Cancer prediction by VLM

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Many people studied cancer prediction to detect malignant patterns in histopathology slides from tissue images. Most have used deep learning models, particularly CNN to extract features from the image. But, CNN will check whether it is malignant. If we have labeled with cancer stage then we can predict the stage at most and nothing more than that. Here I will propose one method that not only extracts the information of malignancy and stage of it but also some other information if it has. For that, we will use the vision language model (VLM).

VLM can be used for many purposes, but here I will use it for image captaining. However, any open-source model for image captaining is trained on general data. As I want in a particular domain, therefore, I need to fine-tune the model. After fine-tuning the model, we can pass an image that I want to detect and it will return a description of the image which is called a caption. Now, I can check how accurate the generated caption is by a text-image model. If the accuracy is not up to the mark, then I can pass the caption to an LLM model to improve the caption. Check the accuracy of the caption with the image, and repeat this method until reach the desired accuracy. Finally, we will get the final caption.

Fine-tune

• Fine-tune BLIP model with image and corresponding caption

Caption generate

 Generate caption using fine-tuned BLIP model for the image we want to predict.

Evaluation

Check the generated caption matched with image or not by CLIP model.

Improve

Pass the generated caption to an LLM model to improve the caption.
Repeat this step untill we get a caption with desired accuracy.

In my case, images and corresponding descriptions look like the following:

Image	Description
	Cervical histopathology image showing abnormal squamous cells

Histopathology scan revealing early-stage cervical carcinoma
Cervical biopsy slide showing no malignant cell clusters

Note that, in the original data set it is only known whether a particular image is malignant or not. I randomly wrote the description.

Setup: (Because of the limited resource)

- * Reduce the image shape to (16,16)
- ❖ Fine-tune the BLIP model with
 - ➤ 20 images + description data
 - per_device_train_batch_size=1
 - > num_train_epochs=1
 - > per_device_eval_batch_size=1
 - gradient_accumulation_steps=2,
 - ➤ fp16=True
 - > save_total_limit=1
- ❖ Used **gpt-4o-mini** LLM model to improve caption.

Sample output:

Image	Description
	Histopathological image of cervical tissue
A CONTRACTOR	demonstrating cellular abnormalities suggestive of
	potential pre-cancerous changes. Key features
AND	highlighted in the image include atypical cell
	morphology, an elevated nuclear-cytoplasmic ratio,
TWO TEST TO THE	and variations in cellular architecture, all of which
	are crucial for accurate diagnosis and assessment of
	risk." Accuracy: 0.3218
	Detailed overview of cervical histopathology,
	emphasizing key cellular structures such as
	squamous epithelial cells, glandular cells, and
A MARIA STATE OF THE STATE OF T	stromal components, while identifying potential
A STANKE THE NEW	abnormalities such as dysplasia, HPV infection, and
A VOYA O	neoplastic changes that may indicate specific
	cervical conditions." Accuracy: 0.3059

You can find the code in my <u>GitHub</u> page: <u>Debashis9564/Cancer-prediction-by-VLM</u>

I believe if the training dataset size is large and the corresponding description is almost accurate, and if I have all the resources then we don't have to compress the image and we can take a good batch and epoch size. Then the predicted accuracy will be good.