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In []: import numpy as np
        import torch as torch
        import torch.nn as nn
        import torch.nn.functional as F
        import torch.optim as optim
        import seaborn as sns
        import pandas as pd
        import matplotlib.pyplot as plt
        from datetime import datetime
        import random
        from scipy.stats import norm
        import os
        import pathlib
        from Model import *
        from utils import *
        torch.autograd.set_detect_anomaly(True)
        start time=datetime.now().strftime('%B %d - %H:%M:%S')
In [ ]: #Global parameters
        GlobalParams1=Params(param_type='k1',target_type='indicator',trick='clamp',loss_type='MSELoss',delta=0.01,K=0.9,lr=0.01)
        dB1 = SampleBMIncr(GlobalParams=GlobalParams1)
        init x1 = Sample Init(GlobalParams=GlobalParams1)
        init c1= torch.zeros like(init x1)
        GlobalParams2=Params(param_type='k2',target_type='indicator',trick='clamp',loss_type='MSELoss',delta=0.01,K=0.9,lr=0.01)
        dB2 = SampleBMIncr(GlobalParams=GlobalParams2) ## TODO: same dB?????
        init x2 = Sample Init(GlobalParams=GlobalParams2)
        init_c2= torch.zeros_like(init_x2)
        NT1=GlobalParams1.NT1
        NT2=GlobalParams1.NT2
        dt=GlobalParams1.dt
        device=GlobalParams1.device
        learning_rate = GlobalParams1.lr
        #Forward Loss
        forward losses = []
        #How many batches
        MaxBatch= 300
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#How many optimization steps per batch
OptimSteps= 25
#Train on a single batch?
single batch = True
#Set up main models for v0 and z (z will be list of models)
v0 model main1 = Network(minmax=True)
u0 model main1 = Network(minmax=True)
v0 model main1 = Network(minmax=True)
zv models main1 = [Network(minmax=False) for i in range(NT1)]
zu models main1 = [Network(minmax=False) for i in range(NT1)]
zv models main1 = [Network(minmax=False) for i in range(NT2)]
main models1=Main Models(GlobalParams=GlobalParams1)
main models1.create(v0 model=v0 model main1,
                    u0_model=u0_model_main1,
                    v0 model=v0 model main1,
                    zv models=zv models main1,
                    zu models=zu models main1,
                    zy models=zy models main1,
                    forward loss=forward losses,
                    dB=dB1,
                    init_x=init_x1,
                    init c=init c1)
v0 model main2 = Network(minmax=True)
u0 model main2 = Network(minmax=True)
v0 model main2 = Network(minmax=True)
zv models main2 = [Network(minmax=False) for i in range(NT1)]
zu models main2 = [Network(minmax=False) for i in range(NT1)]
zy_models_main2 = [Network(minmax=False) for i in range(NT2)]
main models2=Main Models(GlobalParams=GlobalParams2)
main_models2.create(v0_model=v0_model_main2,
                    u0_model=u0_model_main2,
                    y0_model=y0_model_main2,
                    zv models=zv models main2,
                    zu_models=zu_models_main2,
                    zy_models=zy_models_main2,
                    forward loss=forward losses,
                    dB=dB2
                    init_x=init_x2,
                    init_c=init_c2)
pop1_dict={'dB':dB1,
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'init x':init x1 ,
                   'init c':init_c1 ,
                   'GlobalParams':GlobalParams1,
                   'main models':main models1}
        pop2 dict={'dB':dB2,
                   'init x':init x2,
                   'init c':init c2 .
                   'GlobalParams':GlobalParams2,
                   'main_models':main_models2}
In [ ]: #Define optimization parameters
        params=[]
        params = list(main models1.v0 model.parameters())+\
                 list(main_models1.u0_model.parameters())+\
                 list(main_models1.y0_model.parameters())+\
                 list(main models2.v0 model.parameters())+\
                 list(main models2.u0 model.parameters())+\
                 list(main models2.v0 model.parameters())
        for i in range(NT1):
            params += list(main models1.zv models[i].parameters())
            params += list(main_models1.zu_models[i].parameters())
            params += list(main models2.zv models[i].parameters())
            params += list(main models2.zu models[i].parameters())
        for i in range(NT2):
            params += list(main models1.zv models[i].parameters())
            params += list(main_models2.zy_models[i].parameters())
        #Set up optimizer and scheduler
        optimizer = optim.Adamax(params, lr=learning rate)
        scheduler = torch.optim.lr scheduler.StepLR(optimizer, step size=100, gamma=0.95)
        for k in range(0,MaxBatch):
            print("Batch Number: ", k+1)
            sloss=0
            #optimize main network wrt the foward loss
            for l in range(0,0ptimSteps):
                optimizer.zero grad()
                loss = get_foward_loss(pop1_dict=pop1_dict, pop2_dict=pop2_dict)
                loss.backward()
                # torch.nn.utils.clip_grad_norm_(parameters=params,max_norm=0.7)
                optimizer.step()
                scheduler.step()
                nloss = loss.detach().numpy()
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sloss += nloss
   # print('OptimStep: '+ str(l+1))
   # print('forward loss: ' + str(nloss))
avgloss = sloss/OptimSteps
print("Average Error Est: ", avgloss)
forward losses.append(avgloss)
#Generate a new batch if using multiple batches
if(not single batch):
   dB1 = SampleBMIncr(GlobalParams=GlobalParams1)
   init_x1 = Sample_Init(GlobalParams=GlobalParams1)
   init_c1= torch.zeros_like(init_x1)
   pop1_dict={'dB':dB1,
            'init_x':init_x1 ,
            'init_c':init_c1 ,
            'GlobalParams':GlobalParams1,
            'main models':main models1}
   dB2 = SampleBMIncr(GlobalParams=GlobalParams2) ## TODO: same dB?????
   init_x2 = Sample_Init(GlobalParams=GlobalParams2)
   init_c2= torch.zeros_like(init_x2)
   pop2_dict={'dB':dB2,
            'init_x':init_x2 ,
            'init_c':init_c2 ,
            'GlobalParams':GlobalParams2,
            'main_models':main_models2}
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