```
In []: 'welcome to nit'

In []: !nvidia-smi
    # Give you information about graphic card & this nvidia library for gpu
    # Driver is cuda version:12.0
    # How much memory gpu has 15360mb which is 15 GB & i am using 0 GB

In []: # Lets create function

def process_nit(name):
    when = 'today'
    print(name, 'is using google colab', when)
    process_nit('senapati')
```

how to debugging above code in gpu

- import pdb
- Python Debugger module.PDB is a built-in interactive debugger for Python
- It allows developers to set breakpoints, step through code, inspect variable tasks to help identify and fix issues in their code.
- Refer to chatgpt (I active line number, n next line

```
import pdb # it will act as python debugger mode

def process_nit(name):
    pdb.set_trace()
    when = 'today'
    print(name, 'is using google colab', when)

process_nit('senapati')
```

```
In [ ]:
       import pdb
       def process nit(name):
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         when = 'today'
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       process_nit('senapati')

    LETS WORK ON MULTIMODEL DEEP LEARNING ARCHITECTURE CAL

             WITH VISUAL ELIMIATION WE ARE COMBINE WITH GENERATIVE MOI
             TYPE OF ARCHITECTURE.

    WE WILL ABLE TO TAKE TEXT PROMPT AND GENERATE VISUALIZE IN

             SEQUENCE FROM THE TEXT PROMPT.

    THIS IS THE CUTTING EDGE.

In [ ]: # CLIP ARCHITECTURE
       !git clone https://github.com/openai/CLIP.git
In [ ]:
       # TAMING-TRANSFORMER ARCHITECTURE
       !git clone https://github.com/CompVis/taming-transformers
In [ ]:
       # We Need to install some more libraries as well
       !pip install --no-deps ftfy regex tqdm
       !pip install omegaconf==2.0.0 pytorch-lightning==1.0.8
       !pip uninstall torchtext --yes
       !pip install einops
In [ ]:
       # import IMAGE, NUMPY, PANDAS, MATPLTOLIB libraries
       import PIL
       import numpy as np
       import pandas as pd
       import matplotlib.pyplot as plt
```

```
In []: # import PYTORCH Libraries
    import torch, os, imageio, pdb, math
    import torchvision
    import torchvision.transforms as T
    import torchvision.transforms.functional as TF

In []: import yaml
    from omegaconf import OmegaConf

    from CLIP import clip

    #import warnings
    #warnings.filterwarnings('ignore')
```

```
In [ ]:
       ## helper functions
       def show_from_tensor(tensor):
         img = tensor.clone()
          img = img.mul(255).byte()
          img = img.cpu().numpy().transpose((1,2,0))
         plt.figure(figsize=(10,7))
         plt.axis('off')
         plt.imshow(img)
         plt.show()
       def norm_data(data):
         return (data.clip(-1,1)+1)/2 ### range between 0 and 1 in the result
       ### Parameters
       learning_rate = .5
       batch_size = 1
       wd = .1
       noise_factor = .22
       total_iter=400
       im_shape = [450, 450, 3] # height, width, channel
       size1, size2, channels = im shape
In [ ]: ### CLIP MODEL ###
        clipmodel, _ = clip.load('ViT-B/32', jit=False)
        clipmodel.eval()
       print(clip.available_models())
       print("Clip model visual input resolution: ", clipmodel.visual.input_resoluti
       device=torch.device("cuda:0")
       torch.cuda.empty_cache()
```

```
In [ ]:
       ## Taming transformer instantiation
       %cd taming-transformers/
        !mkdir -p models/vqgan_imagenet_f16_16384/checkpoints
        !mkdir -p models/vqgan_imagenet_f16_16384/configs
       if len(os.listdir('models/vqgan_imagenet_f16_16384/checkpoints/')) == 0:
           !wget 'https://heibox.uni-heidelberg.de/f/867b05fc8c4841768640/?dl=1' -0 '
           !wget 'https://heibox.uni-heidelberg.de/f/274fb24ed38341bfa753/?dl=1' -0 '
       from taming.models.vagan import VOModel
       def load_config(config_path, display=False):
          config_data = OmegaConf.load(config_path)
          if display:
            print(yaml.dump(OmegaConf.to_container(config_data)))
          return config_data
       def load_vqgan(config, chk_path=None):
         model = VQModel(**config.model.params)
         if chk_path is not None:
           state_dict = torch.load(chk_path, map_location="cpu")["state_dict"]
           missing, unexpected = model.load_state_dict(state_dict, strict=False)
         return model.eval()
       def generator(x):
         x = taming_model.post_quant_conv(x)
         x = taming model.decoder(x)
         return x
       taming_config = load_config("./models/vqgan_imagenet_f16_16384/configs/model.
       taming_model = load_vqgan(taming_config, chk_path="./models/vqgan_imagenet_f1
```

```
In []: ### Declare the values that we are going to optimize

class Parameters(torch.nn.Module):
    def __init__(self):
        super(Parameters, self).__init__()
        self.data = .5*torch.randn(batch_size, 256, size1//16, size2//16).cuda()
        self.data = torch.nn.Parameter(torch.sin(self.data))

def forward(self):
    return self.data

def init_params():
    params=Parameters().cuda()
    optimizer = torch.optim.AdamW([{'params':[params.data], 'lr': learning_rate return params, optimizer
```

```
In [ ]:
       ### Encoding prompts and a few more things
       normalize = torchvision.transforms.Normalize((0.48145466, 0.4578275, 0.408210
       def encodeText(text):
         t=clip.tokenize(text).cuda()
         t=clipmodel.encode_text(t).detach().clone()
         return t
       def createEncodings(include, exclude, extras):
         include enc=[]
         for text in include:
           include_enc.append(encodeText(text))
         exclude_enc=encodeText(exclude) if exclude != '' else 0
         extras_enc=encodeText(extras) if extras !='' else 0
         return include enc, exclude enc, extras enc
       augTransform = torch.nn.Sequential(
           torchvision.transforms.RandomHorizontalFlip(),
           torchvision.transforms.RandomAffine(30, (.2, .2), fill=0)
       ).cuda()
       Params, optimizer = init_params()
       with torch.no_grad():
         print(Params().shape)
         img= norm_data(generator(Params()).cpu()) # 1 x 3 x 224 x 400 [225 x 400]
         print("img dimensions: ",img.shape)
         show_from_tensor(img[0])
```

```
In [ ]:
       ### create crops
       def create_crops(img, num_crops=32):
         p=size1//2
         img = torch.nn.functional.pad(img, (p,p,p,p), mode='constant', value=0) # 1
         img = augTransform(img) #RandomHorizontalFlip and RandomAffine
         crop_set = []
         for ch in range(num_crops):
           gap1= int(torch.normal(1.2, .3, ()).clip(.43, 1.9) * size1)
           offsetx = torch.randint(0, int(size1*2-gap1),())
           offsety = torch.randint(0, int(size1*2-gap1),())
           crop=img[:,:,offsetx:offsetx+gap1, offsety:offsety+gap1]
           crop = torch.nn.functional.interpolate(crop,(224,224), mode='bilinear', a
           crop_set.append(crop)
         img_crops=torch.cat(crop_set,0) ## 30 x 3 x 224 x 224
         randnormal = torch.randn_like(img_crops, requires_grad=False)
         num_rands=0
         randstotal=torch.rand((img crops.shape[0],1,1,1)).cuda() #32
         for ns in range(num_rands):
           randstotal*=torch.rand((img crops.shape[0],1,1,1)).cuda()
         img_crops = img_crops + noise_factor*randstotal*randnormal
         return img crops
```

```
In []: ### Show current state of generation

def showme(Params, show_crop):
    with torch.no_grad():
        generated = generator(Params())

if (show_crop):
        print("Augmented cropped example")
        aug_gen = generated.float() # 1 x 3 x 224 x 400
        aug_gen = create_crops(aug_gen, num_crops=1)
        aug_gen_norm = norm_data(aug_gen[0])
        show_from_tensor(aug_gen_norm)

print("Generation")
        latest_gen=norm_data(generated.cpu()) # 1 x 3 x 224 x 400
        show_from_tensor(latest_gen[0])

return (latest_gen[0])
```

```
In [ ]:
       # Optimization process
       def optimize_result(Params, prompt):
         alpha=1 ## the importance of the include encodings
         beta=.5 ## the importance of the exclude encodings
         ## image encoding
         out = generator(Params())
         out = norm data(out)
         out = create crops(out)
         out = normalize(out) # 30 x 3 x 224 x 224
         image_enc=clipmodel.encode_image(out) ## 30 x 512
         ## text encoding w1 and w2
         final_enc = w1*prompt + w1*extras_enc # prompt and extras_enc : 1 x 512
         final_text_include_enc = final_enc / final_enc.norm(dim=-1, keepdim=True) #
         final text exclude enc = exclude enc
         ## calculate the loss
         main_loss = torch.cosine_similarity(final_text_include_enc, image_enc, -1)
         penalize_loss = torch.cosine_similarity(final_text_exclude_enc, image_enc,
         final loss = -alpha*main_loss + beta*penalize_loss
         return final_loss
       def optimize(Params, optimizer, prompt):
         loss = optimize_result(Params, prompt).mean()
         optimizer.zero grad()
         loss.backward()
         optimizer.step()
         return loss
```

```
In [ ]:
       ### training loop
       def training loop(Params, optimizer, show crop=False):
         res_img=[]
         res_z=[]
         for prompt in include_enc:
           iteration=0
           Params, optimizer = init_params() # 1 x 256 x 14 x 25 (225/16, 400/16)
           for it in range(total_iter):
             loss = optimize(Params, optimizer, prompt)
             if iteration>=80 and iteration%show_step == 0:
               new_img = showme(Params, show_crop)
               res_img.append(new_img)
               res z.append(Params()) # 1 x 256 x 14 x 25
                print("loss:", loss.item(), "\niteration:",iteration)
              iteration+=1
           torch.cuda.empty_cache()
         return res_img, res_z
```

```
In []: torch.cuda.empty_cache()
    #include=['sketch of a lady', 'sketch of a man on a horse']
    include=['A painting of a pineapple in a bowl']
    exclude='watermark'
    extras = ""
    w1=1
    w2=1
    noise_factor= .22
    total_iter=110
    show_step=10 # set this to see the result every 10 interations beyond iteration include_enc, exclude_enc, extras_enc = createEncodings(include, exclude, extras_img, res_z=training_loop(Params, optimizer, show_crop=True)
```

```
In [ ]:
       torch.cuda.empty_cache()
        include=['a foresh with blue tree, lion in the forest, A painting of a pineap
        exclude='watermark'
        extras = ""
       w1 = 1
       w2 = 1
       noise_factor= .20
       total_iter=110
        show_step=10 # set this to see the result every 10 interations beyond iterati
       include_enc, exclude_enc, extras_enc = createEncodings(include, exclude, extr
       res img, res z=training loop(Params, optimizer, show crop=True)
In [ ]:
       def interpolate(res z list, duration list):
          gen_img_list=[]
          fps = 25
          for idx, (z, duration) in enumerate(zip(res_z_list, duration_list)):
            num_steps = int(duration*fps)
            z1=z
            z2=res_z_list[(idx+1)%len(res_z_list)] # 1 x 256 x 14 x 25 (225/16, 400/1
            for step in range(num_steps):
              alpha = math.sin(1.5*step/num steps)**6
              z new = alpha * z2 + (1-alpha) * z1
              new gen=norm data(generator(z new).cpu())[0] ## 3 x 224 x 400
              new img=T.ToPILImage(mode='RGB')(new gen)
              gen_img_list.append(new_img)
          return gen img list
       durations=[5,5,5,5,5,5]
        interp_result_img_list = interpolate(res_z, durations)
```

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In []: ## create a video
    out_video_path=f"../video.mp4"
    writer = imageio.get_writer(out_video_path, fps=25)
    for pil_img in interp_result_img_list:
        img = np.array(pil_img, dtype=np.uint8)
        writer.append_data(img)

writer.close()

In []: from IPython.display import HTML
    from base64 import b64encode

mp4 = open('../video.mp4','rb').read()
    data="data:video/mp4;base64,"+b64encode(mp4).decode()
    HTML("""<video width=800 controls><source src="%s" type="video/mp4"></video>"
In []:
```