自然语言处理导论

MiniGPT4-Finetuning 项目报告

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1.摘要

MiniGPT4-Finetuning 项目旨在基于视觉语言模型 MiniGPT-4，对 **Flickr30k** 数据集开展指令微调，以增强图像-文本理解与生成能力。本文档总结了项目背景、环境配置、模型下载、微调流程、评估结果与未来工作等内容，为后续复现与迭代提供参考。

2. Project Introduction

MiniGPT-4 通过结合视觉编码器与 Vicuna 语言模型，实现了图像到文本的高质量对齐。为了进一步提升其在中文场景下的表现，我们开展了面向 Flickr30k 数据集的指令微调。

实验环境:

- 操作系统: Ubuntu 18.04 LTS
- 显卡: NVIDIA GeForce RTX 3090 × 7
- Python: 3.10.13
- CUDA: 11.7
- PyTorch: 2.0.1

3. Technical Details

3.1. 理论知识

3.1.1. 指令微调

指令微调是一种在预训练语言模型上进行微调的方法，旨在让模型学习到更多的指令相关知识。

3.1.2. 视觉语言模型

视觉语言模型是一种结合了视觉和语言的模型，它能够将图像和文本进行联合建模，从而实现图像到文本的生成。

3.1.3. 评估指标

3.1.3.1. BLEU

BLEU (Bilingual Evaluation Understudy) 是一种广泛使用的机器翻译评估指标。它通过比较生成文本与参考文本之间的n-gram重叠程度来计算分数。BLEU分数范围从0到1,1表示完全匹配。主要特点:

- 计算 n-gram 精确率
- 使用简短惩罚因子
- 支持多个参考文本
- 对词序敏感

3.1.3.2. CIDEr

CIDEr (Consensus-based Image Description Evaluation) 是专门为图像描述任务设计的评估指标。它的主要特点包括:

- 使用 TF-IDF 加权来强调重要词汇
- 考虑 n-gram 的共识程度
- 对罕见但准确的描述给予更高权重
- 分数范围从 0 到 10,越高越好

3.1.3.3. ROUGE-L

ROUGE-L (Recall-Oriented Understudy for Gisting Evaluation - Longest Common Subsequence) 是一种基于最长公共子序列的评估指标。其特点:

- 不要求严格连续匹配
- 考虑词序信息
- 计算召回率和精确率
- 对句子结构敏感
- 分数范围从 0 到 1

3.2. 技术细节

3.2.1. 转换数据集

我们使用 `prepare_flickr30k.py` 脚本将 Flickr30k 数据集转换为适合指令微调的格式。该脚本读取原始的 `flickr_annotations_30k.csv` 文件，并生成一个 JSON 文件，其中每个样本包含图像 ID 和对应的文本描述。

3.2.2. 定义测评指标

我们使用上述 BLEU、CIDEr 和 ROUGE-L 等指标评估模型性能。

在自定义的 `eval_scripts/eval_flickr30k.py` 中，我们利用 `COCO API` 实现了上述评估指标的计算。

4. Experiment Results

4.1. Conda 环境

```
conda env create -f environment.yml
conda activate minigptv
```

4.2. 预训练模型获取

下载 Vicuna-7B 语言模型：

```
git clone https://huggingface.co/Vision-CAIR/vicuna-7b
cd vicuna-7b && git lfs pull
```

下载 MiniGPT-4 视觉-语言模型权重，并配置 `train_configs/minigpt4_flickr_finetune.yaml`。

4.3. 数据准备

执行脚本生成注解文件：

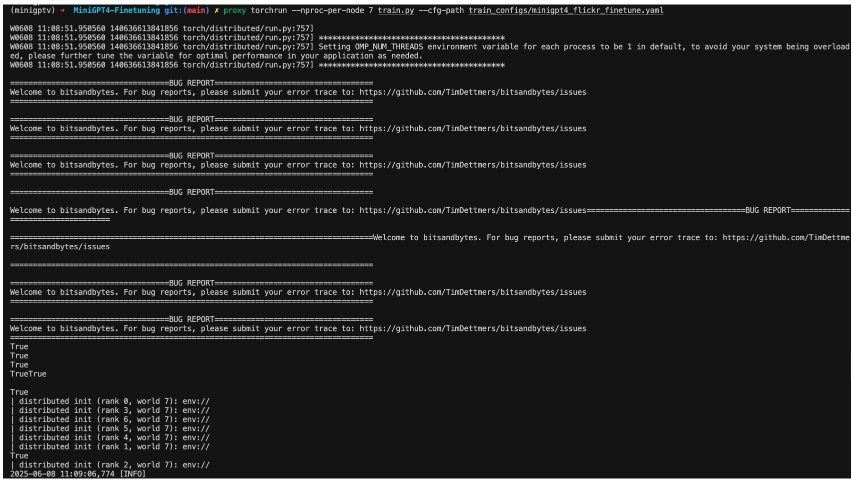
```
python prepare_flickr30k.py
```

4.4. 指令微调

使用单卡 GPU 训练线性映射层：

```
torchrun --nproc-per-node 1 train.py --cfg-path train_configs/
minigpt4_flickr_finetune.yaml
```

训练过程部分如图所示：



```
(minigptv) ➜  MiniGPT4-Finetuning git:(main) ✗ proxy torchrun --nproc-per-node 7 train.py --cfg-path train_configs/minigpt4_flickr_finetune.yaml

W0608 11:08:51.950560 140636613841856 torch/distributed/run.py:757]
W0608 11:08:51.950560 140636613841856 torch/distributed/run.py:757] *****************************************
W0608 11:08:51.950560 140636613841856 torch/distributed/run.py:757] Setting OMP_NUM_THREADS environment variable for each process to be 1 in default, to avoid your system being overload
ed, please further tune the variable for optimal performance in your application as needed.
W0608 11:08:51.950560 140636613841856 torch/distributed/run.py:757] *****************************************

===================================BUG REPORT===================================
Welcome to bitsandbytes. For bug reports, please submit your error trace to: https://github.com/TimDettmers/bitsandbytes/issues
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Welcome to bitsandbytes. For bug reports, please submit your error trace to: https://github.com/TimDettmers/bitsandbytes/issues
================================================================================
True
True
True
TrueTrue

True
| distributed init (rank 0, world 7): env://
| distributed init (rank 3, world 7): env://
| distributed init (rank 6, world 7): env://
| distributed init (rank 5, world 7): env://
| distributed init (rank 4, world 7): env://
| distributed init (rank 1, world 7): env://
True
| distributed init (rank 2, world 7): env://
2025-06-08 11:09:06,774 [INFO]
```
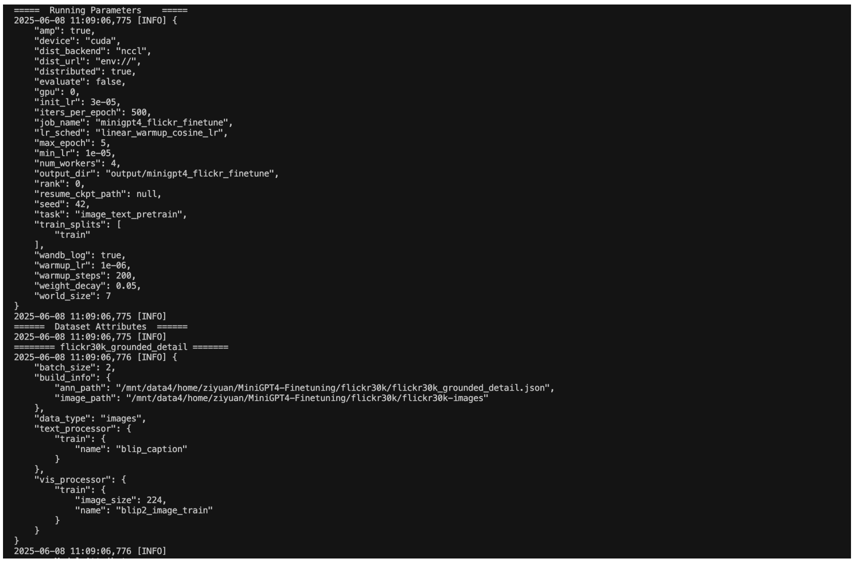
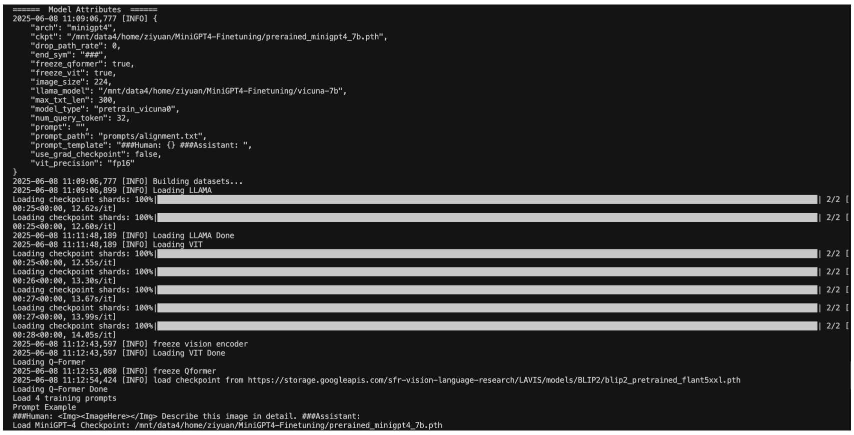
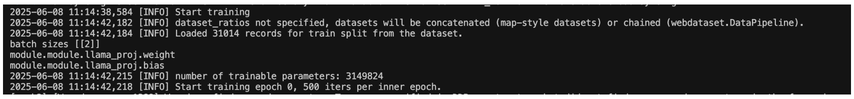



```
 =====  Running Parameters    =====
 2025-06-08 11:09:06,775 [INFO] {
     "amp": true,
     "device": "cuda",
     "dist_backend": "nccl",
     "dist_url": "env://",
     "distributed": true,
     "evaluate": false,
     "gpu": 0,
     "init_lr": 3e-05,
     "iters_per_epoch": 500,
     "job_name": "minigpt4_flickr_finetune",
     "lr_sched": "linear_warmup_cosine_lr",
     "max_epoch": 5,
     "min_lr": 1e-05,
     "num_workers": 4,
     "output_dir": "output/minigpt4_flickr_finetune",
     "rank": 0,
     "resume_ckpt_path": null,
     "seed": 42,
     "task": "image_text_pretrain",
     "train_splits": [
         "train"
     ],
     "wandb_log": true,
     "warmup_lr": 1e-06,
     "warmup_steps": 200,
     "weight_decay": 0.05,
     "world_size": 7
 }
 2025-06-08 11:09:06,775 [INFO]
 ======  Dataset Attributes  ======
 2025-06-08 11:09:06,775 [INFO]
 ======== flickr30k_grounded_detail =======
 2025-06-08 11:09:06,776 [INFO] {
     "batch_size": 2,
     "build_info": {
         "ann_path": "/mnt/data4/home/ziyuan/MiniGPT4-Finetuning/flickr30k/flickr30k_grounded_detail.json",
         "image_path": "/mnt/data4/home/ziyuan/MiniGPT4-Finetuning/flickr30k/flickr30k-images"
     },
     "data_type": "images",
     "text_processor": {
         "train": {
             "name": "blip_caption"
         }
     },
     "vis_processor": {
         "train": {
             "image_size": 224,
             "name": "blip2_image_train"
         }
     }
 }
 2025-06-08 11:09:06,776 [INFO]
```



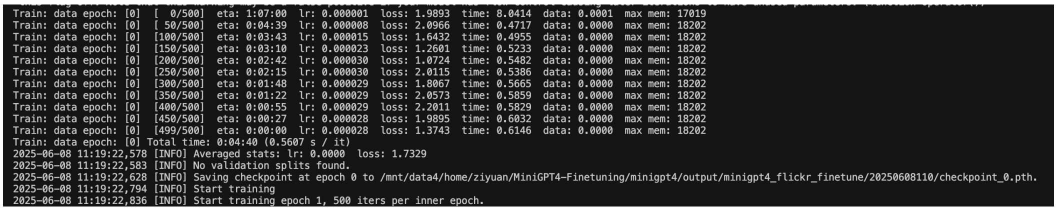
```
======  Model Attributes  ======
2025-06-08 11:09:06,777 [INFO] {
    "arch": "minigpt4",
    "ckpt": "/mnt/data4/home/ziyuan/MiniGPT4-Finetuning/prerained_minigpt4_7b.pth",
    "drop_path_rate": 0,
    "end_sym": "###",
    "freeze_qformer": true,
    "freeze_vit": true,
    "image_size": 224,
    "llama_model": "/mnt/data4/home/ziyuan/MiniGPT4-Finetuning/vicuna-7b",
    "max_txt_len": 300,
    "model_type": "pretrain_vicuna0",
    "num_query_token": 32,
    "prompt": "",
    "prompt_path": "prompts/alignment.txt",
    "prompt_template": "###Human: {} ###Assistant: ",
    "use_grad_checkpoint": false,
    "vit_precision": "fp16"
}
2025-06-08 11:09:06,777 [INFO] Building datasets...
2025-06-08 11:09:06,899 [INFO] Loading LLAMA
Loading checkpoint shards: 100%|████████████████████████████████████████| 2/2 [
00:25<00:00, 12.62s/it]
Loading checkpoint shards: 100%|████████████████████████████████████████| 2/2 [
00:25<00:00, 12.60s/it]
2025-06-08 11:11:48,189 [INFO] Loading LLAMA Done
2025-06-08 11:11:48,189 [INFO] Loading VIT
Loading checkpoint shards: 100%|████████████████████████████████████████| 2/2 [
00:25<00:00, 12.55s/it]
Loading checkpoint shards: 100%|████████████████████████████████████████| 2/2 [
00:26<00:00, 13.30s/it]
Loading checkpoint shards: 100%|████████████████████████████████████████| 2/2 [
00:27<00:00, 13.67s/it]
Loading checkpoint shards: 100%|████████████████████████████████████████| 2/2 [
00:27<00:00, 13.99s/it]
Loading checkpoint shards: 100%|████████████████████████████████████████| 2/2 [
00:28<00:00, 14.05s/it]
2025-06-08 11:12:43,597 [INFO] freeze vision encoder
2025-06-08 11:12:43,597 [INFO] Loading VIT Done
Loading Q-Former
2025-06-08 11:12:53,080 [INFO] freeze Qformer
2025-06-08 11:12:54,424 [INFO] load checkpoint from https://storage.googleapis.com/sfr-vision-language-research/LAVIS/models/BLIP2/blip2_pretrained_flant5xxl.pth
Loading Q-Former Done
Load 4 training prompts
Prompt Example
###Human: <Img><ImageHere></Img> Describe this image in detail. ###Assistant:
Load MiniGPT-4 Checkpoint: /mnt/data4/home/ziyuan/MiniGPT4-Finetuning/prerained_minigpt4_7b.pth
```



```
2025-06-08 11:14:38,584 [INFO] Start training
2025-06-08 11:14:42,182 [INFO] dataset_ratios not specified, datasets will be concatenated (map-style datasets) or chained (webdataset.DataPipeline).
2025-06-08 11:14:42,184 [INFO] Loaded 31014 records for train split from the dataset.
batch sizes [[2]]
module.module.llama_proj.weight
module.module.llama_proj.bias
2025-06-08 11:14:42,215 [INFO] number of trainable parameters: 3149824
2025-06-08 11:14:42,218 [INFO] Start training epoch 0, 500 iters per inner epoch.
```

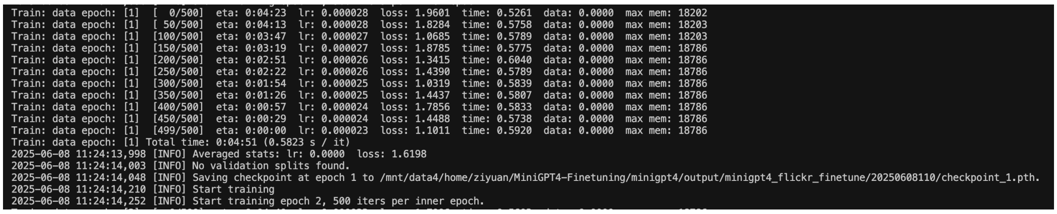
训练结果部分如图所示：

epoch0:



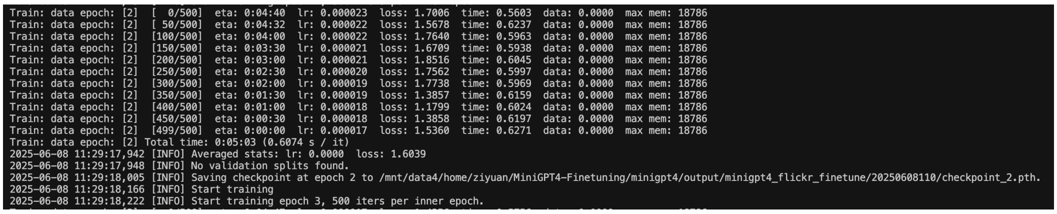
```
Train: data epoch: [0]  [  0/500]  eta: 1:07:00  lr: 0.000001  loss: 1.9893  time: 8.0414  data: 0.0001  max mem: 17019
Train: data epoch: [0]  [ 50/500]  eta: 0:04:39  lr: 0.000008  loss: 2.0966  time: 0.4717  data: 0.0000  max mem: 18202
Train: data epoch: [0]  [100/500]  eta: 0:03:43  lr: 0.000015  loss: 1.6432  time: 0.4955  data: 0.0000  max mem: 18202
Train: data epoch: [0]  [150/500]  eta: 0:03:10  lr: 0.000023  loss: 1.2601  time: 0.5233  data: 0.0000  max mem: 18202
Train: data epoch: [0]  [200/500]  eta: 0:02:42  lr: 0.000030  loss: 1.0724  time: 0.5482  data: 0.0000  max mem: 18202
Train: data epoch: [0]  [250/500]  eta: 0:02:15  lr: 0.000030  loss: 2.0115  time: 0.5386  data: 0.0000  max mem: 18202
Train: data epoch: [0]  [300/500]  eta: 0:01:48  lr: 0.000029  loss: 1.8067  time: 0.5665  data: 0.0000  max mem: 18202
Train: data epoch: [0]  [350/500]  eta: 0:01:22  lr: 0.000029  loss: 2.0573  time: 0.5859  data: 0.0000  max mem: 18202
Train: data epoch: [0]  [400/500]  eta: 0:00:55  lr: 0.000029  loss: 2.2011  time: 0.5829  data: 0.0000  max mem: 18202
Train: data epoch: [0]  [450/500]  eta: 0:00:27  lr: 0.000028  loss: 1.9895  time: 0.6032  data: 0.0000  max mem: 18202
Train: data epoch: [0]  [499/500]  eta: 0:00:00  lr: 0.000028  loss: 1.3743  time: 0.6146  data: 0.0000  max mem: 18202
Train: data epoch: [0] Total time: 0:04:40 (0.5607 s / it)
2025-06-08 11:19:22,578 [INFO] Averaged stats: lr: 0.0000  loss: 1.7329
2025-06-08 11:19:22,583 [INFO] No validation splits found.
2025-06-08 11:19:22,628 [INFO] Saving checkpoint at epoch 0 to /mnt/data4/home/ziyuan/MiniGPT4-Finetuning/minigpt4/output/minigpt4_flickr_finetune/20250608110/checkpoint_0.pth.
2025-06-08 11:19:22,794 [INFO] Start training
2025-06-08 11:19:22,836 [INFO] Start training epoch 1, 500 iters per inner epoch.
```

epoch1:



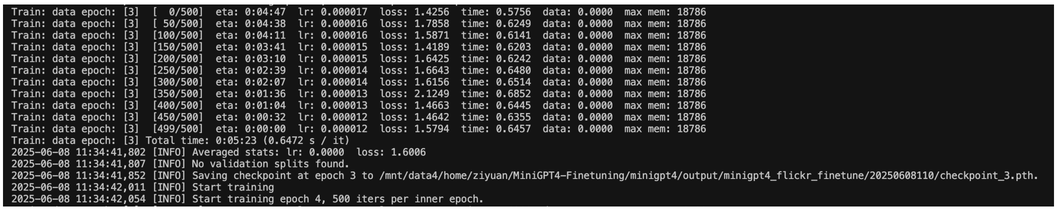
```
Train: data epoch: [1]  [  0/500]  eta: 0:04:23  lr: 0.000028  loss: 1.9601  time: 0.5261  data: 0.0000  max mem: 18202
Train: data epoch: [1]  [ 50/500]  eta: 0:04:13  lr: 0.000028  loss: 1.8284  time: 0.5758  data: 0.0000  max mem: 18203
Train: data epoch: [1]  [100/500]  eta: 0:03:47  lr: 0.000027  loss: 1.0685  time: 0.5789  data: 0.0000  max mem: 18203
Train: data epoch: [1]  [150/500]  eta: 0:03:19  lr: 0.000027  loss: 1.8785  time: 0.5775  data: 0.0000  max mem: 18786
Train: data epoch: [1]  [200/500]  eta: 0:02:51  lr: 0.000026  loss: 1.3415  time: 0.6040  data: 0.0000  max mem: 18786
Train: data epoch: [1]  [250/500]  eta: 0:02:22  lr: 0.000026  loss: 1.4390  time: 0.5789  data: 0.0000  max mem: 18786
Train: data epoch: [1]  [300/500]  eta: 0:01:54  lr: 0.000025  loss: 1.0319  time: 0.5839  data: 0.0000  max mem: 18786
Train: data epoch: [1]  [350/500]  eta: 0:01:26  lr: 0.000025  loss: 1.4437  time: 0.5807  data: 0.0000  max mem: 18786
Train: data epoch: [1]  [400/500]  eta: 0:00:57  lr: 0.000024  loss: 1.7856  time: 0.5833  data: 0.0000  max mem: 18786
Train: data epoch: [1]  [450/500]  eta: 0:00:29  lr: 0.000024  loss: 1.4488  time: 0.5738  data: 0.0000  max mem: 18786
Train: data epoch: [1]  [499/500]  eta: 0:00:00  lr: 0.000023  loss: 1.1011  time: 0.5920  data: 0.0000  max mem: 18786
Train: data epoch: [1] Total time: 0:04:51 (0.5823 s / it)
2025-06-08 11:24:13,998 [INFO] Averaged stats: lr: 0.0000  loss: 1.6198
2025-06-08 11:24:14,003 [INFO] No validation splits found.
2025-06-08 11:24:14,048 [INFO] Saving checkpoint at epoch 1 to /mnt/data4/home/ziyuan/MiniGPT4-Finetuning/minigpt4/output/minigpt4_flickr_finetune/20250608110/checkpoint_1.pth.
2025-06-08 11:24:14,210 [INFO] Start training
2025-06-08 11:24:14,252 [INFO] Start training epoch 2, 500 iters per inner epoch.
```

epoch2:



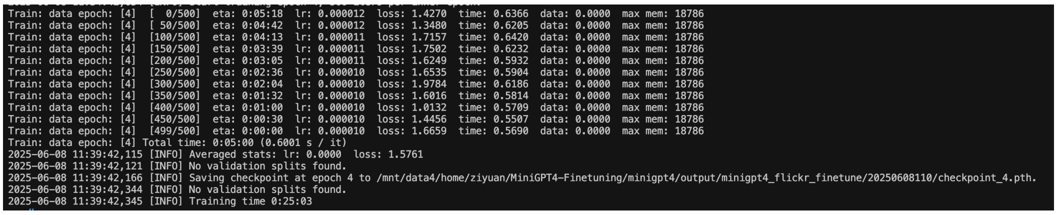
```
Train: data epoch: [2]  [  0/500]  eta: 0:04:40  lr: 0.000023  loss: 1.7006  time: 0.5603  data: 0.0000  max mem: 18786
Train: data epoch: [2]  [ 50/500]  eta: 0:04:32  lr: 0.000022  loss: 1.5678  time: 0.6237  data: 0.0000  max mem: 18786
Train: data epoch: [2]  [100/500]  eta: 0:04:00  lr: 0.000022  loss: 1.7640  time: 0.5963  data: 0.0000  max mem: 18786
Train: data epoch: [2]  [150/500]  eta: 0:03:30  lr: 0.000021  loss: 1.6709  time: 0.5938  data: 0.0000  max mem: 18786
Train: data epoch: [2]  [200/500]  eta: 0:03:00  lr: 0.000021  loss: 1.8516  time: 0.6045  data: 0.0000  max mem: 18786
Train: data epoch: [2]  [250/500]  eta: 0:02:30  lr: 0.000020  loss: 1.7562  time: 0.5997  data: 0.0000  max mem: 18786
Train: data epoch: [2]  [300/500]  eta: 0:02:00  lr: 0.000019  loss: 1.7738  time: 0.5969  data: 0.0000  max mem: 18786
Train: data epoch: [2]  [350/500]  eta: 0:01:30  lr: 0.000019  loss: 1.3857  time: 0.6159  data: 0.0000  max mem: 18786
Train: data epoch: [2]  [400/500]  eta: 0:01:00  lr: 0.000018  loss: 1.1799  time: 0.6024  data: 0.0000  max mem: 18786
Train: data epoch: [2]  [450/500]  eta: 0:00:30  lr: 0.000018  loss: 1.3858  time: 0.6197  data: 0.0000  max mem: 18786
Train: data epoch: [2]  [499/500]  eta: 0:00:00  lr: 0.000017  loss: 1.5360  time: 0.6271  data: 0.0000  max mem: 18786
Train: data epoch: [2] Total time: 0:05:03 (0.6074 s / it)
2025-06-08 11:29:17,942 [INFO] Averaged stats: lr: 0.0000  loss: 1.6039
2025-06-08 11:29:17,948 [INFO] No validation splits found.
2025-06-08 11:29:18,005 [INFO] Saving checkpoint at epoch 2 to /mnt/data4/home/ziyuan/MiniGPT4-Finetuning/minigpt4/output/minigpt4_flickr_finetune/20250608110/checkpoint_2.pth.
2025-06-08 11:29:18,166 [INFO] Start training
2025-06-08 11:29:18,222 [INFO] Start training epoch 3, 500 iters per inner epoch.
```

epoch3:



```
Train: data epoch: [3]  [  0/500]  eta: 0:04:47  lr: 0.000017  loss: 1.4256  time: 0.5756  data: 0.0000  max mem: 18786
Train: data epoch: [3]  [ 50/500]  eta: 0:04:38  lr: 0.000016  loss: 1.7858  time: 0.6249  data: 0.0000  max mem: 18786
Train: data epoch: [3]  [100/500]  eta: 0:04:11  lr: 0.000016  loss: 1.5871  time: 0.6141  data: 0.0000  max mem: 18786
Train: data epoch: [3]  [150/500]  eta: 0:03:41  lr: 0.000015  loss: 1.4189  time: 0.6203  data: 0.0000  max mem: 18786
Train: data epoch: [3]  [200/500]  eta: 0:03:10  lr: 0.000015  loss: 1.6425  time: 0.6242  data: 0.0000  max mem: 18786
Train: data epoch: [3]  [250/500]  eta: 0:02:39  lr: 0.000014  loss: 1.6643  time: 0.6480  data: 0.0000  max mem: 18786
Train: data epoch: [3]  [300/500]  eta: 0:02:07  lr: 0.000014  loss: 1.6156  time: 0.6514  data: 0.0000  max mem: 18786
Train: data epoch: [3]  [350/500]  eta: 0:01:36  lr: 0.000013  loss: 2.1249  time: 0.6852  data: 0.0000  max mem: 18786
Train: data epoch: [3]  [400/500]  eta: 0:01:04  lr: 0.000013  loss: 1.4663  time: 0.6445  data: 0.0000  max mem: 18786
Train: data epoch: [3]  [450/500]  eta: 0:00:32  lr: 0.000012  loss: 1.4642  time: 0.6355  data: 0.0000  max mem: 18786
Train: data epoch: [3]  [499/500]  eta: 0:00:00  lr: 0.000012  loss: 1.5794  time: 0.6457  data: 0.0000  max mem: 18786
Train: data epoch: [3] Total time: 0:05:23 (0.6472 s / it)
2025-06-08 11:34:41,802 [INFO] Averaged stats: lr: 0.0000  loss: 1.6006
2025-06-08 11:34:41,807 [INFO] No validation splits found.
2025-06-08 11:34:41,852 [INFO] Saving checkpoint at epoch 3 to /mnt/data4/home/ziyuan/MiniGPT4-Finetuning/minigpt4/output/minigpt4_flickr_finetune/20250608110/checkpoint_3.pth.
2025-06-08 11:34:42,011 [INFO] Start training
2025-06-08 11:34:42,054 [INFO] Start training epoch 4, 500 iters per inner epoch.
```

epoch4:



```
Train: data epoch: [4]  [  0/500]  eta: 0:05:18  lr: 0.000012  loss: 1.4270  time: 0.6366  data: 0.0000  max mem: 18786
Train: data epoch: [4]  [ 50/500]  eta: 0:04:42  lr: 0.000012  loss: 1.3480  time: 0.6205  data: 0.0000  max mem: 18786
Train: data epoch: [4]  [100/500]  eta: 0:04:13  lr: 0.000011  loss: 1.7157  time: 0.6420  data: 0.0000  max mem: 18786
Train: data epoch: [4]  [150/500]  eta: 0:03:39  lr: 0.000011  loss: 1.7502  time: 0.6232  data: 0.0000  max mem: 18786
Train: data epoch: [4]  [200/500]  eta: 0:03:05  lr: 0.000011  loss: 1.6249  time: 0.5932  data: 0.0000  max mem: 18786
Train: data epoch: [4]  [250/500]  eta: 0:02:36  lr: 0.000010  loss: 1.6535  time: 0.5904  data: 0.0000  max mem: 18786
Train: data epoch: [4]  [300/500]  eta: 0:02:04  lr: 0.000010  loss: 1.9784  time: 0.6186  data: 0.0000  max mem: 18786
Train: data epoch: [4]  [350/500]  eta: 0:01:32  lr: 0.000010  loss: 1.6016  time: 0.5814  data: 0.0000  max mem: 18786
Train: data epoch: [4]  [400/500]  eta: 0:01:00  lr: 0.000010  loss: 1.0132  time: 0.5709  data: 0.0000  max mem: 18786
Train: data epoch: [4]  [450/500]  eta: 0:00:30  lr: 0.000010  loss: 1.4456  time: 0.5507  data: 0.0000  max mem: 18786
Train: data epoch: [4]  [499/500]  eta: 0:00:00  lr: 0.000010  loss: 1.6659  time: 0.5690  data: 0.0000  max mem: 18786
Train: data epoch: [4] Total time: 0:05:00 (0.6001 s / it)
2025-06-08 11:39:42,115 [INFO] Averaged stats: lr: 0.0000  loss: 1.5761
2025-06-08 11:39:42,121 [INFO] No validation splits found.
2025-06-08 11:39:42,166 [INFO] Saving checkpoint at epoch 4 to /mnt/data4/home/ziyuan/MiniGPT4-Finetuning/minigpt4/output/minigpt4_flickr_finetune/20250608110/checkpoint_4.pth.
2025-06-08 11:39:42,344 [INFO] No validation splits found.
2025-06-08 11:39:42,345 [INFO] Training time 0:25:03
```

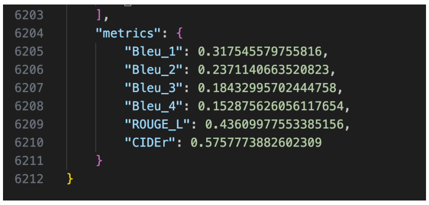
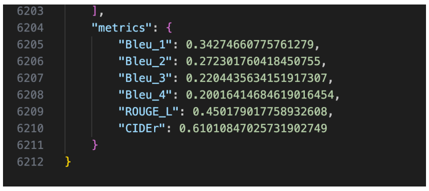
4.5. 评估

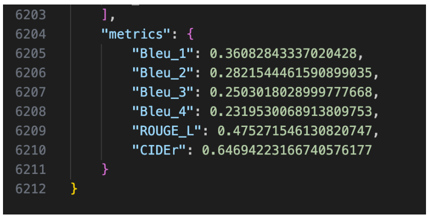
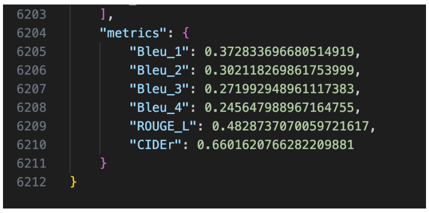
运行如下脚本在多模型间对比性能：

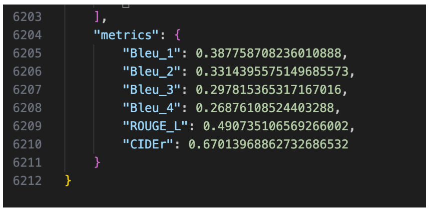
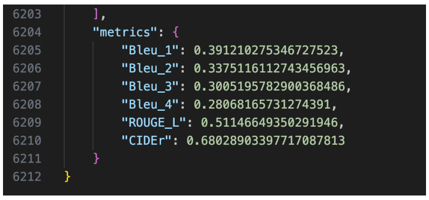
```
bash evaluate.sh
```

4.6. 评估结果可视化

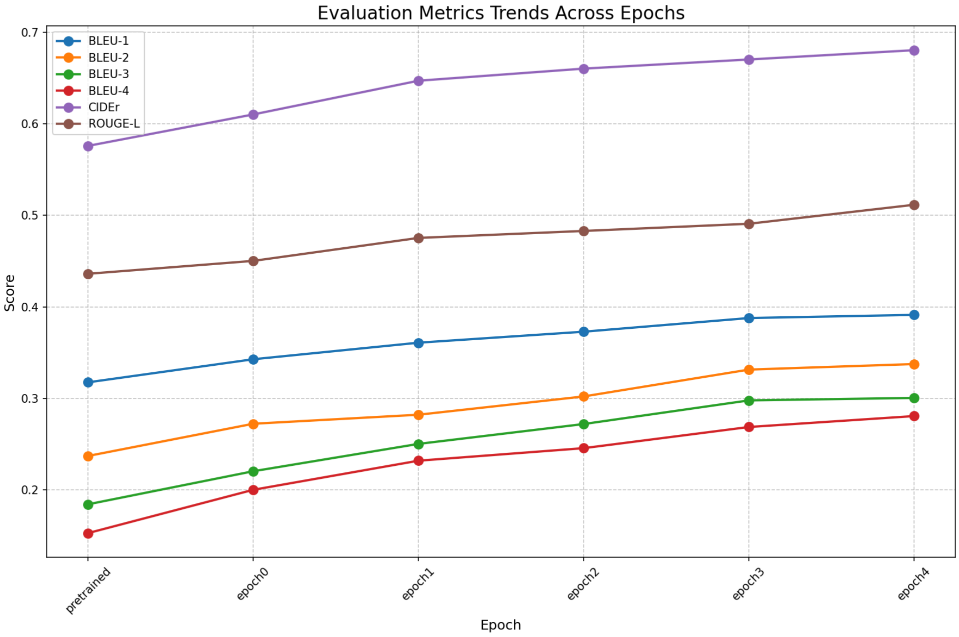
下表汇总 `eval_result` 目录中的全部评估图片：

pretrained:	
	],
	"metrics": {
	"Bleu_1": 0.317545579755816,
	"Bleu_2": 0.2371140663520823,
	"Bleu_3": 0.18432995702444758,
	"Bleu_4": 0.15287562605611765 4,
	"ROUGE_L": 0.43609977553385156,
	"CIDEr": 0.5757773882602309
	}
	}
		epoch0:	
			],
			"metrics": {
			"Bleu_1": 0.34274660775761279,
			"Bleu_2": 0.27230176041845075 5,
			"Bleu_3": 0.22044356341519173 07,
			"Bleu_4": 0.20016414684619016454,
			"ROUGE_L": 0.4501790177589326 08,
			"CIDEr": 0.61010847025731902749
			}
			}

epoch1:	
	],
	"metrics": {
	"Bleu_1": 0.36082843337020428,
	"Bleu_2": 0.282154446159089903 5,
	"Bleu_3": 0.25030180289997776 68,
	"Bleu_4": 0.23195300689138097 53,
	"ROUGE_L": 0.475271546130820747,
	"CIDEr": 0.64694223166740576177
	}
	}
		epoch2:	
			],
			"metrics": {
			"Bleu_1": 0.372833696680514919,
			"Bleu_2": 0.302118269861753999,
			"Bleu_3": 0.271992948961117383,
			"Bleu_4": 0.245647988967164755,
			"ROUGE_L": 0.482873707005972161 7,
			"CIDEr": 0.66016207662822098 81
			}
			}

epoch3:	
	],
	"metrics": {
	"Bleu_1": 0.387758708236010888,
	"Bleu_2": 0.331439557514968557 3,
	"Bleu_3": 0.297815365317167016,
	"Bleu_4": 0.26876108524403288,
	"ROUGE_L": 0.490735106569266002,
	"CIDEr": 0.67013968862732686532
	}
	}
		epoch4:	
			],
			"metrics": {
			"Bleu_1": 0.391210275346727523,
			"Bleu_2": 0.337511611274345696 3,
			"Bleu_3": 0.300519578290036848 6,
			"Bleu_4": 0.28068165731274391,
			"ROUGE_L": 0.51146649350291946,
			"CIDEr": 0.68028903397717087813
			}
			}

以直观的折线图表示为：



4.7. 结果与分析

4.7.1. 模型性能持续提升

随着训练轮次（Epoch）的增加，所有评价指标均呈现稳定上升趋势，表明模型通过迭代学习有效捕捉了文本生成任务的核心规律。其中：

- 语义与连贯性优化显著：CIDEr 和 ROUGE-L 的增速远超其他指标（详见图表斜率），说明模型在生成内容的语义相关性、上下文连贯性上提升最为突出，逐渐接近人类语言表达模式。
- 局部一致性稳步改进：BLEU 系列指标增长平缓但持续（BLEU-1 至 BLEU-4 增幅约 50%-80%），反映模型在局部词汇匹配和短语结构的准确性上逐步完善。

4.7.2. 训练动态揭示关键拐点

- 早期快速收敛：pretrained 至 epoch1 阶段所有指标快速跃升，验证预训练权重提供了高质量初始化。
- 中后期差异化优化：epoch2 后 CIDEr 与 ROUGE-L 仍保持陡峭上升，而 BLEU 系列进入平缓增长期，表明模型后期更侧重于语义整体性而非局部词序精确度，符合文本生成任务的本质目标。
- 持续训练价值：截至 epoch4，各曲线仍未出现平台期，建议扩展训练轮次（如至 epoch6）以挖掘性能潜力。
- 重点优化方向：可针对性设计长依赖文本和抽象语义的增强训练模块（如注意力机制改进），进一步发挥 CIDEr 与 ROUGE-L 的优势。

4.7.3. 局限性与后续工作

- 评估维度补充：需增加人工评价或SPICE 等细粒度指标，验证模型在视觉语义对齐上的表现（若为多模态任务）。
- 泛化能力检验：当前结果基于单一数据集，需在跨领域数据上验证鲁棒性。
- 探索更大的语言模型后端。
- 优化推理速度与显存占用。

References

[1]MiniGPT-4: Enhancing Vision-Language Understanding with Advanced Large Language Models

[2]minigpt4 github 仓库

[3]Flickr30k 数据集