·訓语

- 基于RAG的问答系统性能核心受限于:
 - 。 检索精度
 - o Prompt性能
- 一些可能的优化点:
 - 。 检索方面:
 - 基于语义进行分割,保证每一个chunk的语义完整
 - 给每一个chunk生成概括性索引,检索时匹配索引
 - o Prompt方面:
 - 迭代优化Prompt策略

实现过程:

```
| root@intern-stix | root@intern-stip | root@intern
        Finised!
Now you can use your environment by typing:
conda activate InternLM
(base) root@intern-studio:/opt/jupyterlab# []
```

配置环境,安装依赖:

```
 \blacksquare \ \text{root@interm-st} \times \\ \blacksquare \ \text{root@interm-st} \times \\ \blacksquare \ \text{react\_web\_dem} \times \\ \blacksquare \ \text{download.py} \quad \times \\ \blacksquare \ \text{web\_demo.py} \quad \times \\ \blacksquare \ \text{cli\_demo.py} \quad \times \\ \blacksquare \ \text{download.py} \quad \times \\ \ \text{download.py} \quad \times \\ \blacksquare \ \text{download.py} \quad \times \\ \ \text{download.py} \quad \times \\ \blacksquare \ \text{download.py} \quad \times \\ \ \text{dow
               WARNING: Running pip as the 'root' user can result in broken permissions and conflicting behaviour with the system package manager. It is recommended to use a virtual environment instead: https://pip.ppa.io/warnings/verv
          environment instead: https://pip.pypa.io/warnings/venv
(InternLUD roofslittens valido:/op/hyputerlally pip install accelerate=0.24.1
Looking in indexes: https://pypi.tuna.tsinghua.edu.cn/simple
Collecting accelerate=0.24.1
Sing cached https://pypi.tuna.tsinghua.edu.cn/simple
Collecting accelerate=0.24.1
pyp-none-mny.whl (261 kB
       Using cached https://pypi.tuma.tsinghum.edu.cn/packages/13/9e/ee987874038f293000961f6ff49e0bcb60bb9c56709ebe0bfa8707a4d8/accelerate=0.24.1-py3-none}
Requirement already satisfied: numpy=1.17 in /root/.conda/envs/InternIM/lib/python3.10/site-packages (from accelerate=0.24.1) (1.26.2)
Requirement already satisfied: packaging=20.0 in /root/.local/lib/python3.10/site-packages (from accelerate=0.24.1) (2.3.2)
Requirement already satisfied: pysual in /root/.local/lib/python3.10/site-packages (from accelerate=0.24.1) (6.0.1)
Requirement already satisfied: torch=1.10.0 in /root/.conda/envs/InternIM/lib/python3.10/site-packages (from accelerate=0.24.1) (2.0.1)
Requirement already satisfied: huggingface-hub in /root/.local/lib/python3.10/site-packages (from accelerate=0.24.1) (0.0.2)
Requirement already satisfied: huggingface-hub in /root/.local/lib/python3.10/site-packages (from accelerate=0.24.1) (0.0.2)
Requirement already satisfied: suppin /root/.conda/envs/InternIM/lib/python3.10/site-packages (from accelerate=0.24.1) (0.9.2)
Requirement already satisfied: typing-extensions in /root/.local/lib/python3.10/site-packages (from torch=1.10-?accelerate=0.24.1) (1.11)
Requirement already satisfied: suppin /root/.conda/envs/InternIM/lib/python3.10/site-packages (from torch=1.10-?accelerate=0.24.1) (1.11)
Requirement already satisfied: networks in /root/.conda/envs/InternIM/lib/python3.10/site-packages (from torch=0.10-?accelerate=0.24.1) (3.1)
Requirement already satisfied: respect=0/20.3.5.0 in /root/.conda/envs/InternIM/lib/python3.10/site-packages (from torch=0.10-?accelerate=0.24.1) (3.1)
Requirement already satisfied: respect=0/20.3.5.0 in /root/.conda/envs/InternIM/lib/python3.10/site-packages (from torch=0.10-?accelerate=0.24.1) (2.3.10)
Requirement already satisfied: requests in /root/.conda/envs/InternIM/lib/python3.10/site-packages (from bingingface-hub->accelerate=0.24.1) (2.3.10)
Requirement already satisfied: reduire=0/20.2.5 in /root/.conda/envs/InternIM/lib/python3.10/site-packages (from bingingface-hub->acce
               (2.0.4)

Requirement already satisfied: idna(4,>=2.5 in /root/, conda/envs/InternIM/lib/python3.10/site-packages (from requests-huggingface-hub->accelerate==0.24.1) (3.4)

Requirement already satisfied: urllib3(3,>=1.21.1 in /root/, conda/envs/InternIM/lib/python3.10/site-packages (from requests->huggingface-hub->accelerate==0.24.1) (1.26

18)
                                          irement already satisfied; certifi>=2017.4.17 in /root/.conda/envs/InternLM/lib/python3.10/site-packages (from requests->huggingface-hub->accelerate==0.24.1) (2023
                 . II. II. 78 (Requirement already satisfied: mpmath>=0.19 in /root/.conda/envs/InternLM/lib/python3.10/site-packages (from sympy->torch>=1.10.0->accelerate==0.24.1) (1.3.0)
          Requirement already satisfied: mpath>0.19 in /roo Installing collected packages: accelerate Installing collected packages: accelerate Found existing installation: accelerate 0.26.0 Linistalling accelerate-0.26.0: Successfully installed accelerate-0.24.1 WaRNING: Reming pip as the 'root' user can result environment instead; https://pip.pypa.to/warnings/v(InternLM) root@intern studio:/pof/jupyterlaid/InternLMO root@intern.
  安装命令行工具:

(InternLIO root@intern*studio:/opt/jupyterlas* pip install -U buggingface_bub

Looking in indexes: https://ppip.tuna.tsingbua.edu.or/simple

Requirement already sastisfied: buggingface_bub in /root/.local/lib/python3.10/site-packages (0, 20, 2)

Requirement already satisfied: filelock in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from huggingface_bub) (2023, 12, 2)

Requirement already satisfied: fispec-2023.5 to in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from huggingface_bub) (20, 31, 0)

Requirement already satisfied: requests in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from huggingface_bub) (6, 61, 1)

Requirement already satisfied: pypaul>-5.1 in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from huggingface_bub) (6, 0, 1)

Requirement already satisfied: typing=ventenion>-5.7.4.3 in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from huggingface_bub) (23, 2)

Requirement already satisfied: charset-moralizer(A)-p2 in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from requests->huggingface_bub) (20, 4)

Requirement already satisfied: charset-moralizer(A)-p2 in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from requests->huggingface_bub) (20, 4)

Requirement already satisfied: charset-moralizer(A)-p2 in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from requests->huggingface_bub) (20, 4)

Requirement already satisfied: charset-moralizer(A)-p2 in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from requests->huggingface_bub) (20, 4)

Requirement already satisfied: charset-moralizer(A)-p2 in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from requests->huggingface_bub) (20, 4)

Requirement already satisfied: cutific>2017.4 17 in /root/.conda/envs/InternLIV1b/python3.10/site-packages (from requests->huggingface_bub) (20, 2)

RANNIC: Ranning pipa as the 'root' user can result in broken permissions and conflicting behaviour with the system package manager. It is recommended to use
  安装命令行工具:
                                                                                                                                     ip as the 'root' user can resul
d: https://pip.pypa.io/warnings
tern studio:/opt/jupyterlab#
Consider Using in_transfer for laster ownice its feeting 14 files: 100% |
Fetching 14 files: 100% |
Fetching 14 files: 100% |
Foot data/model/sentence-transformer (InternIA) root@intern studio: //data# d /root (InternIA) root@intern studio: # []
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               14/14 [00:00<00:00, 14 11it/s]
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           下载本项目代码:
          (base) rot@intern studio:/opt/jupyterlab# conda activate InternIM
(InternIM) rot@intern studio:/opt/jupyterlab# cd/rot/data
(InternIM) rot@intern studio:/data# git clone https://github.com/InternIM/tutorial
Cloning into 'tutorial' ...
fatal: unable to access 'https://github.com/InternIM/tutorial/ . Received HTIP code 503 from proxy after CONNECT
(InternIM) rot@intern-studio: 'data# git clone https://kgithub.com/InternIM/tutorial
            (InternIM/ root@intern=studio: "data# git close https://kgithub.com/InternIM/tutorial.
Cloning into 'tutorial'...
fatal: unable to access 'inttps://kgithub.com/InternIM/tutorial/': Received HITP code 503 from proxy after CONNECT
(InternIM/ root@intern studio: 'data# git close https://https://mirror.gbproxy.com/github.com/InternIM/tutorial.
Cloning into 'tutorial'...
fatal: protocol 'https://https' is not supported
(InternIM/ root@intern studio: 'data# littps://mirror.gbproxy.com/https://github.com/InternIM/tutorial.
bash: https://wirror.gbproxy.com/https://github.com/InternIM/tutorial.
Cloning into 'tutorial'...
       (InternAM) roof@internestudio." /dats# git close https://mirror.ghproxy.

Cloning into 'tutorial'...

remote: Bnumerating objects: 548. done.

remote: Country objects: 1096 (137/317). done.

remote: Compressing objects: 1008 (183/83). done.

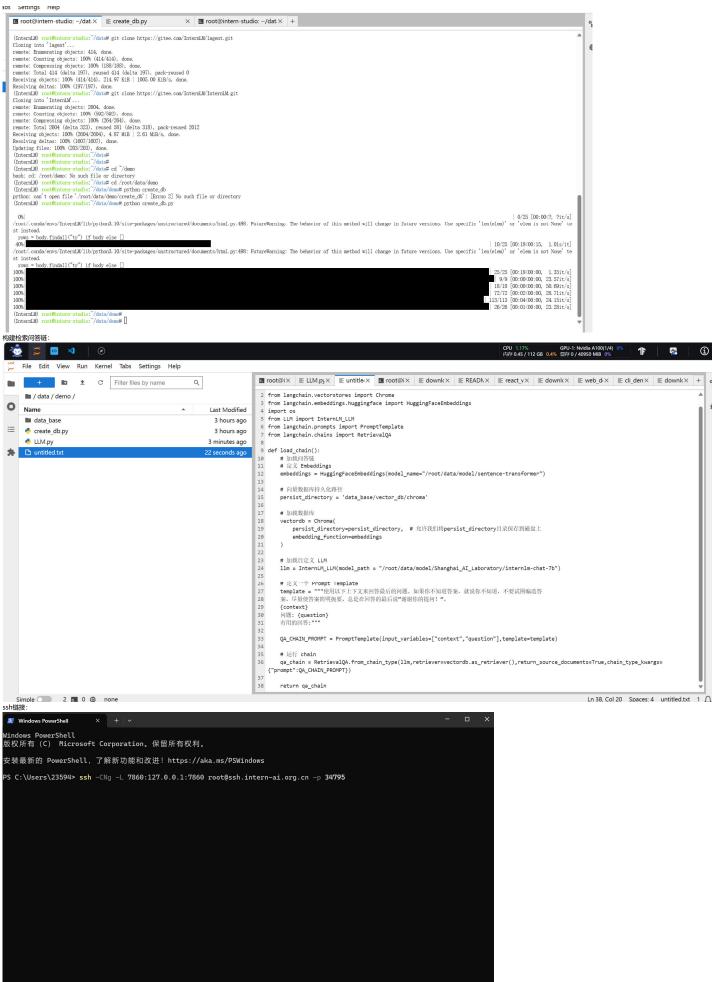
remote: Total 586 (delta 239). remote: 704 (delta 134). pack-reused 231

Receiving objects: 1008 (518/548), 11.41 MiB | 4.36 MiB/s, done.

Resolving delta: 1008 (271/271). done.

(InternAM) roof@internestudio:"/dats#
```

构建向量数据库:



在本地电脑打开web demo:

