DL Lab4: Image Generative Models

Lab Objective:

In this assignment, you will need to implement image generative model (VAE & GAN).

Rules:

- (1) This assignment should be done individually. Plagiarism is strictly prohibited.

 Once the T.A. finds plagiarism, you will receive a score of 0 on this assignment.
- (2) Only **PyTorch** frameworks are allowed in this lab, beyond that you can only use numpy, matplotlib, and other Python standard library.
- (3) The assignment format and files are not in accordance with the regulations, the report score × 0.9.
- (4) If the assignment is missing or incomplete training for any item, the assignment score will be deducted proportionally to the incompleteness.
- (5) If you submit your assignment late, your score will be multiplied by 0.9 for each day of delay.

Submission:

- (1) Please write your code on Jupyter notebook.
- (2) Only allowed to use the specified model according to each task. Otherwise, no points will be awarded.
- (3) The report can only be handed in **Six A4 pages** at most. You should explain all the implications of all the programs you write and post them in the report, and if you compare any different results, please present the changes and their effects in the report, but it is strictly forbidden to post the entire code.
- (4) Upload the compressed file (.zip) of "the report (.pdf), all program files (.ipynb), and all the best weight of model which you wrote." to the e3 platform. The file name is A4_studentID_studentName.zip.
- (5) Sample submission format:

A4_studentID_studentName/

A4_studentID_studentName.pdf

vae.ipynb

gan.ipynb

honus.ipynb

wodel_weight/

VAE weights.pth

Generator weights.pth

Discriminator weights.pth

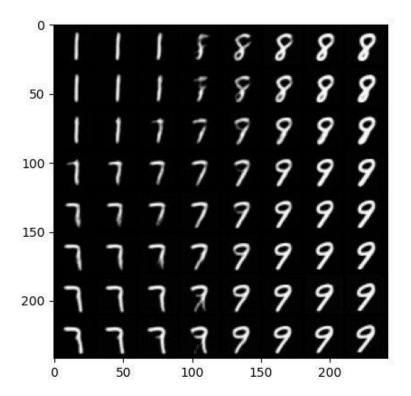
Deadline: 2023/12/5 (Tue.) 05:20

Requirements:

(1) In this assignment, it is divided into the following two tasks:

Task 1: Grayscale image generation by VAE model.

In this task, it is required to implement a Variational Autoencoder (VAE), including different types such as Conditional-VAE, and train the model by MNIST dataset. After training, randomly sample four images and perform latent interpolation on their corresponding latent spaces. Use the decoder to generate 8*8 images from the interpolated latent spaces.



Additional Information:

- 1.Keep the dimension of the latent code relatively small.
- 2.It's normal for the loss to be high.

Task 2: RGB image generation by GAN model.

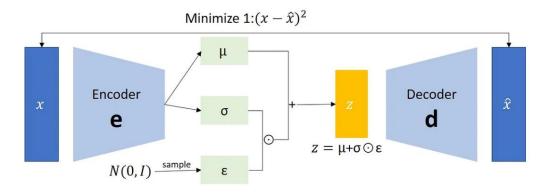
In this task, it is required to implement a **Generative Adversarial Network** (GAN), including different types **except dcGAN**, and train the model by **CIFAR-10** dataset.

- (2) Plot the training loss of VAE and GAN (generator & discriminator) during training. And in each of model you should output a result image with 8x8 generate images or more.
- (3) **Compare performance** changes due to different parameters and model structures **and write them into reports.**
- (4) Set "torch.manual_seed(12)" and "torch.backends.cudnn.deterministic = True" in your code for model's training reproducibility.

Descriptions:

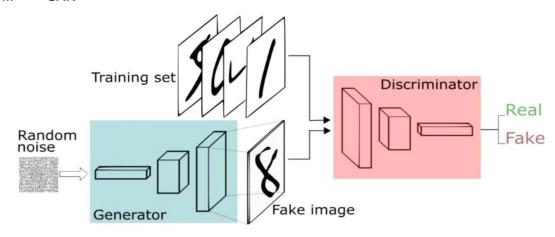
(1) Model Architecture

i. VAE



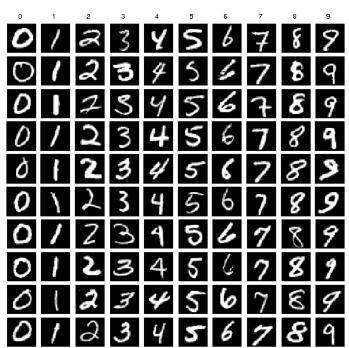
Minimize 2:
$$\frac{1}{2}\sum_{i=1}^{N}(\exp(\sigma_i)-(1+\sigma_i)+{\mu_i}^2)$$

ii. GAN

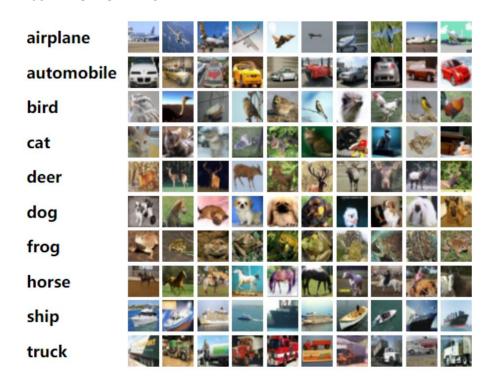


(2) Dataset

i. Task 1 Grayscale: MNIST



ii. Task 2 RGB: CIFAR10



(3) Bonus

- **i.** Attempting to process the raw data of **EMNIST** dataset without using torchvision.datasets and create a custom dataset to extract only digit data.
- **ii.** Training using different generative models, such as other types of VAE, GAN, and diffusion model, or utilizing additional datasets, choose one from the options mentioned above.

Reference:

- (1) GANs: https://github.com/eriklindernoren/PyTorch-GAN/tree/master/implementations
- (2) EMNIST raw data: http://yann.lecun.com/exdb/mnist/ (Do not open it by Chrome.)

Assignment Evaluation:

- (1) Code & model performances (60%)
- (2) Report (40%)
- (3) Bonus (5%+10%)

Please contact TA if you have any questions.

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