

```
import albumentations as A
import gc
import matplotlib.pyplot as plt
import math
import multiprocessing
import numpy as np
import os
import pandas as pd
import random
import time
import timm
import torch
import torch.nn as nn
from pathlib import Path
from albumentations.pytorch import ToTensorV2
from glob import glob
from torch.utils.data import DataLoader, Dataset
from tqdm import tqdm
from typing import Dict, List
from sklearn.model_selection import KFold, GroupKFold
from skimage.transform import resize
from torch.optim.lr_scheduler import OneCycleLR
import torch.nn.functional as F
import logging
import functools
import pywt
os.environ["CUDA_VISIBLE_DEVICES"] = "0,1"
device = torch.device("cuda:0" if torch.cuda.is_available() else "cpu")
print('Using', torch.cuda.device_count(), 'GPU(s)')
class config:
   AMP = True
   BATCH_SIZE_TRAIN = 8
```

```
BATCH_SIZE_VALID = 8
    EPOCHS = 16
    FOLDS = 4
    FREEZE = False
    GRADIENT_ACCUMULATION_STEPS = 1
   MAX_GRAD_NORM = 1e7
   MODEL = "tf_efficientnet_b0"
   NUM_FROZEN_LAYERS = 39
   NUM_WORKERS = 0 # multiprocessing.cpu_count()
    PRINT_FREQ = 20
    SEED = 20
   TRAIN_FULL_DATA = False
    VISUALIZE = False
   WEIGHT_DECAY = 0.01
class paths:
    OUTPUT_DIR = Path("./kaggle/working/")
   TRAIN_CSV = "./balanced_train.csv"
     TRAIN_CSV = "/kaggle/input/hms-harmful-brain-activity-classification/train.csv"
   TRAIN_EEGS = "./kaggle/input/hms-harmful-brain-activity-classification/train_eegs"
    TRAIN_SPECTROGRAMS = "./kaggle/input/hms-harmful-brain-activity-classification/train_
    R00T = Path.cwd()
    INPUT = ROOT / "input"
    DATA = Path("./original_data")
    PRE_LOADED_EEGS = './kaggle/working/brain-eeg/eeg_specs.npy'
    PRE_LOADED_SPECTROGRAMS = './kaggle/working/brain-spectrograms/specs.npy'
    PRE_LOADED_Wavelets = './kaggle/working/brain-wavelets/specs.npy'
log_filename = paths.ROOT/'new_version_training_record.log'
logging.basicConfig(filename=log_filename, level=logging.INFO,
                    format='%(asctime)s %(levelname)s %(message)s', datefmt='%Y-%m-%d %H:
def log_time(func):
    """warpper for logging running time"""
   @functools.wraps(func)
```

```
def wrapper(*args, **kwargs):
        start time = time.time()
        result = func(*args, **kwargs)
        end_time = time.time()
        logging.info(f"{func.__name__}} took {end_time - start_time:.4f} seconds.")
        print(f"{func.__name__} took {end_time - start_time:.4f} seconds.")
        return result
    return wrapper
class AverageMeter(object):
    """Computes and stores the average and current value"""
    def __init__(self):
        self_reset()
    def reset(self):
        self.val = 0
        self_avg = 0
        self.sum = 0
        self.count = 0
    def update(self, val, n=1):
        self.val = val
        self.sum += val * n
        self.count += n
        self.avg = self.sum / self.count
def asMinutes(s: float):
    "Convert to minutes."
   m = math.floor(s / 60)
    s -= m * 60
    return '%dm %ds' % (m, s)
def timeSince(since: float, percent: float):
    now = time.time()
    s = now - since
```

```
es = s / (percent)
    rs = es - s
    return '%s (remain %s)' % (asMinutes(s), asMinutes(rs))
def plot spectrogram(spectrogram path: str):
    Source: https://www.kaggle.com/code/mvvppp/hms-eda-and-domain-journey
    Visualize spectogram recordings from a parquet file.
    :param spectrogram_path: path to the spectogram parquet.
    sample_spect = pd.read_parquet(spectrogram_path)
    split_spect = {
        "LL": sample_spect.filter(regex='^LL', axis=1),
        "RL": sample_spect.filter(regex='^RL', axis=1),
        "RP": sample_spect.filter(regex='^RP', axis=1),
        "LP": sample_spect.filter(regex='^LP', axis=1),
    }
    fig, axes = plt.subplots(nrows=2, ncols=2, figsize=(15, 12))
    axes = axes.flatten()
    label_interval = 5
    for i, split_name in enumerate(split_spect.keys()):
        ax = axes[i]
        img = ax.imshow(np.log(split_spect[split_name]).T, cmap='viridis', aspect='auto',
        cbar = fig.colorbar(img, ax=ax)
        cbar.set_label('Log(Value)')
        ax.set_title(split_name)
        ax.set_ylabel("Frequency (Hz)")
        ax.set_xlabel("Time")
        ax.set_yticks(np.arange(len(split_spect[split_name].columns)))
        ax.set_yticklabels([column_name[3:] for column_name in split_spect[split_name].co
        frequencies = [column_name[3:] for column_name in split_spect[split_name].columns
        ax.set_yticks(np.arange(0, len(split_spect[split_name].columns), label_interval))
        ax.set_yticklabels(frequencies[::label_interval])
    plt.tight_layout()
```

```
plt.show()
@log_time
def seed_everything(seed: int):
    random_seed(seed)
    np.random.seed(seed)
    torch.manual_seed(seed)
    os.environ['PYTHONHASHSEED'] = str(seed)
def sep():
    print("-"*100)
class CustomDataset(Dataset):
    def __init__(
        self, df: pd.DataFrame, config,
        augment: bool = False, mode: str = 'train',
        specs: Dict[int, np.ndarray] = None,
        eeg_specs: Dict[int, np.ndarray] = None,
        wavelets_spectrograms: Dict[int, np.ndarray] = None
    ):
        self.df = df
        self.config = config
        self.batch_size = self.config.BATCH_SIZE_TRAIN
        self.augment = augment
        self.mode = mode
        self.spectrograms = specs if specs is not None else {}
        self.eeg_spectrograms = eeg_specs if eeg_specs is not None else {}
        self.wavelets_spectrograms = wavelets_spectrograms if wavelets_spectrograms is no
    def __len__(self):
        Denotes the number of batches per epoch.
        return len(self.df)
    def __getitem__(self, index):
```

```
Generate one batch of data.
    X, y = self.__data_generation(index)
    if self.augment:
        X = self.__transform(X)
    return torch.tensor(X, dtype=torch.float32), torch.tensor(y, dtype=torch.float32)
def log_and_Standarize(self,img):
    # Log transform spectogram
        img = np.clip(img, np.exp(-4), np.exp(8))
        img = np.log(img)
        # Standarize per image
        ep = 1e-6
        mu = np.nanmean(img.flatten())
        std = np.nanstd(img.flatten())
        img = (img - mu) / (std + ep)
        img = np.nan_to_num(img, nan=0.0)
        return img
def __data_generation(self, index):
    Generates data containing batch_size samples.
    X = np.zeros((128, 256, 12), dtype='float32')
    y = np.zeros(6, dtype='float32')
    img = np.ones((128,256), dtype='float32')
    row = self.df.iloc[index]
    if self.mode=='test':
        r = 0
    else:
        r = int((row['min'] + row['max']) // 4)
    for region in range(4):
        img = self.spectrograms[row.spectrogram_id][r:r+300, region*100:(region+1)*10
        img = self.log_and_Standarize(img)
        X[14:-14, :, region] = img[:, 22:-22] / 2.0
    img = self.eeg_spectrograms[row.eeg_id]
```

```
img = img.to_numpy()
        img = self.log_and_Standarize(img)
        img = resize(img, (128, 256, 4))
        X[:, :, 4:8] = img
        # Combine wavelet features
        img = self.wavelets_spectrograms[row.spectrogram_id]
        img = self.log_and_Standarize(img)
        img = resize(img, (128, 256, 4))
        X[:, :, 8:12] = img
        if self.mode != 'test':
            y = row[label_cols].values.astype(np.float32)
        return X, y
    def __transform(self, img):
        transforms = A.Compose([
            A. HorizontalFlip(p=0.5),
        ])
        return transforms(image=img)['image']
class CustomModel(nn.Module):
    def __init__(self, config, num_classes: int = 6, pretrained: bool = True):
        super(CustomModel, self).__init__()
        self.USE_KAGGLE_SPECTROGRAMS = True
        self.USE_EEG_SPECTROGRAMS = False
        self.USE_WAVELET_SPECTROGRAMS = False
        self.model = timm.create_model(
            config.MODEL,
            pretrained=pretrained,
            drop_rate = 0.1,
            drop_path_rate = 0.2,
        # add code on logging parameter
        logging.info("config.MODEL: {}".format(config.MODEL))
        logging.info("USE_KAGGLE_SPECTROGRAMS: {}".format(self.USE_KAGGLE_SPECTROGRAMS))
```

```
logging.info("USE_EEG_SPECTROGRAMS: {}".format(self.USE_EEG_SPECTROGRAMS))
    logging.info("USE WAVELET SPECTROGRAMS: {}".format(self.USE WAVELET SPECTROGRAMS)
    if config.FREEZE:
        for i,(name, param) in enumerate(list(self.model.named_parameters())\
                                          [0:config.NUM_FROZEN_LAYERS]):
            param.requires grad = False
    self.features = nn.Sequential(*list(self.model.children())[:-2])
    self.custom_layers = nn.Sequential(
        nn.AdaptiveAvgPool2d(1),
        nn.Flatten(),
        nn.Linear(self.model.num_features, num_classes)
    )
def __reshape_input(self, x):
    Reshapes input torch.Size([8, 128, 256, 12]) -> [8, 3, 512, 768] monotone image.
    components = []
    if self.USE_KAGGLE_SPECTROGRAMS:
        spectograms = [x[:, :, :, i:i+1]] for i in range(4)]
        components.append(torch.cat(spectograms, dim=1))
    if self.USE_EEG_SPECTROGRAMS:
        eegs = [x[:, :, :, i:i+1]] for i in range(4,8)]
        eegs = torch.cat(eegs, dim=1)
        components.append(eegs)
    if self.USE_WAVELET_SPECTROGRAMS:
        wavelets = [x[:, :, :, i:i+1]] for i in range(8,12)]
        wavelets = torch.cat(wavelets, dim=1)
        components.append(wavelets)
    if components:
        x = torch.cat(components, dim=2)
    x = torch.cat([x, x, x], dim=3)
    x = x.permute(0, 3, 1, 2)
    return x
```

```
def forward(self, x):
        x = self.__reshape_input(x)
        x = self_features(x)
        x = self_custom layers(x)
        return x
@log_time
def train_epoch(train_loader, model, criterion, optimizer, epoch, scheduler, device):
    """One epoch training pass."""
    model.train()
    criterion = nn.KLDivLoss(reduction="batchmean")
    scaler = torch.cuda.amp.GradScaler(enabled=config.AMP)
    losses = AverageMeter()
    start = end = time.time()
    global_step = 0
    # ====== ITERATE OVER TRAIN BATCHES ========
    with tqdm(train_loader, unit="train_batch", desc='Train') as tqdm_train_loader:
        for step, (X, y) in enumerate(tqdm_train_loader):
            X = X_{\bullet} to(device)
            y = y.to(device)
            batch_size = y.size(0)
            with torch.cuda.amp.autocast(enabled=config.AMP):
                y_preds = model(X)
                loss = criterion(F.log_softmax(y_preds, dim=1), y)
            if config.GRADIENT_ACCUMULATION_STEPS > 1:
                loss = loss / config.GRADIENT_ACCUMULATION_STEPS
            losses.update(loss.item(), batch_size)
            scaler.scale(loss).backward()
            grad_norm = torch.nn.utils.clip_grad_norm_(model.parameters(), config.MAX_GRA
            if (step + 1) % config.GRADIENT_ACCUMULATION_STEPS == 0:
                scaler.step(optimizer)
                scaler.update()
                optimizer.zero_grad()
                global_step += 1
                scheduler.step()
```

```
end = time.time()
            # ====== LOG INFO =======
            if step % config.PRINT_FREQ == 0 or step == (len(train_loader)-1):
                print('Epoch: [{0}][{1}/{2}] '
                      'Elapsed {remain:s} '
                      'Loss: {loss.avg:.4f} '
                      'Grad: {grad_norm:.4f} '
                      'LR: {lr:.8f}
                      .format(epoch+1, step, len(train_loader),
                              remain=timeSince(start, float(step+1)/len(train_loader)),
                              loss=losses,
                              grad_norm=grad_norm,
                              lr=scheduler.get_last_lr()[0]))
    return losses.avg
@log_time
def valid_epoch(valid_loader, model, criterion, device):
    model_eval()
    softmax = nn.Softmax(dim=1)
    losses = AverageMeter()
    prediction_dict = {}
    preds = []
    start = end = time.time()
   with tqdm(valid_loader, unit="valid_batch", desc='Validation') as tqdm_valid_loader:
        for step, (X, y) in enumerate(tqdm_valid_loader):
            X = X_* to(device)
            y = y.to(device)
            batch_size = y.size(0)
            with torch.no_grad():
                y_preds = model(X)
                loss = criterion(F.log_softmax(y_preds, dim=1), y)
            if config.GRADIENT_ACCUMULATION_STEPS > 1:
                loss = loss / config.GRADIENT_ACCUMULATION_STEPS
            losses.update(loss.item(), batch_size)
            y_preds = softmax(y_preds)
            preds.append(y_preds.to('cpu').numpy())
            end = time.time()
```

```
# ====== LOG INFO =======
            if step % config.PRINT_FREQ == 0 or step == (len(valid_loader)-1):
                print('EVAL: [{0}/{1}] '
                      'Elapsed {remain:s} '
                      'Loss: {loss.avg:.4f} '
                      .format(step, len(valid_loader),
                              remain=timeSince(start, float(step+1)/len(valid_loader)),
                              loss=losses))
    prediction_dict["predictions"] = np.concatenate(preds)
    return losses.avg, prediction_dict
@log_time
def train_loop(df, fold,stage = 2):
    # ====== SPLIT =======
    train_folds = df[df['fold'] != fold].reset_index(drop=True)
    valid_folds = df[df['fold'] == fold].reset_index(drop=True)
    # ----- votes sum-----
    if stage == 1:
        # all data
        print("Training Stage 1: Using all data")
    elif stage == 2:
        # KL Loss < 9 data
        print("Training Stage 2: Filtering data based on KL Loss < 7.5")</pre>
        train_folds = train_folds[train_folds['kl_loss'] < 7.5]</pre>
    # ====== DATASETS =======
    train_dataset = CustomDataset(train_folds, config, mode="train", augment=True, specs=
    valid_dataset = CustomDataset(valid_folds, config, mode="train", augment=False, specs
    # ====== DATALOADERS =======
    train_loader = DataLoader(train_dataset,
                              batch_size=config.BATCH_SIZE_TRAIN,
                              shuffle=True,
                              num_workers=config.NUM_WORKERS, pin_memory=True, drop_last=
    valid_loader = DataLoader(valid_dataset,
```

```
batch_size=config.BATCH_SIZE_VALID,
                          shuffle=False,
                          num_workers=config.NUM_WORKERS, pin_memory=True, drop_last=
# ====== MODEL =======
model = CustomModel(config)
model.to(device)
if stage == 2:
    model_path = paths.OUTPUT_DIR / f"{config.MODEL.replace('/', '_')}_fold_{fold}_st
    model.load_state_dict(torch.load(model_path)["model"])
    model.to(device)
optimizer = torch.optim.AdamW(model.parameters(), lr=0.1, weight_decay=config.WEIGHT_
scheduler = OneCycleLR(
    optimizer,
    max_lr=1e-4,
    epochs=config.EPOCHS,
    steps_per_epoch=len(train_loader),
    pct_start=0.1,
    anneal_strategy="cos",
    final_div_factor=100,
)
# ====== LOSS =======
criterion = nn.KLDivLoss(reduction="batchmean")
best_loss = np.inf
early_stop_threshold = 4
improvement_count= 0
# ===== ITERATE EPOCHS ======
for epoch in range(config.EPOCHS):
    start_time = time.time()
    # ====== TRAIN =======
    avg_train_loss = train_epoch(train_loader, model, criterion, optimizer, epoch, sci
    # ====== EVALUATION =======
    avg_val_loss, prediction_dict = valid_epoch(valid_loader, model, criterion, device
    predictions = prediction_dict["predictions"]
```

```
# ====== SCORING =======
        elapsed = time.time() - start_time
        print(f'Epoch {epoch+1} - avg_train_loss: {avg_train_loss:.4f} avg_val_loss: {avg_train_loss:.4f}
        if avg_val_loss < best_loss:</pre>
            best_loss = avg_val_loss
            logging.info(f'Epoch {epoch+1} - Save Best Loss: {best_loss:.4f} Model')
            model_save_path = paths.OUTPUT_DIR / f"{config.MODEL.replace('/', '_')}_fold_
            torch.save({'model': model.state_dict(), 'predictions': predictions}, model_se
        else:
            improvement_count += 1
            if improvement_count >= early_stop_threshold:
                print(f"Early stopping triggered at {epoch} epochs without improvement.")
                break # early stop
    ## TypeError: unsupported operand type(s) for +: 'WindowsPath' and 'str'
    # predictions = torch.load(paths.OUTPUT_DIR + f"/{config.MODEL.replace('/', '_')}_fole
                               map_location=torch.device('cpu'))['predictions']
    paths.OUTPUT_DIR.mkdir(parents=True, exist_ok=True)
    predictions = torch.load(model_save_path,
                         map_location=torch.device('cpu'))['predictions']
    valid_folds[target_preds] = predictions
    torch.cuda.empty_cache()
    gc.collect()
    return valid_folds
@log_time
def train_loop_full_data(df):
    train_dataset = CustomDataset(df, config, mode="train", augment=True, specs=all_spectre
    train_loader = DataLoader(train_dataset,
                              batch_size=config.BATCH_SIZE_TRAIN,
                               shuffle=False,
                              num_workers=config.NUM_WORKERS, pin_memory=True, drop_last=
    model = CustomModel(config)
```

```
model.to(device)
    optimizer = torch.optim.AdamW(model.parameters(), lr=0.1, weight_decay=config.WEIGHT_
    scheduler = OneCycleLR(
        optimizer,
        max_lr=1e-3,
        epochs=config.EPOCHS,
        steps_per_epoch=len(train_loader),
        pct_start=0.1,
        anneal_strategy="cos",
        final_div_factor=100,
    criterion = nn.KLDivLoss(reduction="batchmean")
    best_loss = np.inf
    for epoch in range(config.EPOCHS):
        start_time = time.time()
        avg_train_loss = train_epoch(train_loader, model, criterion, optimizer, epoch, sc
        elapsed = time.time() - start_time
        logging.info(f'Epoch {epoch+1} - avg_train_loss: {avg_train_loss:.4f} time: {ela
        torch.save(
            {'model': model.state_dict()},
            paths.OUTPUT_DIR + f"/{config.MODEL.replace('/', '_')}_epoch_{epoch}.pth")
    torch.cuda.empty_cache()
    gc.collect()
    return
@log_time
def get_result(oof_df):
    kl_loss = nn.KLDivLoss(reduction="batchmean")
    labels = torch.tensor(oof_df[label_cols].values)
    preds = torch.tensor(oof_df[target_preds].values)
    preds = F.log_softmax(preds, dim=1)
    result = kl_loss(preds, labels)
    return result
@log_time
def preparing_data(df):
    train_df = df.groupby('eeg_id')[['spectrogram_id','spectrogram_label_offset_seconds']
        'spectrogram_id':'first',
        'spectrogram_label_offset_seconds':'min'
```

```
})
    train df.columns = ['spectrogram id', 'min']
    aux = df.groupby('eeg_id')[['spectrogram_id','spectrogram_label_offset_seconds']].agg
        'spectrogram_label_offset_seconds':'max'
    })
    train df['max'] = aux
    aux = df.groupby('eeg_id')[['patient_id']].agg('first')
    train_df['patient_id'] = aux
    aux = df.groupby('eeg_id')[label_cols].agg('sum')
    for label in label_cols:
        train_df[label] = aux[label].values
     train_df['total_votes'] = train_df[label_cols].sum(axis=1)
    kl = compute_kl_divergence(train_df, label_cols)
    train_df['kl_loss'] = kl
   y_data = train_df[label_cols].values
    y_data = y_data / y_data.sum(axis=1,keepdims=True)
    train_df[label_cols] = y_data
    aux = df.groupby('eeg_id')[['expert_consensus']].agg('first')
    train_df['target'] = aux
    train_df = train_df.reset_index()
    return train_df
def compute_wavelet_features(signal, wavelet='db4', level=5):
    coeffs = pywt.wavedec(signal, wavelet, level=level)
        # Extract features from wavelet coefficients instead of using wavelet coefficient
    features = []
    for coeff in coeffs:
        features.extend([np.mean(coeff), np.std(coeff)])
    return np.array(features)
@log_time
```

```
def loading_parquet(train_df, config = config, READ_SPEC_FILES = True, READ_EEG_SPEC_FILES
    paths_spectrograms = glob(paths.TRAIN_SPECTROGRAMS + "*.parquet")
    # paths_spectrograms = glob(str(paths.TRAIN_SPECTROGRAMS / "*.parquet"))
    print(f'There are {len(paths_spectrograms)} spectrogram parquets in total path')
    if READ_SPEC_FILES:
        all_spectrograms = {}
        all_wavelet_spectrograms = {}
        spectogram_ids = train_df['spectrogram_id'].unique()
        print(f'There are {len(spectogram_ids)} spectrogram parquets in this training pro-
        for spec_id in tqdm(spectogram_ids):
        # for file_path in tqdm(paths_spectograms):
            file_path = f"{paths.TRAIN_SPECTROGRAMS}/{spec_id}.parquet"
            aux = pd.read_parquet(file_path)
            spec_arr = aux.fillna(0).values[:, 1:].T.astype("float32") # (Hz, Time) = (4)
            wavelet_features = np.array([compute_wavelet_features(row, wavelet=wavelet) features
            name = int(file_path.split("/")[-1].split('.')[0])
            # all_spectrograms[name] = aux.iloc[:,1:].values
            all_spectrograms[name] = aux.fillna(0).iloc[:,1:].values.astype("float32")
            all_wavelet_spectrograms[name] = wavelet_features
            del aux
            del wavelet_features
        os.makedirs(os.path.dirname(paths.PRE_LOADED_SPECTROGRAMS), exist_ok=True)
        os.makedirs(os.path.dirname(paths.PRE_LOADED_Wavelets), exist_ok=True)
        np.save(paths.PRE_LOADED_SPECTROGRAMS, all_spectrograms, allow_pickle=True)
        np.save(paths.PRE_LOADED_Wavelets, all_wavelet_spectrograms, allow_pickle=True)
    else:
        all_spectrograms = np.load(paths.PRE_LOADED_SPECTROGRAMS, allow_pickle=True).item
        all_wavelet_spectrograms = np.load(paths.PRE_LOADED_Wavelets, allow_pickle=True).
    if config.VISUALIZE:
        idx = np.random.randint(0,len(paths_spectrograms))
        spectrogram_path = paths_spectrograms[idx]
        plot_spectrogram(spectrogram_path)
    # Read EEG Spectrograms
   paths_eegs = glob(paths.TRAIN_EEGS + "*.parquet")
      paths_eegs = glob(str(paths.TRAIN_EEGS / "*.parquet"))
    print(f'There are {len(paths_eegs)} EEG spectrograms in total path')
```

```
if READ_EEG_SPEC_FILES:
        all eegs = \{\}
        eeg_ids = train_df['eeg_id'].unique()
        print(f'There are {len(eeg_ids)} EEG spectrograms in this training path')
        for eeg_id in tqdm(eeg_ids):
            file_path = f"{paths.TRAIN_EEGS}/{eeg_id}.parquet"
            eeg_spectogram = pd.read_parquet(file_path)
            all_eegs[eeg_id] = eeg_spectogram
            del eeg_spectogram
        os.makedirs(os.path.dirname(paths.PRE_LOADED_EEGS), exist_ok=True)
        np.save(paths.PRE_LOADED_EEGS, all_eegs, allow_pickle=True)
    else:
        all_eegs = np.load(paths.PRE_LOADED_EEGS, allow_pickle=True).item()
    return all_spectrograms,all_eegs,all_wavelet_spectrograms
def plot_total_votes_vs_kl_divergence(dataframe):
    plt.figure(figsize=(10, 6))
    plt.scatter(dataframe['total_votes'], dataframe['kl_divergence'], alpha=0.6, edgecolo
    plt.title('Scatter Plot of Total Votes vs. KL Divergence')
    plt.xlabel('Total Votes')
    plt.ylabel('KL Divergence')
    plt.grid(True)
   plt.savefig("filenamez", format='png', dpi=300)
      plt.show()
def compute_kl_divergence(data, label_cols):
    labels = data[label_cols].values + 1e-5
    labels /= labels.sum(axis=1, keepdims=True)
    kl_div = torch.nn.functional.kl_div(
        torch.log(torch.tensor(labels, dtype=torch.float)),
        torch.tensor([[1/6] * 6], dtype=torch.float),
        reduction='none'
    ).sum(dim=1).numpy()
```

```
return kl_div
if __name__ == "__main__":
    overall_start_time = time.time()
    print(f"Log file path: {log_filename.absolute()}")
    logging.info('-----
    logging.info(f'training on local balanced data')
    logging.info(f'Into loading stage')
    target_preds = [x + "_pred" for x in ['seizure_vote', 'lpd_vote', 'gpd_vote', 'lrda_vote']
    label_to_num = {'Seizure': 0, 'LPD': 1, 'GPD': 2, 'LRDA': 3, 'GRDA': 4, 'Other':5}
    num_to_label = {v: k for k, v in label_to_num.items()}
    seed_everything(config.SEED)
    df = pd.read_csv(paths.TRAIN_CSV)
    label_cols = df.columns[-6:]
    print(f"Train cataframe shape is: {df.shape}")
    print(f"Labels: {list(label_cols)}")
    print(df.head())
     plot_total_votes_vs_kl_divergence(df)
     print(sss)
    #处理train_df,eeg_id,只保留第一个spectrogram_id,min及max spec offset,第一个patient_id等
    train_df = preparing_data(df)
    print('Train non-overlapp eeg_id shape:', train_df.shape )
   print(train_df.head())
    train_df.to_csv('./local_train_df.csv', index=False)
    logging.info(f'Into loading stage: combine wavelet feature into X')
    logging.info(f'Into loading stage: loading single npy from local file')
    all_spectrograms,all_eegs,all_wavelet_spectrograms = loading_parquet(train_df, config
    # Validation
    gkf = GroupKFold(n_splits=config.FOLDS)
    for fold, (train_index, valid_index) in enumerate(gkf.split(train_df, train_df.target
       train df.loc[valid index, "fold"] = int(fold)
    print(train_df.groupby('fold').size()), sep()
```

```
print(train_df.head())
train_dataset = CustomDataset(train_df, config, mode="train",
                               specs=all_spectrograms, eeg_specs=all_eegs,wavelets_spe
train loader = DataLoader(
    train_dataset,
    batch_size=config.BATCH_SIZE_TRAIN,
    shuffle=False,
    num_workers=config.NUM_WORKERS, pin_memory=True, drop_last=True
X, y = train_dataset[0]
print(f"X shape: {X.shape}")
print(f"y shape: {y.shape}")
if config.VISUALIZE:
    ROWS = 2
    COLS = 3
    for (X, y) in train_loader:
        plt.figure(figsize=(20,8))
        for row in range(ROWS):
            for col in range(COLS):
                plt.subplot(ROWS, COLS, row*COLS + col+1)
                t = y[row*COLS + col]
                img = X[row*COLS + col, :, :, 0]
                mn = img.flatten().min()
                mx = img.flatten().max()
                img = (img-mn)/(mx-mn)
                plt.imshow(img)
                tars = f'[\{t[0]:0.2f\}']
                for s in t[1:]:
                    tars += f', \{s:0.2f\}'
                eeg = train_df.eeg_id.values[row*config.BATCH_SIZE_TRAIN + row*COLS +
                plt.title(f'EEG = {eeg}\nTarget = {tars}',size=12)
                plt.yticks([])
                plt.ylabel('Frequencies (Hz)',size=14)
                plt.xlabel('Time (sec)',size=16)
        plt.show()
        break
```

```
# #dynamic learning rate
      EPOCHS = config.EPOCHS
#
      BATCHES = len(train_loader)
#
      steps = []
#
      lrs = []
#
      optim_lrs = []
#
      model = CustomModel(config)
#
      optimizer = torch.optim.AdamW(model.parameters(), lr=1e-4)
#
      scheduler = OneCycleLR(
#
          optimizer,
#
#
          max_lr=1e-3,
#
          epochs=config.EPOCHS,
          steps_per_epoch=len(train_loader),
          pct_start=0.05,
#
#
          anneal_strategy="cos",
          final_div_factor=100,
#
      )
      for epoch in range(EPOCHS):
#
          for batch in range(BATCHES):
              scheduler.step()
#
              lrs.append(scheduler.get_last_lr()[0])
              steps.append(epoch * BATCHES + batch)
      \max lr = \max(lrs)
     min lr = min(lrs)
#
      print(f"Maximum LR: {max_lr} | Minimum LR: {min_lr}")
#
    # plt.figure()
    # plt.plot(steps, lrs, label='OneCycle')
    # plt.ticklabel_format(axis='y', style='sci', scilimits=(0,0))
    # plt.xlabel("Step")
    # plt.ylabel("Learning Rate")
    # plt.show()
    if not config.TRAIN_FULL_DATA:
        oof_df = pd.DataFrame()
        for fold in range(config.FOLDS):
            for stage in [1, 2]:
                print(f"Starting Stage {stage} Training for Fold {fold}")
                _oof_df = train_loop(train_df, fold, stage=stage)
```

```
Using 0 GPU(s)
Log file path: /Users/Evelyn/UOS2/tp/new_version_training_record.log
seed everything took 0.0082 seconds.
Train cataframe shape is: (300, 15)
Labels: ['seizure_vote', 'lpd_vote', 'gpd_vote', 'lrda_vote', 'grda_vote', '
               eeg sub id eeg label offset seconds
                                                        spectrogram id
   1940666997
                         9
                                                 60.0
                                                             596909244
                         1
                                                  4.0
1
   2620674843
                                                             800599706
                         1
                                                   2.0
   2166673542
                                                             928825124
3
   839616512
                        19
                                                 60.0
                                                              81278784
4
   761869179
                         7
                                                 60.0
                                                            1247953913
   spectrogram sub id
                        spectrogram_label_offset_seconds
                                                              label_id
0
                                                             917008523
                                                      60.0
1
                     1
                                                       4.0
                                                             750774119
2
                     1
                                                       2.0
                                                             991434112
3
                    19
                                                      60.0
                                                            2219696038
4
                     7
                                                      60.0
                                                            2165106858
   patient_id expert_consensus
                                  seizure vote
                                               lpd_vote
                                                                     lrda_vote
                                                           gpd_vote
0
        57251
                        Seizure
                                             3
                                                                  0
                                             3
1
        11439
                        Seizure
                                                        0
                                                                  0
                                                                              0
2
                                             3
                                                        0
                                                                              0
        21771
                        Seizure
                                                                  0
                                             3
3
        16805
                        Seizure
                                                        0
                                                                  0
                                                                              0
                                             3
4
                                                        0
         4898
                        Seizure
                                                                  0
              other vote
   grda_vote
0
           0
                        0
           0
1
                        0
2
           0
                        0
3
           0
4
preparing_data took 0.0175 seconds.
Train non-overlapp eeg_id shape: (287, 13)
     eeg_id
             spectrogram_id
                                  min
                                          max
                                               patient_id
                                                            seizure_vote
    4431217
                  1459125071
                                 80.0
                                         80.0
                                                     49713
                                                                      0.0
0
                               140.0
                                        428.0
                                                                      0.0
  21054661
                  1067342787
                                                     37979
   54759002
                  1506575594
                                62.0
                                         62.0
                                                     63918
                                                                      1.0
  75373657
                    38412976
                                 48.0
                                         48.0
                                                      1851
                                                                      0.0
```

4	86189315	525426737	3076.0	3076.0	23337	0.0	
0 1 2 3	1.0 0.0 0.0 0.0	0.0 0.00 0.0 0.80 0.0 0.00 0.0 0.00	00000 00000 00000 00000	0.0 0.0 0.0 1.0	other_vote 0.000000 0.200000 0.000000 0.000000	9.939808 8.456420 I 8.717875 Seiz 8.717875	rget LPD LRDA zure GRDA
4 0.0 0.0 0.615385 0.0 0.384615 7.833665 LRDA There are 0 spectrogram parquets in total path There are 280 spectrogram parquets in this training process							
10	0%				280/280	[00:14<00:00,	19 . 96i
There are 0 EEG spectrograms in total path There are 287 EEG spectrograms in this training path							
100% 287/287 [00:01<00:00, 270.66i							
loading_parquet took 16.5921 seconds. fold 0.0 72 1.0 72 2.0 72 3.0 71 dtype: int64							
0	eeg_id 4431217	spectrogram_id 1459125071	min 80.0	max 80.0	patient_id 49713	seizure_vote 0.0	\
1	21054661	1067342787		428.0	37979	0.0	
2	54759002	1506575594	62.0	62.0	63918	1.0	
3	75373657	38412976	48.0	48.0	1851	0.0	
4	86189315	525426737		3076.0	23337	0.0	
0	lpd_vote 1.0	· -	_vote gr 00000	da_vote	other_vote 0.000000	kl_loss ta 9.939808	rget LPD

```
1
        0.0
                  0.0
                        0.800000
                                         0.0
                                                0.200000
                                                          8.456420
                                                                        LRDA
2
        0.0
                  0.0
                                         0.0
                        0.000000
                                                0.000000
                                                          8.717875
                                                                     Seizure
3
        0.0
                  0.0
                        0.000000
                                         1.0
                                                0.000000
                                                          8.717875
                                                                        GRDA
                  0.0
        0.0
                        0.615385
                                         0.0
                                                          7.833665
                                                                        LRDA
4
                                                0.384615
   fold
   0.0
0
    0.0
1
   3.0
2
   2.0
3
    1.0
4
X shape: torch.Size([128, 256, 12])
y shape: torch.Size([6])
Starting Stage 1 Training for Fold 0
Training Stage 1: Using all data
/opt/anaconda3/envs/myenv/lib/python3.11/site-packages/torch/amp/grad scaler
  warnings.warn(
Train:
         0%|
                                                 | 0/26 [00:00<?, ?train batc
  warnings.warn(
Train:
         4%|
                                         | 1/26 [00:09<04:04, 9.79s/train ba
Epoch: [1][0/26] Elapsed 0m 9s (remain 4m 4s) Loss: 1.5628 Grad: 2.7134 LR:
Train:
                                        21/26 [10:02<02:23, 28.63s/train_ba
        81%||
Epoch: [1][20/26] Elapsed 10m 2s (remain 2m 23s) Loss: 1.3906 Grad: 2.4186
Train: 100%||
                                  _____| 26/26 [12:39<00:00, 29.23s/train_ba
Epoch: [1][25/26] Elapsed 12m 39s (remain 0m 0s) Loss: 1.3773 Grad: 1.8469
train epoch took 759.9127 seconds.
Validation: 11%|
                                          | 1/9 [00:09<01:16, 9.60s/valid ba
```

EVAL: [0/9] Elapsed 0m 9s (remain 1m 16s) Loss: 1.5442 Validation: 100%| 10.79s/valid_ba EVAL: [8/9] Elapsed 1m 37s (remain 0m 0s) Loss: 1.4090 valid_epoch took 97.1178 seconds. Epoch 1 - avg_train_loss: 1.3773 avg_val_loss: 1.4090 time: 857s Train: 4%| | 1/26 [00:15<06:24, 15.36s/train_ba Epoch: [2][0/26] Elapsed 0m 15s (remain 6m 24s) Loss: 1.6451 Grad: 3.0663 L | 21/26 [11:18<02:02, 24.47s/train ba Train: 81%| Epoch: [2][20/26] Elapsed 11m 18s (remain 2m 41s) Loss: 1.3425 Grad: 2.3154 Train: 100% | 26/26 [12:38<00:00, 29.18s/train_ba Epoch: [2][25/26] Elapsed 12m 38s (remain 0m 0s) Loss: 1.3412 Grad: 2.5044 train_epoch took 758.7258 seconds. | 1/9 [00:09<01:15, 9.46s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 9s (remain 1m 15s) Loss: 1.5443 Validation: 100%| 9/9 [01:36<00:00, 10.70s/valid_ba

EVAL: [8/9] Elapsed 1m 36s (remain 0m 0s) Loss: 1.3938

valid_epoch took 96.3374 seconds.

```
Epoch 2 - avg train loss: 1.3412 avg val loss: 1.3938 time: 855s
                                     | 1/26 [00:08<03:29, 8.37s/train ba
Train:
        4%|
Epoch: [3][0/26] Elapsed 0m 8s (remain 3m 29s) Loss: 1.0569 Grad: 2.3634 LR
                                    | 21/26 [10:18<01:07, 13.41s/train ba
Train:
      81%|
Epoch: [3][20/26] Elapsed 10m 18s (remain 2m 27s) Loss: 1.2442 Grad: 2.7915
                    | 26/26 [13:01<00:00, 30.05s/train_ba
Train: 100%
Epoch: [3][25/26] Elapsed 13m 1s (remain 0m 0s) Loss: 1.2494 Grad: 2.7122 L
train epoch took 781.3759 seconds.
Validation: 11%
                                   | 1/9 [10:28<1:23:50, 628.78s/valid ba
EVAL: [0/9] Elapsed 10m 28s (remain 83m 50s) Loss: 1.4957
Validation: 100%| 48s/valid ba
EVAL: [8/9] Elapsed 11m 55s (remain 0m 0s) Loss: 1.3152
valid_epoch took 715.3522 seconds.
Epoch 3 - avg_train_loss: 1.2494 avg_val_loss: 1.3152 time: 1497s
Train:
      4%|
                                     | 1/26 [00:13<05:38, 13.52s/train_ba
Epoch: [4][0/26] Elapsed 0m 13s (remain 5m 38s) Loss: 1.1981 Grad: 2.4502 L
```

Train: 81%

| 21/26 [10:11<01:46, 21.39s/train ba

Epoch: [4][20/26] Elapsed 10m 11s (remain 2m 25s) Loss: 1.1485 Grad: 3.1235 Train: 100% | 26/26 [11:24<00:00, 26.34s/train_ba Epoch: [4][25/26] Elapsed 11m 24s (remain 0m 0s) Loss: 1.1658 Grad: 3.3045 train_epoch took 684.7745 seconds. Validation: 11% | 1/9 [00:09<01:16, 9.59s/valid_ba EVAL: [0/9] Elapsed 0m 9s (remain 1m 16s) Loss: 1.3904 Validation: 100%| 10.78s/valid_ba EVAL: [8/9] Elapsed 1m 37s (remain 0m 0s) Loss: 1.2071 valid epoch took 97.0378 seconds. Epoch 4 - avg_train_loss: 1.1658 avg_val_loss: 1.2071 time: 782s | 1/26 [00:58<24:14, 58.20s/train_ba Train: 4%| Epoch: [5][0/26] Elapsed 0m 58s (remain 24m 14s) Loss: 1.1596 Grad: 2.3584 Train: 81% | 21/26 [1:04:57<06:16, 75.34s/train_ba Epoch: [5][20/26] Elapsed 64m 57s (remain 15m 28s) Loss: 1.0601 Grad: 2.4875 Train: 100% | 152.46s/train_ba

Epoch: [5][25/26] Elapsed 66m 3s (remain 0m 0s) Loss: 1.0262 Grad: 2.5446 L

train epoch took 3963.8953 seconds.

Validation: 11% | 1/9 [00:09<01:17, 9.66s/valid ba EVAL: [0/9] Elapsed 0m 9s (remain 1m 17s) Loss: 1.2818 Validation: 100%| 1.00s/valid_ba EVAL: [8/9] Elapsed 1m 39s (remain 0m 0s) Loss: 1.1214 valid_epoch took 99.0202 seconds. Epoch 5 - avg_train_loss: 1.0262 avg_val_loss: 1.1214 time: 4063s Train: 4% | 1/26 [00:08<03:43, 8.92s/train_ba Epoch: [6][0/26] Elapsed 0m 8s (remain 3m 43s) Loss: 1.1130 Grad: 3.3631 LR | 21/26 [10:38<02:05, 25.04s/train ba Train: 81% Epoch: [6][20/26] Elapsed 10m 38s (remain 2m 32s) Loss: 0.9991 Grad: 4.7167 Train: 100% | 29.56s/train ba Epoch: [6][25/26] Elapsed 12m 48s (remain 0m 0s) Loss: 0.9518 Grad: 2.7989 train_epoch took 768.6919 seconds. | 1/9 [00:09<01:16, 9.60s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 9s (remain 1m 16s) Loss: 1.2197

Validation: 100%| 10.78s/valid_ba

EVAL: [8/9] Elapsed 1m 37s (remain 0m 0s) Loss: 1.1211

valid_epoch took 97.0250 seconds.

Epoch 6 - avg_train_loss: 0.9518 avg_val_loss: 1.1211 time: 866s

Train: 4%| | 1/26 [00:09<03:47, 9.12s/train_ba

Epoch: [7][0/26] Elapsed 0m 9s (remain 3m 47s) Loss: 0.9140 Grad: 2.6752 LR

Train: 81%| | 21/26 [11:18<01:38, 19.61s/train_ba

Epoch: [7][20/26] Elapsed 11m 18s (remain 2m 41s) Loss: 0.8836 Grad: 3.9744

Train: 100%| 28.61s/train_ba

Epoch: [7][25/26] Elapsed 12m 23s (remain 0m 0s) Loss: 0.8747 Grad: 2.8473 train_epoch took 743.9821 seconds.

EVAL: [0/9] Elapsed 0m 9s (remain 1m 16s) Loss: 1.1816

Validation: 100%| 9/9 [01:37<00:00, 10.85s/valid_ba

EVAL: [8/9] Elapsed 1m 37s (remain 0m 0s) Loss: 1.0561

valid_epoch took 97.6387 seconds.

Epoch 7 - avg_train_loss: 0.8747 avg_val_loss: 1.0561 time: 842s

Train: 4%| | 1/26 [00:09<04:02, 9.71s/train_ba

Epoch: [8][0/26] Elapsed 0m 9s (remain 4m 2s) Loss: 0.9529 Grad: 3.2725 LR:

```
Train: 81%
                                  | 21/26 [11:55<03:12, 38.49s/train ba
Epoch: [8][20/26] Elapsed 11m 55s (remain 2m 50s) Loss: 0.8344 Grad: 6.0647
Train: 100% | 29.60s/train_ba
Epoch: [8][25/26] Elapsed 12m 49s (remain 0m 0s) Loss: 0.7984 Grad: 3.7328
train_epoch took 769.4999 seconds.
                                   | 1/9 [00:09<01:16, 9.58s/valid_ba
Validation: 11%
EVAL: [0/9] Elapsed 0m 9s (remain 1m 16s) Loss: 1.2122
Validation: 100%| 10.79s/valid_ba
EVAL: [8/9] Elapsed 1m 37s (remain 0m 0s) Loss: 1.0373
valid epoch took 97.1049 seconds.
Epoch 8 - avg_train_loss: 0.7984 avg_val_loss: 1.0373 time: 867s
Train:
                                   | 1/26 [00:32<13:39, 32.76s/train_ba
       4%|
Epoch: [9][0/26] Elapsed 0m 32s (remain 13m 39s) Loss: 0.6527 Grad: 2.9504
Train: 81%
                                 | 21/26 [10:44<01:50, 22.09s/train_ba
Epoch: [9][20/26] Elapsed 10m 44s (remain 2m 33s) Loss: 0.7421 Grad: 3.6401
```

Train: 100%| 28.47s/train_ba

Epoch: [9][25/26] Elapsed 12m 20s (remain 0m 0s) Loss: 0.7326 Grad: 3.2860 train_epoch took 740.2389 seconds.

EVAL: [0/9] Elapsed 0m 9s (remain 1m 18s) Loss: 1.2361

Validation: 100%| 9/9 [01:37<00:00, 10.86s/valid_ba

EVAL: [8/9] Elapsed 1m 37s (remain 0m 0s) Loss: 1.0585

valid_epoch took 97.7077 seconds.

Epoch 9 - avg_train_loss: 0.7326 avg_val_loss: 1.0585 time: 838s

Train: 4%| | 1/26 [00:07<03:06, 7.44s/train_ba

Epoch: [10][0/26] Elapsed 0m 7s (remain 3m 6s) Loss: 0.7470 Grad: 6.0681 LR

Train: 81%| 21/26 [09:14<01:37, 19.54s/train_ba

Epoch: [10][20/26] Elapsed 9m 14s (remain 2m 12s) Loss: 0.7305 Grad: 3.8500

Train: 100%| 29.38s/train_ba

Epoch: [10][25/26] Elapsed 12m 43s (remain 0m 0s) Loss: 0.7212 Grad: 4.6630 train_epoch took 763.9669 seconds.

Validation: 11%| | 1/9 [00:09<01:16, 9.50s/valid_ba

EVAL: [0/9] Elapsed 0m 9s (remain 1m 16s) Loss: 1.1101

9/9 [01:37<00:00, 10.80s/valid ba Validation: 100% EVAL: [8/9] Elapsed 1m 37s (remain 0m 0s) Loss: 1.0286 valid epoch took 97.2178 seconds. Epoch 10 - avg_train_loss: 0.7212 avg_val_loss: 1.0286 time: 861s | 1/26 [00:09<04:03, 9.74s/train_ba Train: 4%| Epoch: [11][0/26] Elapsed 0m 9s (remain 4m 3s) Loss: 0.6824 Grad: 4.5213 LR Train: 81% | 21/26 [11:22<01:41, 20.27s/train_ba Epoch: [11][20/26] Elapsed 11m 22s (remain 2m 42s) Loss: 0.6725 Grad: 4.0601 Train: 100% | 29.10s/train_ba Epoch: [11][25/26] Elapsed 12m 36s (remain 0m 0s) Loss: 0.6996 Grad: 4.9381 train epoch took 756.5016 seconds. | 1/9 [00:09<01:16, 9.58s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 9s (remain 1m 16s) Loss: 1.0706 9/9 [01:38<00:00, 10.97s/valid ba Validation: 100% EVAL: [8/9] Elapsed 1m 38s (remain 0m 0s) Loss: 0.9728 valid epoch took 98.7442 seconds.

Epoch 11 - avg_train_loss: 0.6996 avg_val_loss: 0.9728 time: 855s

```
Train:
        4%
                                     | 1/26 [00:13<05:36, 13.46s/train ba
Epoch: [12][0/26] Elapsed 0m 13s (remain 5m 36s) Loss: 0.6056 Grad: 3.7459
Train: 81%
                                    | 21/26 [11:23<03:09, 38.00s/train ba
Epoch: [12][20/26] Elapsed 11m 23s (remain 2m 42s) Loss: 0.6047 Grad: 2.5716
Train: 100%| 29.39s/train_ba
Epoch: [12][25/26] Elapsed 12m 44s (remain 0m 0s) Loss: 0.5958 Grad: 3.8759
train_epoch took 764.0264 seconds.
Validation: 11%
                                      | 1/9 [00:09<01:16, 9.54s/valid ba
EVAL: [0/9] Elapsed 0m 9s (remain 1m 16s) Loss: 1.1181
                            9/9 [01:36<00:00, 10.76s/valid_ba
Validation: 100%
EVAL: [8/9] Elapsed 1m 36s (remain 0m 0s) Loss: 0.9888
valid_epoch took 96.8539 seconds.
Epoch 12 - avg_train_loss: 0.5958 avg_val_loss: 0.9888 time: 861s
Train:
                                     | 1/26 [00:14<05:57, 14.30s/train_ba
        4%
Epoch: [13] [0/26] Elapsed 0m 14s (remain 5m 57s) Loss: 0.6161 Grad: 4.2520
      81%|
Train:
                                    | 21/26 [07:37<00:49, 9.83s/train ba
```

Epoch: [13][20/26] Elapsed 7m 37s (remain 1m 48s) Loss: 0.5918 Grad: 2.9083

26/26 [12:44<00:00, 29.40s/train ba Train: 100% Epoch: [13][25/26] Elapsed 12m 44s (remain 0m 0s) Loss: 0.6151 Grad: 3.4268 train epoch took 764.3253 seconds. Validation: 11% | 1/9 [00:09<01:15, 9.49s/valid ba EVAL: [0/9] Elapsed 0m 9s (remain 1m 15s) Loss: 1.1218 Validation: 100% EVAL: [8/9] Elapsed 1m 38s (remain 0m 0s) Loss: 0.9935 valid epoch took 98.7773 seconds. Epoch 13 - avg train loss: 0.6151 avg val loss: 0.9935 time: 863s Train: | 1/26 [03:08<1:18:30, 188.42s/train_ba 4%|■ Epoch: [14][0/26] Elapsed 3m 8s (remain 78m 30s) Loss: 0.5323 Grad: 3.7330 Train: 81%| 21/26 [09:52<01:25, 17.16s/train_ba Epoch: [14][20/26] Elapsed 9m 52s (remain 2m 20s) Loss: 0.6612 Grad: 3.5700 Train: 100%|| _____| 26/26 [12:48<00:00, 29.55s/train_ba Epoch: [14][25/26] Elapsed 12m 48s (remain 0m 0s) Loss: 0.6178 Grad: 3.5023 train epoch took 768.4253 seconds.

Validation: 11%

| 1/9 [00:09<01:15, 9.42s/valid ba

```
EVAL: [0/9] Elapsed 0m 9s (remain 1m 15s) Loss: 1.0635
Validation: 100%
                                 9/9 [01:38<00:00, 11.00s/valid_ba
EVAL: [8/9] Elapsed 1m 38s (remain 0m 0s) Loss: 0.9859
valid epoch took 98.9809 seconds.
Epoch 14 - avg_train_loss: 0.6178 avg_val_loss: 0.9859 time: 867s
Early stopping triggered at 13 epochs without improvement.
train_loop took 15774.7488 seconds.
get_result took 0.0028 seconds.
get result took 0.0004 seconds.
======= Fold 0 Stage 1 result: 1.2593094134672695 =======
Starting Stage 2 Training for Fold 0
Training Stage 2: Filtering data based on KL Loss < 9
/opt/anaconda3/envs/myenv/lib/python3.11/site-packages/torch/amp/grad scaler
 warnings.warn(
Train:
        0%|
                                              | 0/25 [00:00<?, ?train_batc
 warnings.warn(
Train: 4%|■
                                      | 1/25 [00:11<04:25, 11.07s/train_ba
Epoch: [1][0/25] Elapsed 0m 11s (remain 4m 25s) Loss: 0.3597 Grad: 2.5711 L
Train: 84%|
                                    | 21/25 [09:57<01:08, 17.22s/train_ba
Epoch: [1][20/25] Elapsed 9m 57s (remain 1m 53s) Loss: 0.6011 Grad: 5.4451
Train: 100%| 25/25 [12:32<00:00, 30.08s/train_ba
```

Epoch: [1][24/25] Elapsed 12m 32s (remain 0m 0s) Loss: 0.5971 Grad: 4.1627 train epoch took 752.1283 seconds. | 1/9 [00:09<01:19, 9.91s/valid ba Validation: 11% EVAL: [0/9] Elapsed 0m 9s (remain 1m 19s) Loss: 1.0992 Validation: 100%| 10.97s/valid_ba EVAL: [8/9] Elapsed 1m 38s (remain 0m 0s) Loss: 1.0065 valid_epoch took 98.6980 seconds. Epoch 1 - avg_train_loss: 0.5971 avg_val_loss: 1.0065 time: 851s 4%| | 1/25 [00:11<04:35, 11.48s/train ba Train: Epoch: [2][0/25] Elapsed 0m 11s (remain 4m 35s) Loss: 0.7057 Grad: 4.8587 L Train: 84% | 21/25 [08:19<01:46, 26.65s/train ba Epoch: [2][20/25] Elapsed 8m 19s (remain 1m 35s) Loss: 0.5661 Grad: 4.0058 Train: 100% 25/25 [11:55<00:00, 28.60s/train_ba Epoch: [2][24/25] Elapsed 11m 55s (remain 0m 0s) Loss: 0.5640 Grad: 6.0272 train_epoch took 715.0197 seconds.

| 1/9 [00:09<01:15, 9.46s/valid ba

Validation: 11%

EVAL: [0/9] Elapsed 0m 9s (remain 1m 15s) Loss: 1.1733

9/9 [01:36<00:00, 10.71s/valid ba Validation: 100% EVAL: [8/9] Elapsed 1m 36s (remain 0m 0s) Loss: 1.0389 valid epoch took 96.3735 seconds. Epoch 2 - avg_train_loss: 0.5640 avg_val_loss: 1.0389 time: 811s | 1/25 [00:09<03:36, 9.01s/train_ba Train: 4%| Epoch: [3][0/25] Elapsed 0m 9s (remain 3m 36s) Loss: 0.7322 Grad: 5.7345 LR | 21/25 [10:08<02:38, 39.62s/train_ba Train: 84% Epoch: [3][20/25] Elapsed 10m 8s (remain 1m 55s) Loss: 0.5466 Grad: 3.5721 Train: 100% | 25/25 [12:14<00:00, 29.38s/train ba Epoch: [3][24/25] Elapsed 12m 14s (remain 0m 0s) Loss: 0.5382 Grad: 5.5361 train epoch took 734.4022 seconds. | 1/9 [00:09<01:16, 9.55s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 9s (remain 1m 16s) Loss: 1.1754 Validation: 100% 9/9 [01:37<00:00, 10.81s/valid_ba EVAL: [8/9] Elapsed 1m 37s (remain 0m 0s) Loss: 1.1076 valid epoch took 97.3329 seconds.

Epoch 3 - avg train loss: 0.5382 avg val loss: 1.1076 time: 832s

```
Train:
        4%
                                     | 1/25 [00:09<03:51, 9.66s/train ba
Epoch: [4][0/25] Elapsed 0m 9s (remain 3m 51s) Loss: 0.6783 Grad: 7.5791 LR
Train: 84%
                                    | 21/25 [10:26<01:50, 27.67s/train ba
Epoch: [4][20/25] Elapsed 10m 26s (remain 1m 59s) Loss: 0.4406 Grad: 3.4982
Train: 100%| 25/25 [12:09<00:00, 29.18s/train_ba
Epoch: [4][24/25] Elapsed 12m 9s (remain 0m 0s) Loss: 0.4421 Grad: 5.6365 L
train_epoch took 729.4974 seconds.
Validation: 11%
                                      | 1/9 [00:09<01:16, 9.57s/valid ba
EVAL: [0/9] Elapsed 0m 9s (remain 1m 16s) Loss: 1.0717
                            9/9 [01:36<00:00, 10.78s/valid_ba
Validation: 100%
EVAL: [8/9] Elapsed 1m 36s (remain 0m 0s) Loss: 1.1296
valid_epoch took 96.9878 seconds.
Epoch 4 - avg_train_loss: 0.4421 avg_val_loss: 1.1296 time: 826s
                                     | 1/25 [00:09<03:51, 9.65s/train_ba
Train:
        4%
Epoch: [5][0/25] Elapsed 0m 9s (remain 3m 51s) Loss: 0.3917 Grad: 4.1032 LR
```

Epoch: [5][20/25] Elapsed 55m 3s (remain 10m 29s) Loss: 0.4908 Grad: 12.6854

| 21/25 [55:03<40:38, 609.68s/train ba

84%|

Train:

```
Train: 100%
                               25/25 [56:07<00:00, 134.68s/train_ba
Epoch: [5][24/25] Elapsed 56m 7s (remain 0m 0s) Loss: 0.4707 Grad: 4.6297 L
train epoch took 3367.0285 seconds.
                                       | 1/9 [00:09<01:19, 9.89s/valid_ba
Validation: 11%
EVAL: [0/9] Elapsed 0m 9s (remain 1m 19s) Loss: 1.1963
                               Validation: 100%
EVAL: [8/9] Elapsed 1m 37s (remain 0m 0s) Loss: 1.0837
valid_epoch took 97.2333 seconds.
Epoch 5 - avg_train_loss: 0.4707 avg_val_loss: 1.0837 time: 3464s
Early stopping triggered at 4 epochs without improvement.
train_loop took 6785.7628 seconds.
get result took 0.0016 seconds.
get_result took 0.0003 seconds.
======= Fold 0 Stage 2 result: 1.2543410266495378 ========
Starting Stage 1 Training for Fold 1
Training Stage 1: Using all data
/opt/anaconda3/envs/myenv/lib/python3.11/site-packages/torch/amp/grad_scaler
 warnings.warn(
Train:
        0%|
                                             | 0/26 [00:00<?, ?train_batc
 warnings.warn(
Train:
        4%|
                                      | 1/26 [00:08<03:39, 8.76s/train ba
Epoch: [1][0/26] Elapsed 0m 8s (remain 3m 39s) Loss: 1.2886 Grad: 2.0540 LR
```

```
Train: 81%
                                   | 21/26 [07:01<01:13, 14.63s/train ba
Epoch: [1][20/26] Elapsed 7m 1s (remain 1m 40s) Loss: 1.3886 Grad: 2.1359 L
Train: 100%
                          _____| 26/26 [11:22<00:00, 26.25s/train_ba
Epoch: [1][25/26] Elapsed 11m 22s (remain 0m 0s) Loss: 1.3965 Grad: 2.7388
train_epoch took 682.5236 seconds.
                                     | 1/9 [01:31<12:11, 91.49s/valid_ba
Validation: 11%
EVAL: [0/9] Elapsed 1m 31s (remain 12m 11s) Loss: 1.0645
Validation: 100%| 26.42s/valid_ba
EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.4295
valid epoch took 237.7739 seconds.
Epoch 1 - avg_train_loss: 1.3965 avg_val_loss: 1.4295 time: 920s
Train:
                                    | 1/26 [00:49<20:34, 49.40s/train_ba
       4%|
Epoch: [2][0/26] Elapsed 0m 49s (remain 20m 34s) Loss: 1.5393 Grad: 2.7127
Train: 81%
                                  | 21/26 [05:47<01:22, 16.57s/train_ba
Epoch: [2][20/26] Elapsed 5m 47s (remain 1m 22s) Loss: 1.3349 Grad: 2.1129
```

Train: 100%| 23.91s/train_ba

Epoch: [2][25/26] Elapsed 10m 21s (remain 0m 0s) Loss: 1.3411 Grad: 2.8941 train_epoch took 621.6001 seconds.

EVAL: [0/9] Elapsed 1m 30s (remain 12m 4s) Loss: 1.0792

Validation: 100%| 9/9 [03:52<00:00, 25.82s/valid_ba

EVAL: [8/9] Elapsed 3m 52s (remain 0m 0s) Loss: 1.4168

valid_epoch took 232.4094 seconds.

Epoch 2 - avg_train_loss: 1.3411 avg_val_loss: 1.4168 time: 854s

Train: 4%| | 1/26 [00:16<07:00, 16.82s/train_ba

Epoch: [3][0/26] Elapsed 0m 16s (remain 7m 0s) Loss: 1.4311 Grad: 4.2622 LR

Train: 81%| 21/26 [06:41<01:02, 12.41s/train_ba

Epoch: [3][20/26] Elapsed 6m 41s (remain 1m 35s) Loss: 1.2560 Grad: 5.6275

Train: 100%| 24.00s/train_ba

Epoch: [3][25/26] Elapsed 10m 24s (remain 0m 0s) Loss: 1.2353 Grad: 2.9050 train_epoch took 624.1211 seconds.

Validation: 11%| | 1/9 [01:30<12:02, 90.37s/valid_ba

EVAL: [0/9] Elapsed 1m 30s (remain 12m 3s) Loss: 0.9895

9/9 [03:51<00:00, 25.77s/valid ba Validation: 100% EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.3286 valid epoch took 231.9070 seconds. Epoch 3 - avg_train_loss: 1.2353 avg_val_loss: 1.3286 time: 856s | 1/26 [00:17<07:26, 17.86s/train_ba Train: 4%| Epoch: [4][0/26] Elapsed 0m 17s (remain 7m 26s) Loss: 1.1795 Grad: 2.4190 L | 21/26 [09:30<01:27, 17.46s/train_ba Train: 81% Epoch: [4][20/26] Elapsed 9m 30s (remain 2m 15s) Loss: 1.1153 Grad: 3.2731 Train: 100% | 23.85s/train_ba Epoch: [4][25/26] Elapsed 10m 20s (remain 0m 0s) Loss: 1.1238 Grad: 2.8936 train epoch took 620.1579 seconds. Validation: 11% | 1/9 [01:30<12:01, 90.17s/valid_ba EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.8902 Validation: 100% 9/9 [03:51<00:00, 25.72s/valid_ba EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.2076 valid epoch took 231.5014 seconds.

Epoch 4 - avg_train_loss: 1.1238 avg_val_loss: 1.2076 time: 852s

```
Train:
        4%
                                    | 1/26 [00:08<03:26, 8.24s/train ba
Epoch: [5][0/26] Elapsed 0m 8s (remain 3m 26s) Loss: 0.9940 Grad: 2.6176 LR
Train: 81%
                                    21/26 [06:56<02:30, 30.14s/train ba
Epoch: [5][20/26] Elapsed 6m 56s (remain 1m 39s) Loss: 1.0533 Grad: 2.7355
Train: 100% | 23.98s/train_ba
Epoch: [5][25/26] Elapsed 10m 23s (remain 0m 0s) Loss: 1.0338 Grad: 3.5511
train_epoch took 623.5845 seconds.
Validation: 11%
                                     | 1/9 [01:30<12:01, 90.18s/valid ba
EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.8770
                           9/9 [03:51<00:00, 25.72s/valid_ba
Validation: 100%
EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.1680
valid_epoch took 231.5265 seconds.
Epoch 5 - avg_train_loss: 1.0338 avg_val_loss: 1.1680 time: 855s
Train:
                                    | 1/26 [00:22<09:32, 22.90s/train_ba
        4%
Epoch: [6][0/26] Elapsed 0m 22s (remain 9m 32s) Loss: 0.8670 Grad: 2.8064 L
```

Epoch: [6][20/26] Elapsed 9m 20s (remain 2m 13s) Loss: 0.9402 Grad: 3.4267

| 21/26 [09:20<01:10, 14.06s/train ba

81%|

Train:

26/26 [10:24<00:00, 24.00s/train ba Train: 100% Epoch: [6][25/26] Elapsed 10m 24s (remain 0m 0s) Loss: 0.9184 Grad: 4.0653 train epoch took 624.1122 seconds. | 1/9 [01:30<12:04, 90.52s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 1m 30s (remain 12m 4s) Loss: 0.8676 9/9 [03:52<00:00, 25.83s/valid_ba Validation: 100% EVAL: [8/9] Elapsed 3m 52s (remain 0m 0s) Loss: 1.1018 valid epoch took 232.4863 seconds. Epoch 6 - avg train loss: 0.9184 avg val loss: 1.1018 time: 857s Train: | 1/26 [00:08<03:23, 8.15s/train_ba 4%| Epoch: [7][0/26] Elapsed 0m 8s (remain 3m 23s) Loss: 1.3200 Grad: 3.5590 LR Train: 81%| 21/26 [06:40<02:43, 32.65s/train_ba Epoch: [7][20/26] Elapsed 6m 40s (remain 1m 35s) Loss: 0.9000 Grad: 3.4403 Train: 100%|| | 26/26 [10:24<00:00, 24.01s/train_ba Epoch: [7][25/26] Elapsed 10m 24s (remain 0m 0s) Loss: 0.8688 Grad: 5.1446 train epoch took 624.2930 seconds.

Validation: 11%

| 1/9 [01:30<12:02, 90.33s/valid ba

EVAL: [0/9] Elapsed 1m 30s (remain 12m 2s) Loss: 0.8520 Validation: 100%| 25.78s/valid_ba EVAL: [8/9] Elapsed 3m 52s (remain 0m 0s) Loss: 1.0657 valid epoch took 232.0278 seconds. Epoch 7 - avg_train_loss: 0.8688 avg_val_loss: 1.0657 time: 856s Train: 4%| | 1/26 [00:07<03:17, 7.92s/train_ba Epoch: [8][0/26] Elapsed 0m 7s (remain 3m 18s) Loss: 0.8885 Grad: 2.9915 LR | 21/26 [07:44<01:55, 23.06s/train ba Train: 81%| Epoch: [8][20/26] Elapsed 7m 44s (remain 1m 50s) Loss: 0.7812 Grad: 3.8306 26/26 [09:34<00:00, 22.09s/train_ba Train: 100% Epoch: [8][25/26] Elapsed 9m 34s (remain 0m 0s) Loss: 0.7827 Grad: 3.6504 L train_epoch took 574.3482 seconds. Validation: 11% | 1/9 [01:30<12:01, 90.13s/valid_ba EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.8127 Validation: 100%| 25.78s/valid_ba

EVAL: [8/9] Elapsed 3m 52s (remain 0m 0s) Loss: 1.0651 valid_epoch took 232.0536 seconds.

```
Epoch 8 - avg train loss: 0.7827 avg val loss: 1.0651 time: 806s
                                    | 1/26 [00:15<06:33, 15.75s/train ba
Train:
        4%|
Epoch: [9][0/26] Elapsed 0m 15s (remain 6m 33s) Loss: 0.6626 Grad: 3.6092 L
                                    21/26 [07:07<02:48, 33.68s/train ba
Train:
      81%|
Epoch: [9][20/26] Elapsed 7m 7s (remain 1m 41s) Loss: 0.7527 Grad: 4.7718 L
Train: 100%| 23.84s/train_ba
Epoch: [9][25/26] Elapsed 10m 19s (remain 0m 0s) Loss: 0.7559 Grad: 3.2724
train epoch took 619.7162 seconds.
Validation: 11%
                                     | 1/9 [01:30<12:02, 90.31s/valid ba
EVAL: [0/9] Elapsed 1m 30s (remain 12m 2s) Loss: 0.7528
Validation: 100%| 9/9 [03:51<00:00, 25.75s/valid ba
EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0442
valid_epoch took 231.7170 seconds.
Epoch 9 - avg_train_loss: 0.7559 avg_val_loss: 1.0442 time: 851s
Train:
       4%|
                                    | 1/26 [00:08<03:36, 8.68s/train_ba
Epoch: [10][0/26] Elapsed 0m 8s (remain 3m 36s) Loss: 0.6011 Grad: 3.4805 L
```

Train: 81%

| 21/26 [06:50<01:35, 19.14s/train ba

Epoch: [10][20/26] Elapsed 6m 50s (remain 1m 37s) Loss: 0.6271 Grad: 2.8379 Train: 100% | 26/26 [10:21<00:00, 23.89s/train_ba Epoch: [10][25/26] Elapsed 10m 21s (remain 0m 0s) Loss: 0.6443 Grad: 4.1648 train_epoch took 621.1984 seconds. | 1/9 [01:30<12:02, 90.37s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 1m 30s (remain 12m 2s) Loss: 0.7550 Validation: 100%| 25.75s/valid_ba EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0457 valid epoch took 231.7687 seconds. Epoch 10 - avg_train_loss: 0.6443 avg_val_loss: 1.0457 time: 853s | 1/26 [00:28<11:48, 28.32s/train ba Train: 4%| Epoch: [11][0/26] Elapsed 0m 28s (remain 11m 48s) Loss: 0.8225 Grad: 4.8326 Train: 81% | 21/26 [09:15<01:38, 19.65s/train_ba Epoch: [11][20/26] Elapsed 9m 15s (remain 2m 12s) Loss: 0.6774 Grad: 5.0555 Train: 100% | 23.90s/train_ba

Epoch: [11][25/26] Elapsed 10m 21s (remain 0m 0s) Loss: 0.6533 Grad: 4.4661

train epoch took 621.3444 seconds.

| 1/9 [01:30<12:01, 90.20s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.7293 Validation: 100%| 9/9 [03:51<00:00, 25.73s/valid_ba EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0459 valid_epoch took 231.5402 seconds. Epoch 11 - avg_train_loss: 0.6533 avg_val_loss: 1.0459 time: 853s Train: 4%| | 1/26 [00:10<04:34, 10.97s/train_ba Epoch: [12][0/26] Elapsed 0m 10s (remain 4m 34s) Loss: 0.7490 Grad: 4.4755 Train: 81% | 21/26 [07:14<01:06, 13.33s/train ba Epoch: [12][20/26] Elapsed 7m 14s (remain 1m 43s) Loss: 0.6395 Grad: 4.0626 Train: 100% | 26/26 [10:20<00:00, 23.85s/train_ba Epoch: [12][25/26] Elapsed 10m 20s (remain 0m 0s) Loss: 0.6253 Grad: 3.7060 train_epoch took 620.1603 seconds. Validation: 11% | 1/9 [01:30<12:01, 90.21s/valid_ba EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.7828

Validation: 100%| 25.73s/valid_ba

EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0371

valid_epoch took 231.5905 seconds.

Epoch 12 - avg_train_loss: 0.6253 avg_val_loss: 1.0371 time: 852s

Train: 4%| | 1/26 [00:08<03:33, 8.53s/train_ba

Epoch: [13][0/26] Elapsed 0m 8s (remain 3m 33s) Loss: 0.5575 Grad: 3.7055 L

Train: 81%| 21/26 [08:33<01:10, 14.16s/train_ba

Epoch: [13][20/26] Elapsed 8m 33s (remain 2m 2s) Loss: 0.6092 Grad: 5.2785

Train: 100%| 23.88s/train_ba

Epoch: [13][25/26] Elapsed 10m 20s (remain 0m 0s) Loss: 0.6178 Grad: 3.3107 train_epoch took 620.9670 seconds.

EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.7683

Validation: 100%| 25.74s/valid_ba

EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0458

valid_epoch took 231.6988 seconds.

Epoch 13 - avg_train_loss: 0.6178 avg_val_loss: 1.0458 time: 853s

Train: 4%| | 1/26 [00:08<03:36, 8.67s/train_ba

Epoch: [14][0/26] Elapsed 0m 8s (remain 3m 36s) Loss: 0.6671 Grad: 4.3845 L

```
Train:
      81%||
                                    21/26 [08:21<04:47, 57.47s/train ba
Epoch: [14][20/26] Elapsed 8m 21s (remain 1m 59s) Loss: 0.5594 Grad: 2.6566
Train: 100%
                             | 26/26 [10:18<00:00, 23.77s/train_ba
Epoch: [14][25/26] Elapsed 10m 18s (remain 0m 0s) Loss: 0.5675 Grad: 3.5370
train_epoch took 618.0848 seconds.
Validation: 11%
                                      | 1/9 [01:30<12:01, 90.15s/valid_ba
EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.7892
Validation: 100%| 25.73s/valid_ba
EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0466
valid epoch took 231.5667 seconds.
Epoch 14 - avg_train_loss: 0.5675 avg_val_loss: 1.0466 time: 850s
Early stopping triggered at 13 epochs without improvement.
train_loop took 11969.1596 seconds.
get_result took 0.0018 seconds.
get result took 0.0004 seconds.
======= Fold 1 Stage 1 result: 1.2588057879216985 =======
Starting Stage 2 Training for Fold 1
Training Stage 2: Filtering data based on KL Loss < 9
```

/opt/anaconda3/envs/myenv/lib/python3.11/site-packages/torch/amp/grad scaler

```
warnings.warn(
                                              | 0/25 [00:00<?, ?train batc
Train:
        0%|
 warnings.warn(
                                      | 1/25 [00:09<03:52, 9.67s/train ba
Train:
       4%|
Epoch: [1][0/25] Elapsed 0m 9s (remain 3m 52s) Loss: 0.5492 Grad: 2.9689 LR
                                     | 21/25 [08:08<01:04, 16.22s/train ba
Train:
      84%
Epoch: [1][20/25] Elapsed 8m 8s (remain 1m 33s) Loss: 0.6193 Grad: 4.8152 L
                             25/25 [09:48<00:00, 23.52s/train_ba
Train: 100%
Epoch: [1][24/25] Elapsed 9m 48s (remain 0m 0s) Loss: 0.6024 Grad: 3.8268 L
train epoch took 588.0198 seconds.
                                       | 1/9 [01:30<12:01, 90.15s/valid ba
Validation: 11%
EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.7526
Validation: 100%
                             9/9 [03:51<00:00, 25.73s/valid ba
EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0412
valid_epoch took 231.5844 seconds.
Epoch 1 - avg_train_loss: 0.6024 avg_val_loss: 1.0412 time: 820s
Train:
        4%|
                                      | 1/25 [00:08<03:15, 8.16s/train_ba
Epoch: [2][0/25] Elapsed 0m 8s (remain 3m 15s) Loss: 0.3977 Grad: 3.2281 LR
```

| 21/25 [06:33<01:27, 21.99s/train ba

Train: 84%|

Epoch: [2][20/25] Elapsed 6m 33s (remain 1m 14s) Loss: 0.5272 Grad: 3.8525 Train: 100% 25/25 [09:48<00:00, 23.52s/train_ba Epoch: [2][24/25] Elapsed 9m 48s (remain 0m 0s) Loss: 0.5259 Grad: 4.4489 L train_epoch took 588.0533 seconds. Validation: 11% | 1/9 [01:30<12:01, 90.20s/valid_ba EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.7166 Validation: 100%| 25.69s/valid_ba EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0335 valid epoch took 231.1923 seconds. Epoch 2 - avg_train_loss: 0.5259 avg_val_loss: 1.0335 time: 819s | 1/25 [00:25<10:12, 25.54s/train ba Train: 4%| Epoch: [3][0/25] Elapsed 0m 25s (remain 10m 12s) Loss: 0.4761 Grad: 3.9144 Train: 84%| | 21/25 [08:58<02:49, 42.40s/train_ba Epoch: [3][20/25] Elapsed 8m 58s (remain 1m 42s) Loss: 0.5233 Grad: 3.8256 Train: 100% | 23.56s/train_ba

Epoch: [3][24/25] Elapsed 9m 49s (remain 0m 0s) Loss: 0.5339 Grad: 4.2939 L

train epoch took 589.0142 seconds.

| 1/9 [01:30<12:01, 90.23s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.8092 Validation: 100%| 9/9 [03:51<00:00, 25.73s/valid_ba EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0532 valid_epoch took 231.5321 seconds. Epoch 3 - avg_train_loss: 0.5339 avg_val_loss: 1.0532 time: 821s Train: 4% | 1/25 [02:28<59:17, 148.23s/train_ba Epoch: [4][0/25] Elapsed 2m 28s (remain 59m 17s) Loss: 0.4204 Grad: 3.8256 Train: 84% | 21/25 [08:16<01:01, 15.30s/train ba Epoch: [4][20/25] Elapsed 8m 16s (remain 1m 34s) Loss: 0.4826 Grad: 4.9745 Train: 100% | 25/25 [09:48<00:00, 23.52s/train ba Epoch: [4][24/25] Elapsed 9m 48s (remain 0m 0s) Loss: 0.4993 Grad: 6.5906 L train_epoch took 588.0075 seconds. Validation: 11% | 1/9 [01:30<12:00, 90.12s/valid_ba EVAL: [0/9] Elapsed 1m 30s (remain 12m 0s) Loss: 0.8359

Validation: 100%| 25.69s/valid_ba

EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.1009

valid_epoch took 231.1736 seconds.

Epoch 4 - avg_train_loss: 0.4993 avg_val_loss: 1.1009 time: 819s

Train: 4%| | 1/25 [00:08<03:16, 8.19s/train_ba

Epoch: [5][0/25] Elapsed 0m 8s (remain 3m 16s) Loss: 0.2668 Grad: 1.9495 LR

Train: 84%| 21/25 [09:05<01:20, 20.08s/train_ba

Epoch: [5][20/25] Elapsed 9m 5s (remain 1m 43s) Loss: 0.4354 Grad: 3.6939 L

Train: 100%| 23.53s/train_ba

Epoch: [5][24/25] Elapsed 9m 48s (remain 0m 0s) Loss: 0.4602 Grad: 3.3508 L train_epoch took 588.1344 seconds.

Validation: 11%| | 1/9 [01:30<12:01, 90.17s/valid_ba

EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.7376

Validation: 100%| 25.71s/valid_ba

EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0734

valid_epoch took 231.4021 seconds.

Epoch 5 - avg_train_loss: 0.4602 avg_val_loss: 1.0734 time: 820s

Train: 4%| | 1/25 [01:03<25:16, 63.20s/train_ba

Epoch: [6][0/25] Elapsed 1m 3s (remain 25m 16s) Loss: 0.3349 Grad: 4.6870 L

```
Train:
      84%||
                                    21/25 [07:24<01:39, 24.96s/train ba
Epoch: [6][20/25] Elapsed 7m 24s (remain 1m 24s) Loss: 0.4339 Grad: 7.1330
Train: 100%
                             | 25/25 [08:57<00:00, 21.52s/train_ba
Epoch: [6][24/25] Elapsed 8m 57s (remain 0m 0s) Loss: 0.4321 Grad: 5.0121 L
train_epoch took 537.9590 seconds.
Validation: 11%
                                      | 1/9 [01:30<12:01, 90.13s/valid_ba
EVAL: [0/9] Elapsed 1m 30s (remain 12m 1s) Loss: 0.7554
Validation: 100%| 25.72s/valid_ba
EVAL: [8/9] Elapsed 3m 51s (remain 0m 0s) Loss: 1.0976
valid epoch took 231.5240 seconds.
Epoch 6 - avg_train_loss: 0.4321 avg_val_loss: 1.0976 time: 769s
Early stopping triggered at 5 epochs without improvement.
train_loop took 4868.6091 seconds.
get_result took 0.0018 seconds.
get result took 0.0003 seconds.
======= Fold 1 Stage 2 result: 1.251832154335329 =======
Starting Stage 1 Training for Fold 2
Training Stage 1: Using all data
```

/opt/anaconda3/envs/myenv/lib/python3.11/site-packages/torch/amp/grad_scaler

```
warnings.warn(
                                              | 0/26 [00:00<?, ?train batc
Train:
        0%|
 warnings.warn(
                                      | 1/26 [00:11<04:58, 11.96s/train ba
Train:
       4%|
Epoch: [1][0/26] Elapsed 0m 11s (remain 4m 58s) Loss: 1.2622 Grad: 2.6122 L
                                     21/26 [07:49<02:42, 32.58s/train ba
Train:
      81%|
Epoch: [1][20/26] Elapsed 7m 49s (remain 1m 51s) Loss: 1.4124 Grad: 2.8619
                             | 26/26 [10:14<00:00, 23.65s/train_ba
Train: 100%
Epoch: [1][25/26] Elapsed 10m 14s (remain 0m 0s) Loss: 1.4236 Grad: 2.0408
train epoch took 615.0005 seconds.
                                       | 1/9 [00:07<00:56, 7.05s/valid ba
Validation: 11%
EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 1.1946
Validation: 100%
                            9/9 [03:57<00:00, 26.37s/valid ba
EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.2900
valid_epoch took 237.3269 seconds.
Epoch 1 - avg_train_loss: 1.4236 avg_val_loss: 1.2900 time: 852s
Train:
        4%|
                                      | 1/26 [00:08<03:39, 8.79s/train_ba
Epoch: [2][0/26] Elapsed 0m 8s (remain 3m 39s) Loss: 1.4457 Grad: 2.8747 LR
```

| 21/26 [07:59<01:35, 19.09s/train ba

Train: 81%|

Epoch: [2][20/26] Elapsed 7m 59s (remain 1m 54s) Loss: 1.3873 Grad: 3.2172 Train: 100% | 26/26 [10:15<00:00, 23.68s/train_ba Epoch: [2][25/26] Elapsed 10m 15s (remain 0m 0s) Loss: 1.3798 Grad: 2.5005 train_epoch took 615.7134 seconds. Validation: 11% | 1/9 [00:07<00:56, 7.05s/valid_ba EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 1.1604 Validation: 100%| 100%| 9/9 [03:57<00:00, 26.36s/valid_ba EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.2756 valid epoch took 237.2675 seconds. Epoch 2 - avg_train_loss: 1.3798 avg_val_loss: 1.2756 time: 853s | 1/26 [00:17<07:11, 17.27s/train_ba Train: 4%| Epoch: [3][0/26] Elapsed 0m 17s (remain 7m 11s) Loss: 1.3532 Grad: 3.4627 L Train: 81%| | 21/26 [07:10<01:36, 19.28s/train_ba Epoch: [3][20/26] Elapsed 7m 10s (remain 1m 42s) Loss: 1.2890 Grad: 2.2727 Train: 100% | 21.70s/train_ba

Epoch: [3][25/26] Elapsed 9m 24s (remain 0m 0s) Loss: 1.2819 Grad: 3.3028 L

train epoch took 564.1924 seconds.

| 1/9 [00:07<00:56, 7.07s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 1.0740 Validation: 100%| 9/9 [03:57<00:00, 26.39s/valid_ba EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.2288 valid_epoch took 237.4724 seconds. Epoch 3 - avg_train_loss: 1.2819 avg_val_loss: 1.2288 time: 802s Train: 4% | 1/26 [00:10<04:12, 10.09s/train_ba Epoch: [4][0/26] Elapsed 0m 10s (remain 4m 12s) Loss: 1.0507 Grad: 3.0605 L | 21/26 [09:22<01:39, 20.00s/train ba Train: 81% Epoch: [4][20/26] Elapsed 9m 22s (remain 2m 13s) Loss: 1.2068 Grad: 3.7690 Train: 100% | 23.55s/train_ba Epoch: [4][25/26] Elapsed 10m 12s (remain 0m 0s) Loss: 1.1839 Grad: 4.0394 train_epoch took 612.2367 seconds. | 1/9 [00:07<00:56, 7.10s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 1.0049

Validation: 100%| 9/9 [03:57<00:00, 26.38s/valid_ba

EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.1574

valid_epoch took 237.3931 seconds.

Epoch 4 - avg train loss: 1.1839 avg val loss: 1.1574 time: 850s

Train: 4%| | 1/26 [00:54<22:42, 54.50s/train_ba

Epoch: [5][0/26] Elapsed 0m 54s (remain 22m 42s) Loss: 1.2269 Grad: 2.6462

Train: 81%| 21/26 [07:29<01:49, 21.81s/train_ba

Epoch: [5][20/26] Elapsed 7m 29s (remain 1m 46s) Loss: 1.0689 Grad: 2.7762

Train: 100%| 23.23s/train_ba

Epoch: [5][25/26] Elapsed 10m 3s (remain 0m 0s) Loss: 1.0701 Grad: 2.6059 L train_epoch took 603.8782 seconds.

Validation: 11%| | 1/9 [00:07<00:56, 7.06s/valid_ba

EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.9530

Validation: 100%| 9/9 [03:57<00:00, 26.36s/valid_ba

EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.1018

valid_epoch took 237.2417 seconds.

Epoch 5 - avg_train_loss: 1.0701 avg_val_loss: 1.1018 time: 841s

Train: 4%| | 1/26 [00:20<08:43, 20.93s/train_ba

Epoch: [6][0/26] Elapsed 0m 20s (remain 8m 43s) Loss: 0.9585 Grad: 2.5963 L

```
Train: 81%
                                   | 21/26 [07:53<01:55, 23.15s/train ba
Epoch: [6][20/26] Elapsed 7m 53s (remain 1m 52s) Loss: 1.0099 Grad: 3.0898
Train: 100%
                         | 26/26 [10:06<00:00, 23.32s/train_ba
Epoch: [6][25/26] Elapsed 10m 6s (remain 0m 0s) Loss: 0.9769 Grad: 2.3744 L
train_epoch took 606.4171 seconds.
                                    | 1/9 [00:07<00:56, 7.11s/valid_ba
Validation: 11%
EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.8717
Validation: 100%| 26.38s/valid_ba
EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0519
valid epoch took 237.4366 seconds.
Epoch 6 - avg_train_loss: 0.9769 avg_val_loss: 1.0519 time: 844s
Train:
                                    | 1/26 [00:11<04:35, 11.00s/train_ba
       4%
Epoch: [7][0/26] Elapsed 0m 11s (remain 4m 35s) Loss: 0.8954 Grad: 3.0160 L
Train: 81%
                                  | 21/26 [09:14<02:00, 24.12s/train_ba
Epoch: [7][20/26] Elapsed 9m 14s (remain 2m 11s) Loss: 0.8876 Grad: 3.0489
```

Train: 100%| 23.16s/train_ba

Epoch: [7][25/26] Elapsed 10m 2s (remain 0m 0s) Loss: 0.8820 Grad: 3.8694 L train_epoch took 602.1300 seconds.

EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.8333

Validation: 100%| 9/9 [03:57<00:00, 26.34s/valid_ba

EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0245

valid_epoch took 237.0733 seconds.

Epoch 7 - avg_train_loss: 0.8820 avg_val_loss: 1.0245 time: 839s

Train: 4%| | 1/26 [00:22<09:10, 22.04s/train_ba

Epoch: [8][0/26] Elapsed 0m 22s (remain 9m 10s) Loss: 1.0306 Grad: 2.6830 L

Train: 81%| 21/26 [08:11<03:39, 43.92s/train_ba

Epoch: [8][20/26] Elapsed 8m 11s (remain 1m 56s) Loss: 0.8147 Grad: 2.4032

Train: 100%| 23.49s/train_ba

Epoch: [8][25/26] Elapsed 10m 10s (remain 0m 0s) Loss: 0.8184 Grad: 4.2635 train_epoch took 610.6856 seconds.

Validation: 11%| | 1/9 [00:07<00:56, 7.08s/valid_ba

EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.8173

9/9 [03:57<00:00, 26.35s/valid ba Validation: 100% EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0167 valid epoch took 237.1158 seconds. Epoch 8 - avg_train_loss: 0.8184 avg_val_loss: 1.0167 time: 848s | 1/26 [00:23<09:49, 23.57s/train_ba Train: 4%| Epoch: [9][0/26] Elapsed 0m 23s (remain 9m 49s) Loss: 0.7365 Grad: 2.9933 L Train: 81% | 21/26 [09:03<02:17, 27.58s/train_ba Epoch: [9][20/26] Elapsed 9m 3s (remain 2m 9s) Loss: 0.7489 Grad: 3.8321 LR Train: 100% | 23.69s/train_ba Epoch: [9][25/26] Elapsed 10m 15s (remain 0m 0s) Loss: 0.7713 Grad: 4.3908 train epoch took 615.9179 seconds.

| 1/9 [00:07<00:56, 7.08s/valid_ba Validation: 11%

EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7996

Validation: 100% 9/9 [03:57<00:00, 26.36s/valid_ba

EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0163

valid epoch took 237.2010 seconds.

Epoch 9 - avg_train_loss: 0.7713 avg_val_loss: 1.0163 time: 853s

```
Train:
        4%|
                                    | 1/26 [00:07<03:06, 7.46s/train ba
Epoch: [10][0/26] Elapsed 0m 7s (remain 3m 6s) Loss: 0.7071 Grad: 3.8354 LR
Train: 81%
                                    | 21/26 [09:05<01:21, 16.22s/train ba
Epoch: [10][20/26] Elapsed 9m 5s (remain 2m 9s) Loss: 0.7377 Grad: 3.0709 L
Train: 100%| 23.09s/train_ba
Epoch: [10][25/26] Elapsed 10m 0s (remain 0m 0s) Loss: 0.7312 Grad: 3.2132
train_epoch took 600.4101 seconds.
Validation: 11%
                                     | 1/9 [00:07<00:56, 7.07s/valid ba
EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.8114
                           9/9 [03:57<00:00, 26.35s/valid_ba
Validation: 100%
EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0150
valid_epoch took 237.1938 seconds.
Epoch 10 - avg_train_loss: 0.7312 avg_val_loss: 1.0150 time: 838s
Train:
                                    | 1/26 [01:35<39:51, 95.66s/train_ba
        4%
Epoch: [11][0/26] Elapsed 1m 35s (remain 39m 51s) Loss: 0.5357 Grad: 2.5508
      81%|
                                    | 21/26 [08:25<01:08, 13.80s/train ba
Train:
```

Epoch: [11][20/26] Elapsed 8m 25s (remain 2m 0s) Loss: 0.6472 Grad: 3.5057

26/26 [10:11<00:00, 23.51s/train ba Train: 100% Epoch: [11][25/26] Elapsed 10m 11s (remain 0m 0s) Loss: 0.6632 Grad: 3.0698 train epoch took 611.2627 seconds. Validation: 11% | 1/9 [00:07<00:56, 7.10s/valid ba EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7622 9/9 [03:57<00:00, 26.37s/valid_ba Validation: 100% EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0049 valid epoch took 237.3576 seconds. Epoch 11 - avg train loss: 0.6632 avg val loss: 1.0049 time: 849s Train: | 1/26 [01:30<37:43, 90.55s/train_ba 4%|■ Epoch: [12][0/26] Elapsed 1m 30s (remain 37m 43s) Loss: 0.4758 Grad: 3.4338 Train: 81%| 21/26 [08:01<01:39, 19.81s/train_ba Epoch: [12][20/26] Elapsed 8m 1s (remain 1m 54s) Loss: 0.6434 Grad: 4.1200 Train: 100%|| | 26/26 [10:15<00:00, 23.68s/train_ba Epoch: [12][25/26] Elapsed 10m 15s (remain 0m 0s) Loss: 0.6233 Grad: 2.6112 train epoch took 615.6132 seconds.

Validation: 11%

| 1/9 [00:07<00:56, 7.05s/valid ba

EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7529 Validation: 100%| 100%| 9/9 [03:57<00:00, 26.37s/valid_ba EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0085 valid epoch took 237.3705 seconds. Epoch 12 - avg_train_loss: 0.6233 avg_val_loss: 1.0085 time: 853s Train: 4%| | 1/26 [00:14<06:13, 14.92s/train_ba Epoch: [13] [0/26] Elapsed 0m 14s (remain 6m 13s) Loss: 0.5093 Grad: 2.9016 | 21/26 [09:02<02:44, 32.87s/train ba Train: 81% Epoch: [13][20/26] Elapsed 9m 2s (remain 2m 9s) Loss: 0.6262 Grad: 5.2046 L Train: 100% | 23.70s/train_ba Epoch: [13][25/26] Elapsed 10m 16s (remain 0m 0s) Loss: 0.6459 Grad: 4.5728 train_epoch took 616.1525 seconds. | 1/9 [00:07<00:56, 7.11s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7639 Validation: 100%| 9/9 [03:57<00:00, 26.36s/valid_ba

EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0264

valid_epoch took 237.2252 seconds.

```
Epoch 13 - avg train loss: 0.6459 avg val loss: 1.0264 time: 853s
                                    | 1/26 [00:07<03:05, 7.44s/train ba
Train:
        4%|
Epoch: [14] [0/26] Elapsed 0m 7s (remain 3m 5s) Loss: 0.6240 Grad: 2.7231 LR
                                   | 21/26 [09:29<02:52, 34.48s/train ba
Train:
      81%|
Epoch: [14][20/26] Elapsed 9m 29s (remain 2m 15s) Loss: 0.6627 Grad: 3.2009
Train: 100%| 23.63s/train_ba
Epoch: [14][25/26] Elapsed 10m 14s (remain 0m 0s) Loss: 0.6548 Grad: 5.3352
train epoch took 614.4832 seconds.
                                     | 1/9 [00:07<00:56, 7.07s/valid ba
Validation: 11%
EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7492
Validation: 100%| 9/9 [03:57<00:00, 26.37s/valid ba
EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0291
valid_epoch took 237.2994 seconds.
Epoch 14 - avg_train_loss: 0.6548 avg_val_loss: 1.0291 time: 852s
Train:
       4%|
                                    | 1/26 [00:08<03:26, 8.26s/train_ba
Epoch: [15][0/26] Elapsed 0m 8s (remain 3m 26s) Loss: 0.6655 Grad: 4.0483 L
```

Train: 81%

| 21/26 [08:06<01:43, 20.74s/train ba

```
Epoch: [15] [20/26] Elapsed 8m 6s (remain 1m 55s) Loss: 0.5894 Grad: 3.4347
Train: 100%
                                26/26 [09:49<00:00, 22.69s/train_ba
Epoch: [15][25/26] Elapsed 9m 49s (remain 0m 0s) Loss: 0.6020 Grad: 2.4853
train_epoch took 589.8148 seconds.
                                        | 1/9 [00:07<00:56, 7.05s/valid_ba
Validation: 11%
EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7211
Validation: 100%
                               9/9 [03:57<00:00, 26.37s/valid_ba
EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0092
valid epoch took 237.3219 seconds.
Epoch 15 - avg train loss: 0.6020 avg val loss: 1.0092 time: 827s
Early stopping triggered at 14 epochs without improvement.
train_loop took 12654.5369 seconds.
get_result took 0.0018 seconds.
get_result took 0.0003 seconds.
======= Fold 2 Stage 1 result: 1.1740113396528333 ========
Starting Stage 2 Training for Fold 2
Training Stage 2: Filtering data based on KL Loss < 9
/opt/anaconda3/envs/myenv/lib/python3.11/site-packages/torch/amp/grad scaler
 warnings.warn(
Train:
        0%|
                                               | 0/25 [00:00<?, ?train batc
  warnings.warn(
```

```
Train:
        4%
                                    | 1/25 [00:09<03:55, 9.80s/train ba
Epoch: [1][0/25] Elapsed 0m 9s (remain 3m 55s) Loss: 0.5566 Grad: 3.6188 LR
Train: 84%
                                   | 21/25 [06:32<01:42, 25.59s/train ba
Epoch: [1][20/25] Elapsed 6m 32s (remain 1m 14s) Loss: 0.6974 Grad: 3.6193
Train: 100%| 23.26s/train_ba
Epoch: [1][24/25] Elapsed 9m 41s (remain 0m 0s) Loss: 0.6845 Grad: 3.0806 L
train_epoch took 581.5818 seconds.
Validation: 11%
                                     | 1/9 [00:07<00:56, 7.12s/valid ba
EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7661
                           9/9 [03:57<00:00, 26.35s/valid ba
Validation: 100%
EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0008
valid_epoch took 237.1482 seconds.
Epoch 1 - avg_train_loss: 0.6845 avg_val_loss: 1.0008 time: 819s
Train:
                                    | 1/25 [00:07<02:52, 7.19s/train_ba
        4%|
Epoch: [2][0/25] Elapsed 0m 7s (remain 2m 52s) Loss: 0.7376 Grad: 4.7531 LR
      84%
                                    21/25 [07:05<02:47, 41.88s/train ba
Train:
```

Epoch: [2][20/25] Elapsed 7m 5s (remain 1m 20s) Loss: 0.6091 Grad: 3.4120 L

```
25/25 [09:39<00:00, 23.19s/train ba
Train: 100%
Epoch: [2][24/25] Elapsed 9m 39s (remain 0m 0s) Loss: 0.5919 Grad: 3.5401 L
train epoch took 579.6632 seconds.
Validation: 11%
                                       | 1/9 [00:07<00:56, 7.08s/valid ba
EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7641
                            9/9 [03:57<00:00, 26.34s/valid_ba
Validation: 100%
EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 0.9989
valid epoch took 237.0202 seconds.
Epoch 2 - avg train loss: 0.5919 avg val loss: 0.9989 time: 817s
Train:
                                      | 1/25 [00:10<04:04, 10.17s/train_ba
        4%|
Epoch: [3][0/25] Elapsed 0m 10s (remain 4m 4s) Loss: 0.7327 Grad: 4.1959 LR
Train:
      84%
                                     21/25 [07:20<01:05, 16.30s/train_ba
Epoch: [3][20/25] Elapsed 7m 20s (remain 1m 23s) Loss: 0.5733 Grad: 2.7942
Train: 100%||
                             _____| 25/25 [09:34<00:00, 22.99s/train_ba
Epoch: [3][24/25] Elapsed 9m 34s (remain 0m 0s) Loss: 0.5880 Grad: 3.6136 L
train epoch took 574.8769 seconds.
```

| 1/9 [00:07<00:56, 7.10s/valid ba

Validation: 11%

EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7151 Validation: 100%| 100%| 9/9 [03:57<00:00, 26.33s/valid_ba EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0072 valid_epoch took 237.0130 seconds. Epoch 3 - avg_train_loss: 0.5880 avg_val_loss: 1.0072 time: 812s Train: 4%|■ | 1/25 [00:13<05:19, 13.32s/train_ba Epoch: [4][0/25] Elapsed 0m 13s (remain 5m 19s) Loss: 0.3436 Grad: 3.1771 L | 21/25 [08:28<01:06, 16.58s/train ba Train: 84% Epoch: [4][20/25] Elapsed 8m 28s (remain 1m 36s) Loss: 0.5682 Grad: 5.9208 25/25 [09:42<00:00, 23.29s/train_ba Train: 100% Epoch: [4][24/25] Elapsed 9m 42s (remain 0m 0s) Loss: 0.5441 Grad: 2.4112 L train_epoch took 582.1851 seconds. | 1/9 [00:07<00:56, 7.06s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7135 Validation: 100%| 9/9 [03:58<00:00, 26.49s/valid_ba

EVAL: [8/9] Elapsed 3m 58s (remain 0m 0s) Loss: 1.0383

valid_epoch took 238.4150 seconds.

```
Epoch 4 - avg train loss: 0.5441 avg val loss: 1.0383 time: 821s
                                    | 1/25 [00:08<03:32, 8.87s/train ba
Train:
        4%|
Epoch: [5][0/25] Elapsed 0m 8s (remain 3m 32s) Loss: 0.4909 Grad: 4.4146 LR
                                   | 21/25 [08:57<01:25, 21.46s/train ba
Train:
      84%
Epoch: [5][20/25] Elapsed 8m 57s (remain 1m 42s) Loss: 0.4666 Grad: 3.1682
Train: 100%| 23.21s/train_ba
Epoch: [5][24/25] Elapsed 9m 40s (remain 0m 0s) Loss: 0.4659 Grad: 3.5293 L
train epoch took 580.3399 seconds.
Validation: 11%
                                     | 1/9 [00:07<00:56, 7.05s/valid ba
EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7299
Validation: 100%| 9/9 [03:56<00:00, 26.33s/valid ba
EVAL: [8/9] Elapsed 3m 56s (remain 0m 0s) Loss: 1.0200
valid_epoch took 236.9698 seconds.
Epoch 5 - avg_train_loss: 0.4659 avg_val_loss: 1.0200 time: 817s
Train:
      4%|
                                    | 1/25 [00:09<03:41, 9.24s/train ba
Epoch: [6][0/25] Elapsed 0m 9s (remain 3m 41s) Loss: 0.2256 Grad: 1.7309 LR
```

Train: 84%

| 21/25 [07:47<01:37, 24.49s/train ba

```
Epoch: [6][20/25] Elapsed 7m 47s (remain 1m 28s) Loss: 0.4170 Grad: 4.1594
Train: 100%
                                25/25 [09:41<00:00, 23.26s/train_ba
Epoch: [6][24/25] Elapsed 9m 41s (remain 0m 0s) Loss: 0.4437 Grad: 3.5990 L
train_epoch took 581.5484 seconds.
                                        | 1/9 [00:07<00:56, 7.05s/valid_ba
Validation: 11%
EVAL: [0/9] Elapsed 0m 7s (remain 0m 56s) Loss: 0.7484
Validation: 100%
                                9/9 [03:57<00:00, 26.34s/valid_ba
EVAL: [8/9] Elapsed 3m 57s (remain 0m 0s) Loss: 1.0572
valid epoch took 237.0228 seconds.
Epoch 6 - avg train loss: 0.4437 avg val loss: 1.0572 time: 819s
Early stopping triggered at 5 epochs without improvement.
train_loop took 4904.8224 seconds.
get_result took 0.0018 seconds.
get_result took 0.0003 seconds.
======= Fold 2 Stage 2 result: 1.16407226936696 =======
Starting Stage 1 Training for Fold 3
Training Stage 1: Using all data
/opt/anaconda3/envs/myenv/lib/python3.11/site-packages/torch/amp/grad scaler
 warnings.warn(
Train:
                                               | 0/27 [00:00<?, ?train batc
        0%|
 warnings.warn(
```

```
Train:
       4%
                                   | 1/27 [00:08<03:41, 8.51s/train ba
Epoch: [1][0/27] Elapsed 0m 8s (remain 3m 41s) Loss: 1.2258 Grad: 2.1773 LR
Train: 78%
                                  | 21/27 [09:58<01:53, 18.93s/train ba
Epoch: [1][20/27] Elapsed 9m 58s (remain 2m 51s) Loss: 1.3638 Grad: 2.4606
Train: 100%| 25.40s/train_ba
Epoch: [1][26/27] Elapsed 11m 25s (remain 0m 0s) Loss: 1.3666 Grad: 1.8512
train_epoch took 685.7310 seconds.
Validation: 11%
                                    | 1/9 [00:03<00:30, 3.83s/valid ba
EVAL: [0/9] Elapsed 0m 3s (remain 0m 30s) Loss: 1.4391
Validation: 100%
                           EVAL: [8/9] Elapsed 2m 55s (remain 0m 0s) Loss: 1.4768
valid_epoch took 175.0192 seconds.
Epoch 1 - avg_train_loss: 1.3666 avg_val_loss: 1.4768 time: 861s
Train:
                                   | 1/27 [00:26<11:25, 26.35s/train_ba
       4%
Epoch: [2][0/27] Elapsed 0m 26s (remain 11m 25s) Loss: 1.0654 Grad: 2.1900
      78%|
                                  21/27 [07:48<01:59, 19.88s/train ba
Train:
```

Epoch: [2][20/27] Elapsed 7m 48s (remain 2m 13s) Loss: 1.3248 Grad: 2.4736

27/27 [11:24<00:00, 25.37s/train ba Train: 100% Epoch: [2][26/27] Elapsed 11m 24s (remain 0m 0s) Loss: 1.3203 Grad: 2.3782 train epoch took 684.8820 seconds. Validation: 11% | 1/9 [00:03<00:30, 3.82s/valid ba EVAL: [0/9] Elapsed 0m 3s (remain 0m 30s) Loss: 1.4092 Validation: 100% EVAL: [8/9] Elapsed 2m 54s (remain 0m 0s) Loss: 1.4445 valid epoch took 174.7488 seconds. Epoch 2 - avg train loss: 1.3203 avg val loss: 1.4445 time: 860s Train: | 1/27 [00:08<03:40, 8.47s/train ba 4%| Epoch: [3][0/27] Elapsed 0m 8s (remain 3m 40s) Loss: 1.1155 Grad: 1.9930 LR | 21/27 [09:45<02:47, 27.99s/train ba Train: 78%| Epoch: [3][20/27] Elapsed 9m 45s (remain 2m 47s) Loss: 1.2478 Grad: 2.9400 Train: 100%|| _____| 27/27 [11:40<00:00, 25.96s/train_ba Epoch: [3][26/27] Elapsed 11m 40s (remain 0m 0s) Loss: 1.2345 Grad: 1.9056 train epoch took 700.7963 seconds.

| 1/9 [00:04<00:32, 4.09s/valid ba

Validation: 11%

EVAL: [0/9] Elapsed 0m 4s (remain 0m 32s) Loss: 1.2761 Validation: 100%| 100%| 9/9 [02:58<00:00, 19.79s/valid_ba EVAL: [8/9] Elapsed 2m 58s (remain 0m 0s) Loss: 1.3598 valid_epoch took 178.1137 seconds. Epoch 3 - avg_train_loss: 1.2345 avg_val_loss: 1.3598 time: 879s Train: 4%|■ | 1/27 [00:08<03:50, 8.88s/train_ba Epoch: [4][0/27] Elapsed 0m 8s (remain 3m 50s) Loss: 0.9320 Grad: 2.2016 LR | 21/27 [09:52<01:59, 19.84s/train ba Train: 78% Epoch: [4][20/27] Elapsed 9m 52s (remain 2m 49s) Loss: 1.1619 Grad: 2.9606 Train: 100% 27/27 [11:34<00:00, 25.73s/train_ba Epoch: [4][26/27] Elapsed 11m 34s (remain 0m 0s) Loss: 1.1251 Grad: 3.2762 train_epoch took 694.8422 seconds. | 1/9 [00:03<00:31, 3.90s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 3s (remain 0m 31s) Loss: 1.2105 Validation: 100%| 9/9 [02:55<00:00, 19.50s/valid_ba

EVAL: [8/9] Elapsed 2m 55s (remain 0m 0s) Loss: 1.2832

valid_epoch took 175.5358 seconds.

```
Epoch 4 - avg train loss: 1.1251 avg val loss: 1.2832 time: 870s
                                   | 1/27 [02:27<1:03:56, 147.56s/train ba
Train:
        4%|
Epoch: [5][0/27] Elapsed 2m 27s (remain 63m 56s) Loss: 0.9635 Grad: 2.7679
                                     21/27 [08:23<03:52, 38.68s/train ba
Train:
      78%|
Epoch: [5][20/27] Elapsed 8m 23s (remain 2m 23s) Loss: 1.0271 Grad: 2.3466
                        27/27 [11:29<00:00, 25.53s/train_ba
Train: 100%
Epoch: [5][26/27] Elapsed 11m 29s (remain 0m 0s) Loss: 1.0031 Grad: 3.1115
train epoch took 689.4316 seconds.
Validation: 11%
                                       | 1/9 [00:03<00:30, 3.87s/valid ba
EVAL: [0/9] Elapsed 0m 3s (remain 0m 30s) Loss: 1.2069
Validation: 100%
                          9/9 [02:54<00:00, 19.41s/valid ba
EVAL: [8/9] Elapsed 2m 54s (remain 0m 0s) Loss: 1.2388
valid_epoch took 174.7335 seconds.
Epoch 5 - avg_train_loss: 1.0031 avg_val_loss: 1.2388 time: 864s
Train:
        4%|
                                      | 1/27 [00:25<11:13, 25.89s/train_ba
Epoch: [6][0/27] Elapsed 0m 25s (remain 11m 13s) Loss: 0.9775 Grad: 2.6725
```

Train: 78%

| 21/27 [08:44<03:31, 35.19s/train ba

Epoch: [6][20/27] Elapsed 8m 44s (remain 2m 29s) Loss: 0.9098 Grad: 3.9440 Train: 100% 27/27 [11:26<00:00, 25.43s/train_ba Epoch: [6][26/27] Elapsed 11m 26s (remain 0m 0s) Loss: 0.9046 Grad: 3.2372 train_epoch took 686.6481 seconds. Validation: 11% | 1/9 [00:03<00:30, 3.77s/valid_ba EVAL: [0/9] Elapsed 0m 3s (remain 0m 30s) Loss: 1.2115 Validation: 100%| 100%| 19.41s/valid_ba EVAL: [8/9] Elapsed 2m 54s (remain 0m 0s) Loss: 1.1607 valid epoch took 174.7055 seconds. Epoch 6 - avg_train_loss: 0.9046 avg_val_loss: 1.1607 time: 861s | 1/27 [00:25<11:06, 25.62s/train_ba Train: 4%| Epoch: [7][0/27] Elapsed 0m 25s (remain 11m 6s) Loss: 0.7485 Grad: 2.3626 L Train: 78% | 21/27 [09:58<02:56, 29.45s/train_ba Epoch: [7][20/27] Elapsed 9m 58s (remain 2m 51s) Loss: 0.7615 Grad: 6.5665 Train: 100%| 25.45s/train_ba Epoch: [7][26/27] Elapsed 11m 27s (remain 0m 0s) Loss: 0.7736 Grad: 3.9524

train epoch took 687.1457 seconds.

Validation: 11% | 1/9 [00:03<00:30, 3.85s/valid ba EVAL: [0/9] Elapsed 0m 3s (remain 0m 30s) Loss: 1.3231 Validation: 100%| 43s/valid_ba EVAL: [8/9] Elapsed 2m 54s (remain 0m 0s) Loss: 1.1719 valid_epoch took 174.8503 seconds. Epoch 7 - avg_train_loss: 0.7736 avg_val_loss: 1.1719 time: 862s Train: 4% | 1/27 [00:10<04:38, 10.69s/train_ba Epoch: [8][0/27] Elapsed 0m 10s (remain 4m 38s) Loss: 0.8291 Grad: 2.8369 L | 21/27 [09:54<02:16, 22.81s/train ba Train: 78% Epoch: [8][20/27] Elapsed 9m 54s (remain 2m 49s) Loss: 0.7443 Grad: 3.4980 Train: 100%| 27/27 [11:28<00:00, 25.49s/train_ba Epoch: [8][26/27] Elapsed 11m 28s (remain 0m 0s) Loss: 0.7481 Grad: 2.0705 train_epoch took 688.3310 seconds. | 1/9 [00:03<00:31, 3.88s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 3s (remain 0m 31s) Loss: 1.2241

Validation: 100%| 47s/valid_ba

EVAL: [8/9] Elapsed 2m 55s (remain 0m 0s) Loss: 1.1618

valid_epoch took 175.2389 seconds.

Epoch 8 - avg train loss: 0.7481 avg val loss: 1.1618 time: 864s

Train: 4%| | 1/27 [00:08<03:41, 8.54s/train_ba

Epoch: [9][0/27] Elapsed 0m 8s (remain 3m 41s) Loss: 0.6289 Grad: 2.7352 LR

Train: 78%| 21/27 [10:02<02:35, 25.84s/train_ba

Epoch: [9][20/27] Elapsed 10m 2s (remain 2m 52s) Loss: 0.7287 Grad: 2.6575

Train: 100%| 25.42s/train_ba

Epoch: [9][26/27] Elapsed 11m 26s (remain 0m 0s) Loss: 0.7248 Grad: 3.3739 train_epoch took 686.2162 seconds.

EVAL: [0/9] Elapsed 0m 3s (remain 0m 31s) Loss: 1.1849

Validation: 100%| 100%| 9/9 [02:54<00:00, 19.42s/valid_ba

EVAL: [8/9] Elapsed 2m 54s (remain 0m 0s) Loss: 1.1400

valid_epoch took 174.7570 seconds.

Epoch 9 - avg_train_loss: 0.7248 avg_val_loss: 1.1400 time: 861s

Train: 4%| | 1/27 [01:30<39:14, 90.57s/train_ba

Epoch: [10][0/27] Elapsed 1m 30s (remain 39m 14s) Loss: 0.6863 Grad: 3.7450

```
Train:
      78%|
                                   | 21/27 [07:06<01:08, 11.43s/train ba
Epoch: [10][20/27] Elapsed 7m 6s (remain 2m 1s) Loss: 0.6336 Grad: 3.2203 L
Train: 100%| 25.42s/train_ba
Epoch: [10][26/27] Elapsed 11m 26s (remain 0m 0s) Loss: 0.6551 Grad: 3.3054
train_epoch took 686.3678 seconds.
                                    | 1/9 [00:03<00:31, 3.89s/valid_ba
Validation: 11%
EVAL: [0/9] Elapsed 0m 3s (remain 0m 31s) Loss: 1.1241
Validation: 100%| 100%| 9/9 [02:54<00:00, 19.43s/valid_ba
EVAL: [8/9] Elapsed 2m 54s (remain 0m 0s) Loss: 1.1494
valid epoch took 174.8686 seconds.
Epoch 10 - avg_train_loss: 0.6551 avg_val_loss: 1.1494 time: 861s
Train:
                                    | 1/27 [00:11<04:56, 11.39s/train_ba
       4%|
Epoch: [11] [0/27] Elapsed 0m 11s (remain 4m 56s) Loss: 0.7954 Grad: 4.7780
Train: 78%
                                   | 21/27 [10:20<02:03, 20.57s/train_ba
Epoch: [11][20/27] Elapsed 10m 20s (remain 2m 57s) Loss: 0.6514 Grad: 3.5566
```

Train: 100%| 25.36s/train_ba

```
Epoch: [11][26/27] Elapsed 11m 24s (remain 0m 0s) Loss: 0.6545 Grad: 4.3495
train epoch took 684.6309 seconds.
                                        | 1/9 [00:03<00:30, 3.84s/valid ba
Validation: 11%
EVAL: [0/9] Elapsed 0m 3s (remain 0m 30s) Loss: 1.2198
Validation: 100%
                                 9/9 [02:54<00:00, 19.41s/valid_ba
EVAL: [8/9] Elapsed 2m 54s (remain 0m 0s) Loss: 1.1502
valid_epoch took 174.7012 seconds.
Epoch 11 - avg_train_loss: 0.6545 avg_val_loss: 1.1502 time: 859s
Early stopping triggered at 10 epochs without improvement.
train_loop took 9503.5504 seconds.
get result took 0.0018 seconds.
get result took 0.0003 seconds.
====== Fold 3 Stage 1 result: 1.3382047760292197 =======
Starting Stage 2 Training for Fold 3
Training Stage 2: Filtering data based on KL Loss < 9
/opt/anaconda3/envs/myenv/lib/python3.11/site-packages/torch/amp/grad_scaler
  warnings.warn(
Train:
         0%|
                                               | 0/25 [00:00<?, ?train_batc
 warnings.warn(
Train:
      4%|
                                       | 1/25 [00:11<04:47, 11.96s/train_ba
Epoch: [1][0/25] Elapsed 0m 11s (remain 4m 47s) Loss: 0.5816 Grad: 2.5870 L
```

21/25 [10:26<03:08, 47.24s/train ba

Train: 84%

Epoch: [1][20/25] Elapsed 10m 26s (remain 1m 59s) Loss: 0.6724 Grad: 4.2521 Train: 100% 25/25 [11:10<00:00, 26.83s/train_ba Epoch: [1][24/25] Elapsed 11m 10s (remain 0m 0s) Loss: 0.6611 Grad: 3.8444 train_epoch took 670.7317 seconds. Validation: 11% | 1/9 [00:03<00:30, 3.85s/valid_ba EVAL: [0/9] Elapsed 0m 3s (remain 0m 30s) Loss: 1.1106 Validation: 100%| 100%| 19.44s/valid_ba EVAL: [8/9] Elapsed 2m 54s (remain 0m 0s) Loss: 1.1560 valid epoch took 174.9272 seconds. Epoch 1 - avg_train_loss: 0.6611 avg_val_loss: 1.1560 time: 846s | 1/25 [00:13<05:19, 13.29s/train_ba Train: 4%| Epoch: [2][0/25] Elapsed 0m 13s (remain 5m 19s) Loss: 0.4434 Grad: 1.9202 L Train: 84% | 21/25 [10:24<02:02, 30.68s/train_ba Epoch: [2][20/25] Elapsed 10m 24s (remain 1m 59s) Loss: 0.5994 Grad: 2.9423 Train: 100% | 27.18s/train_ba Epoch: [2][24/25] Elapsed 11m 19s (remain 0m 0s) Loss: 0.5996 Grad: 2.6553 train epoch took 679.4581 seconds.

Validation: 11% | 1/9 [00:03<00:31, 3.97s/valid ba EVAL: [0/9] Elapsed 0m 3s (remain 0m 31s) Loss: 1.0424 Validation: 100%| 100%| 9/9 [02:55<00:00, 19.54s/valid_ba EVAL: [8/9] Elapsed 2m 55s (remain 0m 0s) Loss: 1.1636 valid_epoch took 175.8371 seconds. Epoch 2 - avg_train_loss: 0.5996 avg_val_loss: 1.1636 time: 855s Train: 4% | 1/25 [00:07<03:11, 8.00s/train_ba Epoch: [3][0/25] Elapsed 0m 7s (remain 3m 11s) Loss: 0.3621 Grad: 3.1818 LR Train: 84% | 21/25 [08:03<01:10, 17.63s/train ba Epoch: [3][20/25] Elapsed 8m 3s (remain 1m 32s) Loss: 0.5802 Grad: 4.0230 L Train: 100% | 25/25 [11:00<00:00, 26.42s/train_ba Epoch: [3][24/25] Elapsed 11m 0s (remain 0m 0s) Loss: 0.6158 Grad: 4.7840 L train_epoch took 660.5254 seconds. | 1/9 [00:03<00:31, 3.94s/valid_ba Validation: 11% EVAL: [0/9] Elapsed 0m 3s (remain 0m 31s) Loss: 1.2980

Validation: 100%| 100%| 9/9 [02:55<00:00, 19.52s/valid_ba

EVAL: [8/9] Elapsed 2m 55s (remain 0m 0s) Loss: 1.1251

valid_epoch took 175.7075 seconds.

Epoch 3 - avg_train_loss: 0.6158 avg_val_loss: 1.1251 time: 836s

Train: 4%| | 1/25 [00:08<03:16, 8.17s/train_ba

Epoch: [4][0/25] Elapsed 0m 8s (remain 3m 16s) Loss: 0.6261 Grad: 3.2917 LR

Train: 84%| 21/25 [10:09<01:26, 21.72s/train_ba

Epoch: [4][20/25] Elapsed 10m 9s (remain 1m 56s) Loss: 0.4593 Grad: 2.2523

Train: 100%| 25/25 [11:10<00:00, 26.83s/train_ba

Epoch: [4][24/25] Elapsed 11m 10s (remain 0m 0s) Loss: 0.4789 Grad: 3.6552 train_epoch took 670.7896 seconds.

Validation: 11%| | 1/9 [00:03<00:30, 3.84s/valid_ba

EVAL: [0/9] Elapsed 0m 3s (remain 0m 30s) Loss: 0.9722

Validation: 100%| 9/9 [02:55<00:00, 19.49s/valid_ba

EVAL: [8/9] Elapsed 2m 55s (remain 0m 0s) Loss: 1.1881

valid_epoch took 175.4069 seconds.

Epoch 4 - avg_train_loss: 0.4789 avg_val_loss: 1.1881 time: 846s

Train: 4%| | 1/25 [00:08<03:33, 8.91s/train_ba

Epoch: [5][0/25] Elapsed 0m 8s (remain 3m 33s) Loss: 0.5843 Grad: 4.9719 LR

```
Train: 84%
                                  | 21/25 [07:56<01:50, 27.67s/train ba
Epoch: [5][20/25] Elapsed 7m 56s (remain 1m 30s) Loss: 0.5069 Grad: 5.0968
Train: 100% | 27.79s/train_ba
Epoch: [5][24/25] Elapsed 11m 34s (remain 0m 0s) Loss: 0.4844 Grad: 2.2097
train_epoch took 694.8448 seconds.
                                    | 1/9 [00:04<00:33, 4.19s/valid_ba
Validation: 11%
EVAL: [0/9] Elapsed 0m 4s (remain 0m 33s) Loss: 1.1410
Validation: 100%| 100%| 9/9 [02:59<00:00, 19.90s/valid_ba
EVAL: [8/9] Elapsed 2m 59s (remain 0m 0s) Loss: 1.1689
valid epoch took 179.1185 seconds.
Epoch 5 - avg_train_loss: 0.4844 avg_val_loss: 1.1689 time: 874s
Train:
                                   | 1/25 [00:15<06:20, 15.85s/train_ba
       4%|
Epoch: [6][0/25] Elapsed 0m 15s (remain 6m 20s) Loss: 0.4115 Grad: 2.3254 L
| 21/25 [10:21<02:55, 43.89s/train_ba
Epoch: [6][20/25] Elapsed 10m 21s (remain 1m 58s) Loss: 0.4383 Grad: 4.1395
```

Train: 100%| 27.55s/train_ba

Epoch: [6][24/25] Elapsed 11m 28s (remain 0m 0s) Loss: 0.4259 Grad: 3.7884 train_epoch took 688.6849 seconds.

EVAL: [0/9] Elapsed 0m 4s (remain 0m 33s) Loss: 1.4032

Validation: 100%| 9/9 [02:59<00:00, 19.91s/valid_ba

EVAL: [8/9] Elapsed 2m 59s (remain 0m 0s) Loss: 1.2365

valid_epoch took 179.2121 seconds.

Epoch 6 - avg_train_loss: 0.4259 avg_val_loss: 1.2365 time: 868s

Early stopping triggered at 5 epochs without improvement.

train_loop took 5126.3617 seconds.

get_result took 0.0016 seconds.

get_result took 0.0003 seconds.

====== Fold 3 Stage 2 result: 1.3233752799339686 =======

get_result took 0.0005 seconds.

====== CV: 1.2527229396406405 =======