

```
In [1]: #!/ default_exp models.nhits
```

```
In [10]: #!/ hide
%load_ext autoreload
%autoreload 2
```

# NHITS

Long-horizon forecasting is challenging because of the *volatility* of the predictions and the *computational complexity*. To solve this problem we created the Neural Hierarchical Interpolation for Time Series (NHITS). NHITS builds upon NBEATS and specializes its partial outputs in the different frequencies of the time series through hierarchical interpolation and multi-rate input processing. On the long-horizon forecasting task NHITS improved accuracy by 25% on AAI's best paper award the Informer, while being 50x faster.

The model is composed of several MLPs with ReLU non-linearities. Blocks are connected via doubly residual stacking principle with the backcast  $\mathbf{\tilde{y}}_{t-L:t,l}$  and forecast  $\mathbf{\hat{y}}_{t+1:t+H,l}$  outputs of the  $l$ -th block. Multi-rate input pooling, hierarchical interpolation and backcast residual connections together induce the specialization of the additive predictions in different signal bands, reducing memory footprint and computational time, thus improving the architecture parsimony and accuracy.

## References

- Boris N. Oreshkin, Dmitri Carpov, Nicolas Chapados, Yoshua Bengio (2019). "N-BEATS: Neural basis expansion analysis for interpretable time series forecasting".
- Cristian Challu, Kin G. Olivares, Boris N. Oreshkin, Federico Garza, Max Mergenthaler-Canseco, Artur Dubrawski (2023). "NHITS: Neural Hierarchical Interpolation for Time Series Forecasting". Accepted at the Thirty-Seventh AAI Conference on Artificial Intelligence.
- Zhou, H.; Zhang, S.; Peng, J.; Zhang, S.; Li, J.; Xiong, H.; and Zhang, W. (2020). "Informer: Beyond Efficient Transformer for Long Sequence Time-Series Forecasting". Association for the Advancement of Artificial Intelligence Conference 2021 (AAAI 2021).

 Figure 1. Neural Hierarchical Interpolation for Time Series (NHITS).

```
In [11]: #!/ hide
import os
os.environ["PYTORCH_ENABLE_MPS_FALLBACK"] = "1"
os.environ["CUDA_VISIBLE_DEVICES"] = "0"
```

```
In [12]: #!/ export
from typing import Tuple, Optional

import numpy as np
import torch
import torch.nn as nn
import torch.nn.functional as F

from neuralforecast.losses.pytorch import MAE
from neuralforecast.common._base_windows import BaseWindows
```

```
In [13]: #!/ hide
from fastcore.test import test_eq
from nbdev.showdoc import show_doc
from neuralforecast.utils import generate_series
```

```
In [14]: #!/ hide
import logging
import warnings

logging.getLogger("pytorch_lightning").setLevel(logging.ERROR)
warnings.filterwarnings("ignore")

import matplotlib.pyplot as plt

#plt.rcParams["axes.grid"]=True
plt.rcParams['font.family'] = 'serif'
#plt.rcParams["figure.figsize"] = (4,2)
```

```
In [15]: #!/ export
class _IdentityBasis(nn.Module):
    def __init__(self, backcast_size: int, forecast_size: int,
                interpolation_mode: str, out_features: int=1):
        super().__init__()
        assert (interpolation_mode in ['linear', 'nearest']) or ('cubic' in i
        self.forecast_size = forecast_size
        self.backcast_size = backcast_size
        self.interpolation_mode = interpolation_mode
        self.out_features = out_features

    def forward(self, theta: torch.Tensor) -> Tuple[torch.Tensor, torch.Tens

        backcast = theta[:, :self.backcast_size]
        knots = theta[:, self.backcast_size:]

        # Interpolation is performed on default dim=-1 := H
        knots = knots.reshape(len(knots), self.out_features, -1)
        if self.interpolation_mode in ['nearest', 'linear']:
            #knots = knots[:,None,:]
            forecast = F.interpolate(knots, size=self.forecast_size, mode=se
            #forecast = forecast[:,0,:]
        elif 'cubic' in self.interpolation_mode:
            if self.out_features>1:
                raise Exception('Cubic interpolation not available with mult
```

```

        batch_size = len(backcast)
        knots = knots[:,None,:,:]
        forecast = torch.zeros((len(knots), self.forecast_size)).to(knots)
        n_batches = int(np.ceil(len(knots)/batch_size))
        for i in range(n_batches):
            forecast_i = F.interpolate(knots[i*batch_size:(i+1)*batch_size],
                                      size=self.forecast_size, mode='bilinear')
            forecast[i*batch_size:(i+1)*batch_size] += forecast_i[:,0,0,:]
        forecast = forecast[:,None,:] # [B,H] -> [B,None,H]

        # [B,Q,H] -> [B,H,Q]
        forecast = forecast.permute(0, 2, 1)
        return backcast, forecast

```

```

In [16]: #/ export_i
ACTIVATIONS = ['ReLU',
               'Softplus',
               'Tanh',
               'SELU',
               'LeakyReLU',
               'PReLU',
               'Sigmoid']

POOLING = ['MaxPool1d',
           'AvgPool1d']

class NHITSBlock(nn.Module):
    """
    NHITS block which takes a basis function as an argument.
    """
    def __init__(self,
                  input_size: int,
                  h: int,
                  n_theta: int,
                  mlp_units: list,
                  basis: nn.Module,
                  futr_input_size: int,
                  hist_input_size: int,
                  stat_input_size: int,
                  n_pool_kernel_size: int,
                  pooling_mode: str,
                  dropout_prob: float,
                  activation: str):
        super().__init__()

        pooled_hist_size = int(np.ceil(input_size/n_pool_kernel_size))
        pooled_futr_size = int(np.ceil((input_size+h)/n_pool_kernel_size))

        input_size = pooled_hist_size + \
                      hist_input_size * pooled_hist_size + \
                      futr_input_size * pooled_futr_size + stat_input_size

        self.dropout_prob = dropout_prob
        self.futr_input_size = futr_input_size
        self.hist_input_size = hist_input_size
        self.stat_input_size = stat_input_size

```

```

assert activation in ACTIVATIONS, f'{activation} is not in {ACTIVATIONS}'
assert pooling_mode in POOLING, f'{pooling_mode} is not in {POOLING}'

activ = getattr(nn, activation)()

self.pooling_layer = getattr(nn, pooling_mode)(kernel_size=n_pool_kernel_size,
                                                stride=n_pool_kernel_size)

# Block MLPs
hidden_layers = [nn.Linear(in_features=input_size,
                             out_features=mlp_units[0][0])]
for layer in mlp_units:
    hidden_layers.append(nn.Linear(in_features=layer[0],
                                    out_features=layer[1]))
    hidden_layers.append(activ)

    if self.dropout_prob>0:
        #raise NotImplementedError('dropout')
        hidden_layers.append(nn.Dropout(p=self.dropout_prob))

output_layer = [nn.Linear(in_features=mlp_units[-1][1], out_features=1)]
layers = hidden_layers + output_layer
self.layers = nn.Sequential(*layers)
self.basis = basis

def forward(self, insample_y: torch.Tensor, futr_exog: torch.Tensor,
            hist_exog: torch.Tensor, stat_exog: torch.Tensor) -> Tuple[torch.Tensor, torch.Tensor, torch.Tensor]

# Pooling
# Pool1d needs 3D input, (B,C,L), adding C dimension
insample_y = insample_y.unsqueeze(1)
insample_y = self.pooling_layer(insample_y)
insample_y = insample_y.squeeze(1)

# Flatten MLP inputs [B, L+H, C] -> [B, (L+H)*C]
# Contatenate [ Y_t, | X_{t-L},..., X_{t} | F_{t-L},..., F_{t+H} | S_{t-L},..., S_{t+H} ]
batch_size = len(insample_y)
if self.hist_input_size > 0:
    hist_exog = hist_exog.permute(0,2,1) # [B, L, C] -> [B, C, L]
    hist_exog = self.pooling_layer(hist_exog)
    hist_exog = hist_exog.permute(0,2,1) # [B, C, L] -> [B, L, C]
    insample_y = torch.cat(( insample_y, hist_exog.reshape(batch_size, self.hist_input_size)))

if self.futr_input_size > 0:
    futr_exog = futr_exog.permute(0,2,1) # [B, L, C] -> [B, C, L]
    futr_exog = self.pooling_layer(futr_exog)
    futr_exog = futr_exog.permute(0,2,1) # [B, C, L] -> [B, L, C]
    insample_y = torch.cat(( insample_y, futr_exog.reshape(batch_size, self.futr_input_size)))

if self.stat_input_size > 0:
    insample_y = torch.cat(( insample_y, stat_exog.reshape(batch_size, self.stat_input_size)))

# Compute local projection weights and projection
theta = self.layers(insample_y)

```

```

        backcast, forecast = self.basis(theta)
        return backcast, forecast

```

In [17]: `#!/ export`

```

class NHITS(BaseWindows):
    """ NHITS

```

The Neural Hierarchical Interpolation for Time Series (NHITS), is an MLP neural architecture with backward and forward residual links. NHITS tackle memory complexity challenges, by locally specializing its sequential pre the signals frequencies with hierarchical interpolation and pooling.

**\*\*Parameters:\*\***<br>

``h``: int, Forecast horizon. <br>

``input_size``: int, autorregresive inputs size, `y=[1,2,3,4]` `input_size=2`

``stat_exog_list``: str list, static exogenous columns.<br>

``hist_exog_list``: str list, historic exogenous columns.<br>

``futr_exog_list``: str list, future exogenous columns.<br>

``exclude_insample_y``: bool=False, the model skips the autoregressive fea

``activation``: str, activation from ['ReLU', 'Softplus', 'Tanh', 'SELU',

``stack_types``: List[str], stacks list in the form `N * ['identity']`, to b

``n_blocks``: List[int], Number of blocks for each stack. Note that `len(n_`

``mlp_units``: List[List[int]], Structure of hidden layers for each stack

``n_freq_downsample``: List[int], list with the stack's coefficients (inve

``interpolation_mode``: str='linear', interpolation basis from ['linear',

``n_pool_kernel_size``: List[int], list with the size of the windows to ta

``pooling_mode``: str, input pooling module from ['MaxPoolld', 'AvgPoolld'

``dropout_prob_theta``: float, Float between (0, 1). Dropout for NHITS bas

``loss``: PyTorch module, instantiated train loss class from [losses colle

``valid_loss``: PyTorch module=``loss``, instantiated valid loss class from

``max_steps``: int=1000, maximum number of training steps.<br>

``learning_rate``: float=1e-3, Learning rate between (0, 1).<br>

``num_lr_decays``: int=-1, Number of learning rate decays, evenly distribu

``early_stop_patience_steps``: int=-1, Number of validation iterations bef

``val_check_steps``: int=100, Number of training steps between every valid

``batch_size``: int=32, number of different series in each batch.<br>

``valid_batch_size``: int=None, number of different series in each validat

``windows_batch_size``: int=1024, number of windows to sample in each trai

``inference_windows_batch_size``: int=-1, number of windows to sample in e

``start_padding_enabled``: bool=False, if True, the model will pad the tim

``step_size``: int=1, step size between each window of temporal data.<br>

``scaler_type``: str='identity', type of scaler for temporal inputs normal

``random_seed``: int, random\_seed for pytorch initializer and numpy genera

``num_workers_loader``: int=os.cpu\_count(), workers to be used by ``TimeSer`

``drop_last_loader``: bool=False, if True ``TimeSeriesDataLoader`` drops las

``alias``: str, optional, Custom name of the model.<br>

**\*\*trainer\_kwargs`**: int, keyword trainer arguments inherited from [PyTo

**\*\*References:\*\***<br>

-[Cristian Challu, Kin G. Olivares, Boris N. Oreshkin, Federico Garza, Max Mergenthaler-Canseco, Artur Dubrawski (2023). "NHITS: Neural Hierarc Accepted at the Thirty-Seventh AAAI Conference on Artificial Intelligence  
 """

*# Class attributes*

`SAMPLING_TYPE` = 'windows'

```

def __init__(self,
             h,
             input_size,
             futr_exog_list = None,
             hist_exog_list = None,
             stat_exog_list = None,
             exclude_insample_y = False,
             stack_types: list = ['identity', 'identity', 'identity'],
             n_blocks: list = [1, 1, 1],
             mlp_units: list = 3 * [[512, 512]],
             n_pool_kernel_size: list = [2, 2, 1],
             n_freq_downsample: list = [4, 2, 1],
             pooling_mode: str = 'MaxPool1d',
             interpolation_mode: str = 'linear',
             dropout_prob_theta = 0.,
             activation = 'ReLU',
             loss = MAE(),
             valid_loss = None,
             max_steps: int = 1000,
             learning_rate: float = 1e-3,
             num_lr_decays: int = 3,
             early_stop_patience_steps: int = -1,
             val_check_steps: int = 100,
             batch_size: int = 32,
             valid_batch_size: Optional[int] = None,
             windows_batch_size: int = 1024,
             inference_windows_batch_size: int = -1,
             start_padding_enabled = False,
             step_size: int = 1,
             scaler_type: str = 'identity',
             random_seed: int = 1,
             num_workers_loader = 0,
             drop_last_loader = False,
             **trainer_kwargs):

    # Inherit BaseWindows class
    super(NHITS, self).__init__(h=h,
                                input_size=input_size,
                                futr_exog_list=futr_exog_list,
                                hist_exog_list=hist_exog_list,
                                stat_exog_list=stat_exog_list,
                                exclude_insample_y = exclude_insample_y,
                                loss=loss,
                                valid_loss=valid_loss,
                                max_steps=max_steps,
                                learning_rate=learning_rate,
                                num_lr_decays=num_lr_decays,
                                early_stop_patience_steps=early_stop_pat
                                val_check_steps=val_check_steps,
                                batch_size=batch_size,
                                windows_batch_size=windows_batch_size,
                                valid_batch_size=valid_batch_size,
                                inference_windows_batch_size=inference_w
                                start_padding_enabled=start_padding_enab
                                step_size=step_size,
                                scaler_type=scaler_type,

```

```

num_workers_loader=num_workers_loader,
drop_last_loader=drop_last_loader,
random_seed=random_seed,
**trainer_kwargs)

# Architecture
self.futr_input_size = len(self.futr_exog_list)
self.hist_input_size = len(self.hist_exog_list)
self.stat_input_size = len(self.stat_exog_list)

blocks = self.create_stack(h=h,
                            input_size=input_size,
                            stack_types=stack_types,
                            futr_input_size=self.futr_input_size,
                            hist_input_size=self.hist_input_size,
                            stat_input_size=self.stat_input_size,
                            n_blocks=n_blocks,
                            mlp_units=mlp_units,
                            n_pool_kernel_size=n_pool_kernel_size,
                            n_freq_downsample=n_freq_downsample,
                            pooling_mode=pooling_mode,
                            interpolation_mode=interpolation_mode,
                            dropout_prob_theta=dropout_prob_theta,
                            activation=activation)

self.blocks = torch.nn.ModuleList(blocks)

def create_stack(self,
                 h,
                 input_size,
                 stack_types,
                 n_blocks,
                 mlp_units,
                 n_pool_kernel_size,
                 n_freq_downsample,
                 pooling_mode,
                 interpolation_mode,
                 dropout_prob_theta,
                 activation,
                 futr_input_size, hist_input_size, stat_input_size):

    block_list = []
    for i in range(len(stack_types)):
        for block_id in range(n_blocks[i]):

            assert stack_types[i] == 'identity', f'Block type {stack_type

            n_theta = (input_size + self.loss.outputsize_multiplier*max(
            basis = _IdentityBasis(backcast_size=input_size, forecast_si
                                out_features=self.loss.outputsize_mul
                                interpolation_mode=interpolation_mode

            nbeats_block = NHITSBlock(h=h,
                                      input_size=input_size,
                                      futr_input_size=futr_input_size,
                                      hist_input_size=hist_input_size,
                                      stat_input_size=stat_input_size,

```

```

        n_theta=n_theta,
        mlp_units=mlp_units,
        n_pool_kernel_size=n_pool_kernel_size,
        pooling_mode=pooling_mode,
        basis=basis,
        dropout_prob=dropout_prob_theta,
        activation=activation)

    # Select type of evaluation and apply it to all layers of block
    block_list.append(nbeats_block)

    return block_list

def forward(self, windows_batch):

    # Parse windows_batch
    insample_y = windows_batch['insample_y']
    insample_mask = windows_batch['insample_mask']
    futr_exog = windows_batch['futr_exog']
    hist_exog = windows_batch['hist_exog']
    stat_exog = windows_batch['stat_exog']

    # insample
    residuals = insample_y.flip(dims=(-1,)) #backcast init
    insample_mask = insample_mask.flip(dims=(-1,))

    forecast = insample_y[:, -1:, None] # Level with Naive1
    block_forecasts = [ forecast.repeat(1, self.h, 1) ]
    for i, block in enumerate(self.blocks):
        backcast, block_forecast = block(insample_y=residuals, futr_exog=futr_exog,
                                         hist_exog=hist_exog, stat_exog=stat_exog)
        residuals = (residuals - backcast) * insample_mask
        forecast = forecast + block_forecast

        if self.decompose_forecast:
            block_forecasts.append(block_forecast)

    # Adapting output's domain
    forecast = self.loss.domain_map(forecast)

    if self.decompose_forecast:
        # (n_batch, n_blocks, h, output_size)
        block_forecasts = torch.stack(block_forecasts)
        block_forecasts = block_forecasts.permute(1,0,2,3)
        block_forecasts = block_forecasts.squeeze(-1) # univariate output
        return block_forecasts
    else:
        return forecast

```

In [8]: show\_doc(NHITS)



## NHITS

```

NHITS (h, input_size, futr_exog_list=None, hist_exog_list
=None,
      stat_exog_list=None, exclude_insample_y=False,
      stack_types:list=['identity', 'identity', 'identit
y'],
      n_blocks:list=[1, 1, 1], mlp_units:list=[[512, 51
2], [512, 512]], n_pool_kernel_size:list=[2, 2, 1],
      n_freq_downsample:list=[4, 2, 1], pooling_mode:str
='MaxPool1d',
      interpolation_mode:str='linear', dropout_prob_thet
a=0.0,
      activation='ReLU', loss=MAE(), valid_loss=None,
      max_steps:int=1000, learning_rate:float=0.001,
      num_lr_decays:int=3, early_stop_patience_steps:int
=-1,
      val_check_steps:int=100, batch_size:int=32,
      valid_batch_size:Optional[int]=None, windows_batch
_size:int=1024,
      inference_windows_batch_size:int=-1, start_padding
_enabled=False,
      step_size:int=1, scaler_type:str='identity', randon
m_seed:int=1,
      num_workers_loader=0, drop_last_loader=False, **tr
ainer_kwargs)

```

## NHITS

The Neural Hierarchical Interpolation for Time Series (NHITS), is an MLP-based deep neural architecture with backward and forward residual links. NHITS tackles volatility and memory complexity challenges, by locally specializing its sequential predictions into the signals frequencies with hierarchical interpolation and pooling.

### Parameters:

`h` : int, Forecast horizon.

`input_size` : int, autorregressive inputs size, `y=[1,2,3,4]` `input_size=2` -> `y[t-2:t]=[1,2]`.

`stat_exog_list` : str list, static exogenous columns.

`hist_exog_list` : str list, historic exogenous columns.

`futr_exog_list` : str list, future exogenous columns.

`exclude_insample_y` : bool=False, the model skips the autoregressive features  $y[t-input\_size:t]$  if True.

`activation` : str, activation from ['ReLU', 'Softplus', 'Tanh', 'SELU', 'LeakyReLU', 'PReLU', 'Sigmoid'].

`stack_types` : List[str], stacks list in the form  $N * ['identity']$ , to be deprecated in favor of `n_stacks`. Note that  $len(stack\_types)=len(n\_freq\_downsample)=len(n\_pool\_kernel\_size)$ .

`n_blocks` : List[int], Number of blocks for each stack. Note that  $len(n\_blocks) = len(stack\_types)$ .

`mlp_units` : List[List[int]], Structure of hidden layers for each stack type. Each internal list should contain the number of units of each hidden layer. Note that  $len(n\_hidden) = len(stack\_types)$ .

`n_freq_downsample` : List[int], list with the stack's coefficients (inverse expressivity ratios). Note that  $len(stack\_types)=len(n\_freq\_downsample)=len(n\_pool\_kernel\_size)$ .

`interpolation_mode` : str='linear', interpolation basis from ['linear', 'nearest', 'cubic'].

`n_pool_kernel_size` : List[int], list with the size of the windows to take a max/avg over. Note that  $len(stack\_types)=len(n\_freq\_downsample)=len(n\_pool\_kernel\_size)$ .

`pooling_mode` : str, input pooling module from ['MaxPool1d', 'AvgPool1d'].

`dropout_prob_theta` : float, Float between (0, 1). Dropout for NHITS basis.

`loss` : PyTorch module, instantiated train loss class from [losses collection](#).

`valid_loss` : PyTorch module=`loss`, instantiated valid loss class from [losses collection](#).

`max_steps` : int=1000, maximum number of training steps.

`learning_rate` : float=1e-3, Learning rate between (0, 1).

`num_lr_decays` : int=-1, Number of learning rate decays, evenly distributed across max\_steps.

`early_stop_patience_steps` : int=-1, Number of validation iterations before early stopping.

`val_check_steps` : int=100, Number of training steps between every validation loss check.

`batch_size` : int=32, number of different series in each batch.

`valid_batch_size` : int=None, number of different series in each validation and test batch, if None uses batch\_size.

`windows_batch_size` : int=1024, number of windows to sample in each training batch, default uses all.

`inference_windows_batch_size` : int=-1, number of windows to sample in each inference batch, -1 uses all.

`start_padding_enabled` : bool=False, if True, the model will pad the time series

with zeros at the beginning, by input size.

`step_size` : int=1, step size between each window of temporal data.

`scaler_type` : str='identity', type of scaler for temporal inputs normalization see [temporal scalers](#).

`random_seed` : int, random\_seed for pytorch initializer and numpy generators.

`num_workers_loader` : int=os.cpu\_count(), workers to be used by `TimeSeriesDataLoader` .

`drop_last_loader` : bool=False, if True `TimeSeriesDataLoader` drops last non-full batch.

`alias` : str, optional, Custom name of the model.

`**trainer_kwargs` : int, keyword trainer arguments inherited from [PyTorch Lightning's trainer](#).

### References:

-Cristian Challu, Kin G. Olivares, Boris N. Oreshkin, Federico Garza, Max Mergenthaler-Canseco, Artur Dubrawski (2023). "NHITS: Neural Hierarchical Interpolation for Time Series Forecasting". Accepted at the Thirty-Seventh AAAI Conference on Artificial Intelligence.

```
In [11]: show_doc(NHITS.fit, name='NHITS.fit')
```

Out[11]:

## NHITS.fit

```
NHITS.fit (dataset, val_size=0, test_size=0, random_seed=
None)
```

Fit.

The `fit` method, optimizes the neural network's weights using the initialization parameters (`learning_rate`, `windows_batch_size`, ...) and the `loss` function as defined during the initialization. Within `fit` we use a PyTorch Lightning `Trainer` that inherits the initialization's `self.trainer_kwargs`, to customize its inputs, see [PL's trainer arguments](#).

The method is designed to be compatible with SKLearn-like classes and in particular to be compatible with the StatsForecast library.

By default the `model` is not saving training checkpoints to protect disk memory, to get them change `enable_checkpointing=True` in `__init__`.

### Parameters:

`dataset` : NeuralForecast's `TimeSeriesDataset`, see [documentation](#).

`val_size` : int, validation size for temporal cross-validation.

`random_seed` : int=None, random\_seed for pytorch initializer and numpy generators, overwrites model.`init`'s.

`test_size` : int, test size for temporal cross-validation.

```
In [12]: show_doc(NHITS.predict, name='NHITS.predict')
```

Out[12]:

## NHITS.predict

```
NHITS.predict (dataset, test_size=None, step_size=1, random_seed=None,
               **data_module_kwargs)
```

Predict.

Neural network prediction with PL's `Trainer` execution of `predict_step`.

### Parameters:

`dataset` : NeuralForecast's `TimeSeriesDataset`, see [documentation](#).  
`test_size` : int=None, test size for temporal cross-validation.  
`step_size` : int=1, Step size between each window.  
`random_seed` : int=None, random\_seed for pytorch initializer and numpy generators, overwrites model.`init`'s.  
`**data_module_kwargs` : PL's `TimeSeriesDataModule` args, see [documentation](#).

```
In [13]: #!/ hide
import logging
import warnings
logging.getLogger("pytorch_lightning").setLevel(logging.ERROR)
warnings.filterwarnings("ignore")
```

```
In [14]: #!/ hide
import pandas as pd
import matplotlib.pyplot as plt

import pytorch_lightning as pl

from neuralforecast.utils import AirPassengersDF as Y_df
from neuralforecast.tsdataset import TimeSeriesDataset, TimeSeriesLoader

Y_train_df = Y_df[Y_df.ds<Y_df['ds'].values[-24]] # 132 train
Y_test_df = Y_df[Y_df.ds>=Y_df['ds'].values[-24]] # 12 test

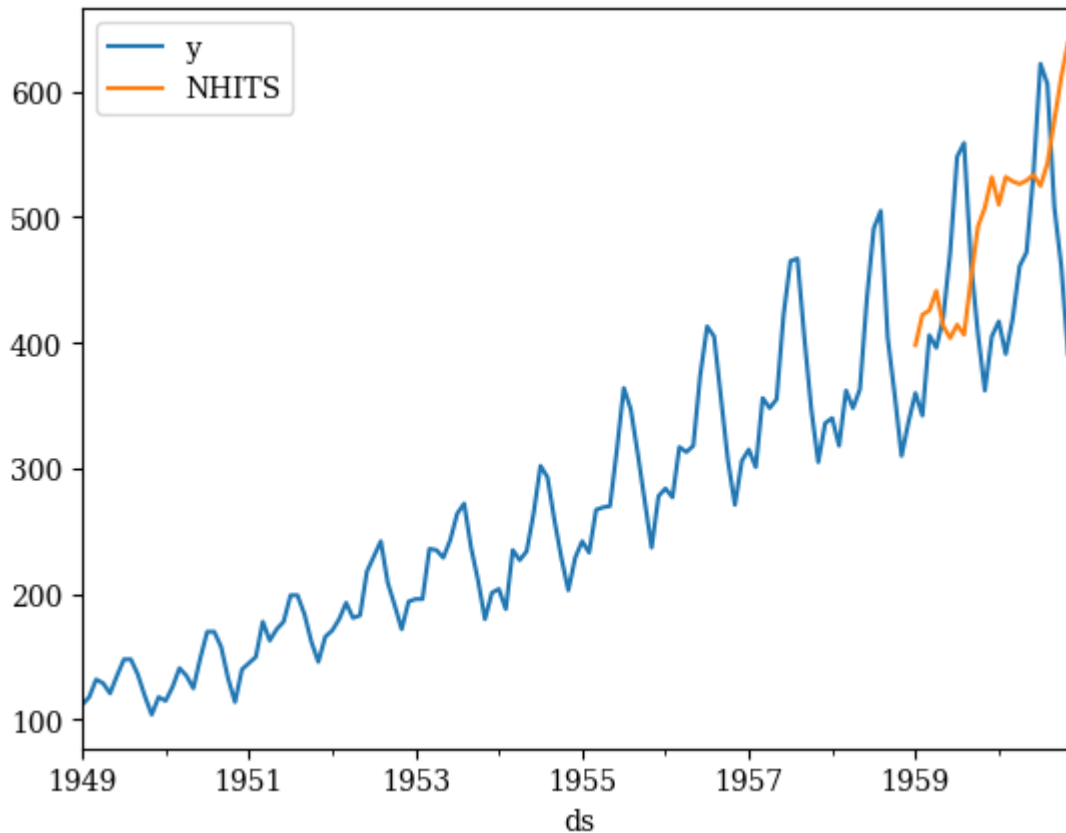
dataset, *_ = TimeSeriesDataset.from_df(df = Y_train_df)
model = NHITS(h=24,
              input_size=24*2,
              max_steps=1,
              windows_batch_size=None,
              n_freq_downsample=[12,4,1],
              pooling_mode='MaxPool1d')
model.fit(dataset=dataset)
y_hat = model.predict(dataset=dataset)
Y_test_df['NHITS'] = y_hat

pd.concat([Y_train_df, Y_test_df]).drop('unique_id', axis=1).set_index('ds')
```

```
Seed set to 1
2023-11-02 17:57:13.906713: I tensorflow/core/util/port.cc:111] oneDNN custom operations are on. You may see slightly different numerical results due to floating-point round-off errors from different computation orders. To turn them off, set the environment variable `TF_ENABLE_ONEDNN_OPTS=0`.
2023-11-02 17:57:14.034658: I tensorflow/tsl/cuda/cudart_stub.cc:28] Could not find cuda drivers on your machine, GPU will not be used.
2023-11-02 17:57:14.550773: E tensorflow/compiler/xla/stream_executor/cuda/cuda_dnn.cc:9342] Unable to register cuDNN factory: Attempting to register factory for plugin cuDNN when one has already been registered
2023-11-02 17:57:14.550840: E tensorflow/compiler/xla/stream_executor/cuda/cuda_fft.cc:609] Unable to register cuFFT factory: Attempting to register factory for plugin cuFFT when one has already been registered
2023-11-02 17:57:14.554706: E tensorflow/compiler/xla/stream_executor/cuda/cuda_blas.cc:1518] Unable to register cuBLAS factory: Attempting to register factory for plugin cuBLAS when one has already been registered
2023-11-02 17:57:14.901983: I tensorflow/core/platform/cpu_feature_guard.cc:182] This TensorFlow binary is optimized to use available CPU instructions in performance-critical operations.
To enable the following instructions: AVX2 AVX_VNNI FMA, in other operations, rebuild TensorFlow with the appropriate compiler flags.
2023-11-02 17:57:17.367922: W tensorflow/compiler/tf2tensorrt/utils/py_utils.cc:38] TF-TRT Warning: Could not find TensorRT
```

```
Sanity Checking: |
| 0/? [00:00...]
Training: |
| 0/? [00:00...]
Validation: |
| 0/? [00:00...]
Predicting: |
| 0/? [00:00...]
```

```
Out[14]: <Axes: xlabel='ds'>
```



```
In [15]: #!/ hide
# qualitative decomposition evaluation
y_hat = model.decompose(dataset=dataset)

fig, ax = plt.subplots(5, 1, figsize=(10, 15))

ax[0].plot(Y_test_df['y'].values, label='True', color="#9C9DB2", linewidth=4)
ax[0].plot(y_hat.sum(axis=1).flatten(), label='Forecast', color="#7B3841")
ax[0].legend(prop={'size': 20})
for label in (ax[0].get_xticklabels() + ax[0].get_yticklabels()):
    label.set_fontsize(18)
ax[0].set_ylabel('y', fontsize=20)

ax[1].plot(y_hat[0,0], label='level', color="#7B3841")
ax[1].set_ylabel('Level', fontsize=20)

ax[2].plot(y_hat[0,1], label='stack1', color="#7B3841")
ax[2].set_ylabel('Stack 1', fontsize=20)

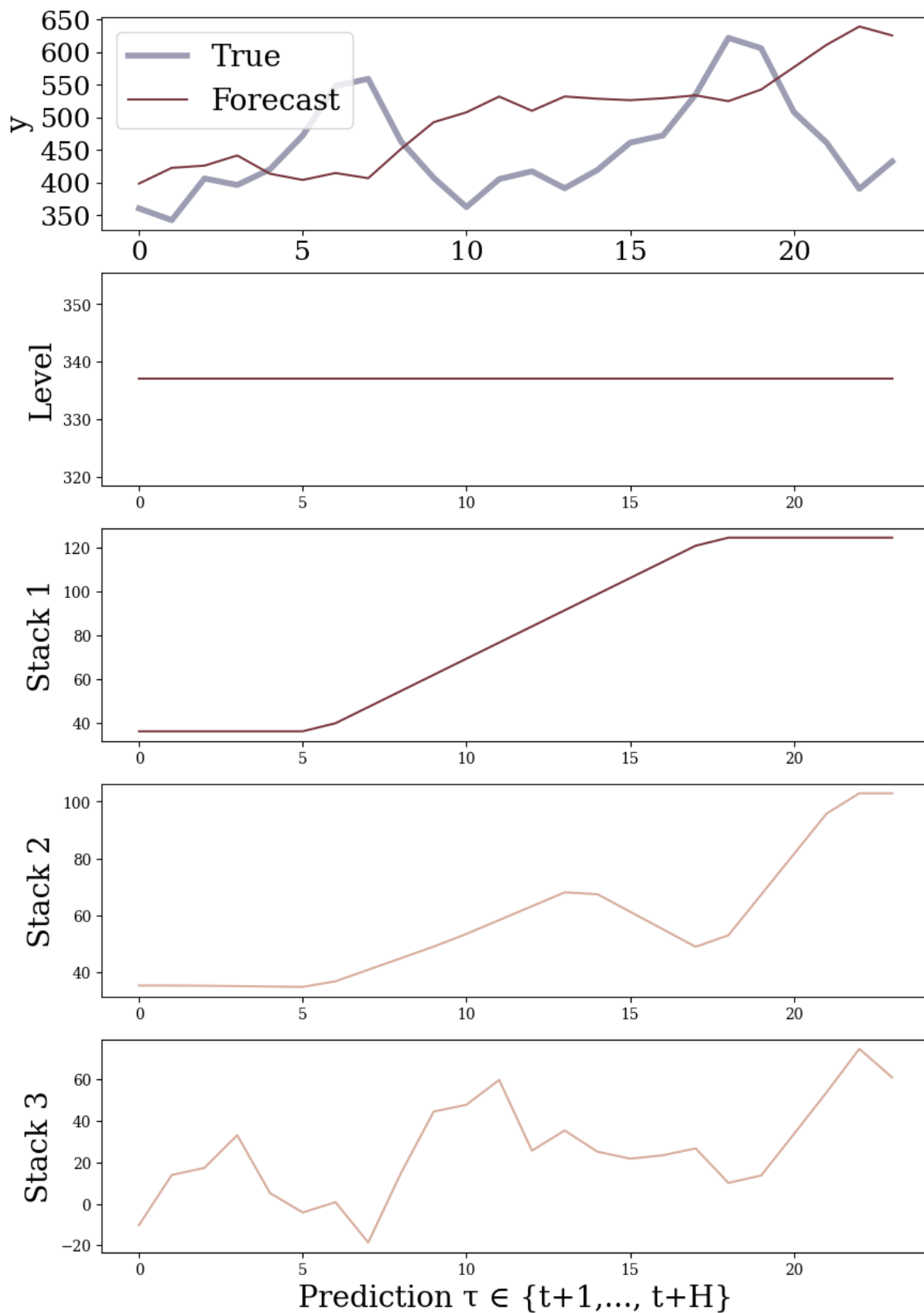
ax[3].plot(y_hat[0,2], label='stack2', color="#D9AE9E")
ax[3].set_ylabel('Stack 2', fontsize=20)

ax[4].plot(y_hat[0,3], label='stack3', color="#D9AE9E")
ax[4].set_ylabel('Stack 3', fontsize=20)

ax[4].set_xlabel('Prediction \u03C4+1,..., \u03C4+H', fontsize=20)
```

Predicting: |  
| 0/? [00:00...

Out[15]: Text(0.5, 0, 'Prediction  $\tau \in \{t+1, \dots, t+H\}$ ')



## Usage Example



```

In [16]: #!/ eval: false
import numpy as np
import pandas as pd
import pytorch_lightning as pl
import matplotlib.pyplot as plt

from neuralforecast import NeuralForecast
from neuralforecast.models import NHITS
from neuralforecast.losses.pytorch import MQLoss, DistributionLoss, PMM, GMM
from neuralforecast.tsdataset import TimeSeriesDataset
from neuralforecast.utils import AirPassengers, AirPassengersPanel, AirPassengersStatic

Y_train_df = AirPassengersPanel[AirPassengersPanel.ds<AirPassengersPanel['ds']
Y_test_df = AirPassengersPanel[AirPassengersPanel.ds>=AirPassengersPanel['ds']

model = NHITS(h=12,
               input_size=24,
               loss=DistributionLoss(distribution='StudentT', level=[80, 90],
                                     #loss=DistributionLoss(distribution='Normal', level=[80, 90],
                                     #loss=DistributionLoss(distribution='Poisson', level=[80, 90],
                                     #loss=DistributionLoss(distribution='Tweedie', level=[80, 90],
                                     #loss=DistributionLoss(distribution='NegativeBinomial', level=[80, 90],
                                     #loss=NBMM(n_components=2, level=[80, 90]),
                                     #loss=GMM(n_components=2, level=[80, 90]),
                                     #loss=PMM(n_components=1, level=[80, 90]),
               stat_exog_list=['airline1'],
               futr_exog_list=['trend'],
               n_freq_downsample=[2, 1, 1],
               scaler_type='robust',
               max_steps=200,
               early_stop_patience_steps=2,
               inference_windows_batch_size=1,
               val_check_steps=10,
               learning_rate=1e-3)

fcst = NeuralForecast(models=[model], freq='M')
fcst.fit(df=Y_train_df, static_df=AirPassengersStatic, val_size=12)
forecasts = fcst.predict(futr_df=Y_test_df)

# Plot quantile predictions
Y_hat_df = forecasts.reset_index(drop=False).drop(columns=['unique_id', 'ds'])
plot_df = pd.concat([Y_test_df, Y_hat_df], axis=1)
plot_df = pd.concat([Y_train_df, plot_df])

plot_df = plot_df[plot_df.unique_id=='Airline1'].drop('unique_id', axis=1)
plt.plot(plot_df['ds'], plot_df['y'], c='black', label='True')
plt.plot(plot_df['ds'], plot_df['NHITS-median'], c='blue', label='median')
plt.fill_between(x=plot_df['ds'][-12:],
                 y1=plot_df['NHITS-lo-90'][-12:].values,
                 y2=plot_df['NHITS-hi-90'][-12:].values,
                 alpha=0.4, label='level 90')

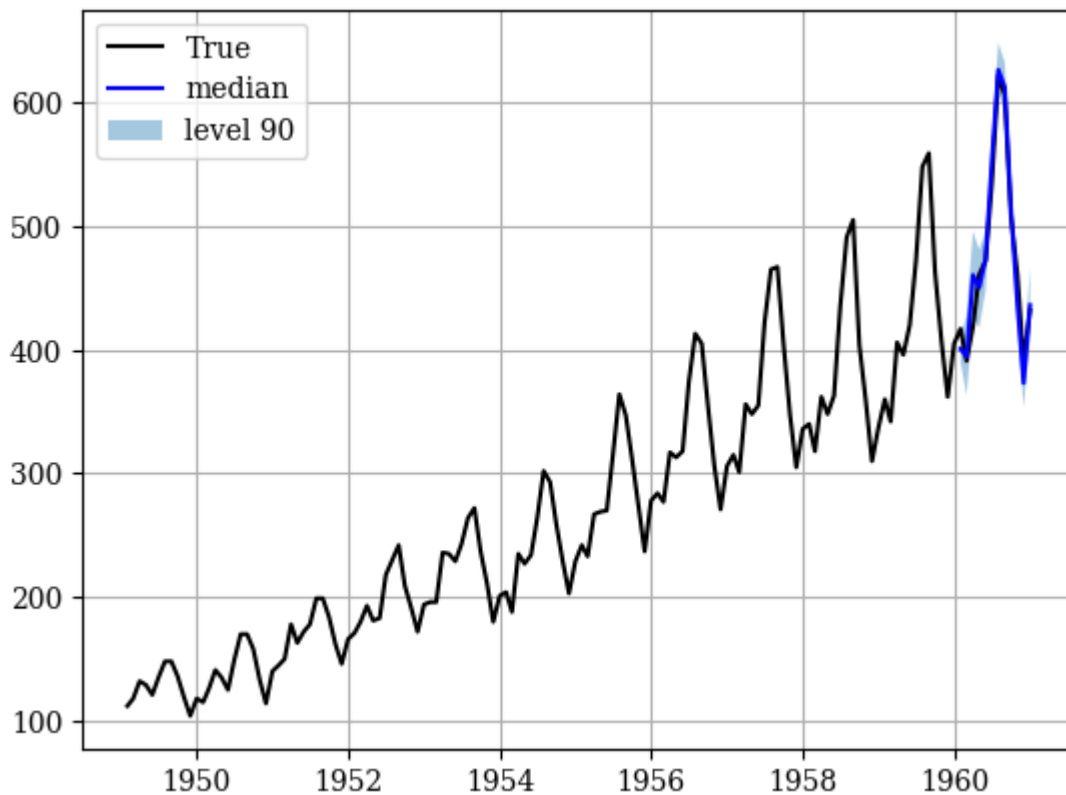
plt.legend()
plt.grid()
plt.plot()

```

Seed set to 1

```
Sanity Checking: |  
| 0/? [00:00...  
Training: |  
| 0/? [00:00...  
Validation: |  
| 0/? [00:00...  
Validation: |  
| 0/? [00:00...  
Validation: |  
| 0/? [00:00...  
Validation: |  
| 0/? [00:00...  
Validation: |  
| 0/? [00:00...  
Predicting: |  
| 0/? [00:00...
```

Out[16]: []



```
In [17]: from neuralforecast.losses.numpy import mae, mse
```

```
y_true = Y_test_df.y.values  
y_hat = Y_hat_df['NHITS-median'].values
```

```
print('MAE: ', mae(y_hat, y_true))  
print('MSE: ', mse(y_hat, y_true))
```

MAE: 12.984341939290365

MSE: 284.7534357710586

```

In [18]: #!/ eval: false
import numpy as np
import pandas as pd
import torch_lightning as pl
import matplotlib.pyplot as plt

from neuralforecast import NeuralForecast
from neuralforecast.models import NHITS
from neuralforecast.losses.pytorch import DistributionLoss, HuberLoss, MAE
from neuralforecast.tsdataset import TimeSeriesDataset
from neuralforecast.utils import AirPassengers, AirPassengersPanel, AirPassengersStatic

#AirPassengersPanel['y'] = 1 * (AirPassengersPanel['trend'] % 12) < 2
Y_train_df = AirPassengersPanel[AirPassengersPanel.ds<AirPassengersPanel.ds]
Y_test_df = AirPassengersPanel[AirPassengersPanel.ds>=AirPassengersPanel.ds]

model = NHITS(h=12,
              input_size=24,
              #loss=DistributionLoss(distribution='StudentT', level=[80, 90])
              loss=HuberLoss(delta=0.5),
              valid_loss=MAE(),
              stat_exog_list=['airline1'],
              scaler_type='robust',
              max_steps=200,
              early_stop_patience_steps=2,
              val_check_steps=10,
              learning_rate=1e-3)

fcst = NeuralForecast(models=[model], freq='M')
fcst.fit(df=Y_train_df, static_df=AirPassengersStatic, val_size=12)
forecasts = fcst.predict(futr_df=Y_test_df)

# Plot quantile predictions
Y_hat_df = forecasts.reset_index(drop=False).drop(columns=['unique_id', 'ds'])
plot_df = pd.concat([Y_test_df, Y_hat_df], axis=1)
plot_df = pd.concat([Y_train_df, plot_df])

plot_df = plot_df[plot_df.unique_id=='Airline1'].drop('unique_id', axis=1)
plt.plot(plot_df['ds'], plot_df['y'], c='black', label='True')
plt.plot(plot_df['ds'], plot_df['NHITS'], c='blue', label='median')
# plt.plot(plot_df['ds'], plot_df['NHITS-median'], c='blue', label='median')
# plt.fill_between(x=plot_df['ds'][-12:],
#                  y1=plot_df['NHITS-lo-90'][-12:].values,
#                  y2=plot_df['NHITS-hi-90'][-12:].values,
#                  alpha=0.4, label='level 90')
plt.legend()
plt.grid()
plt.plot()

```

Seed set to 1

Sanity Checking: |

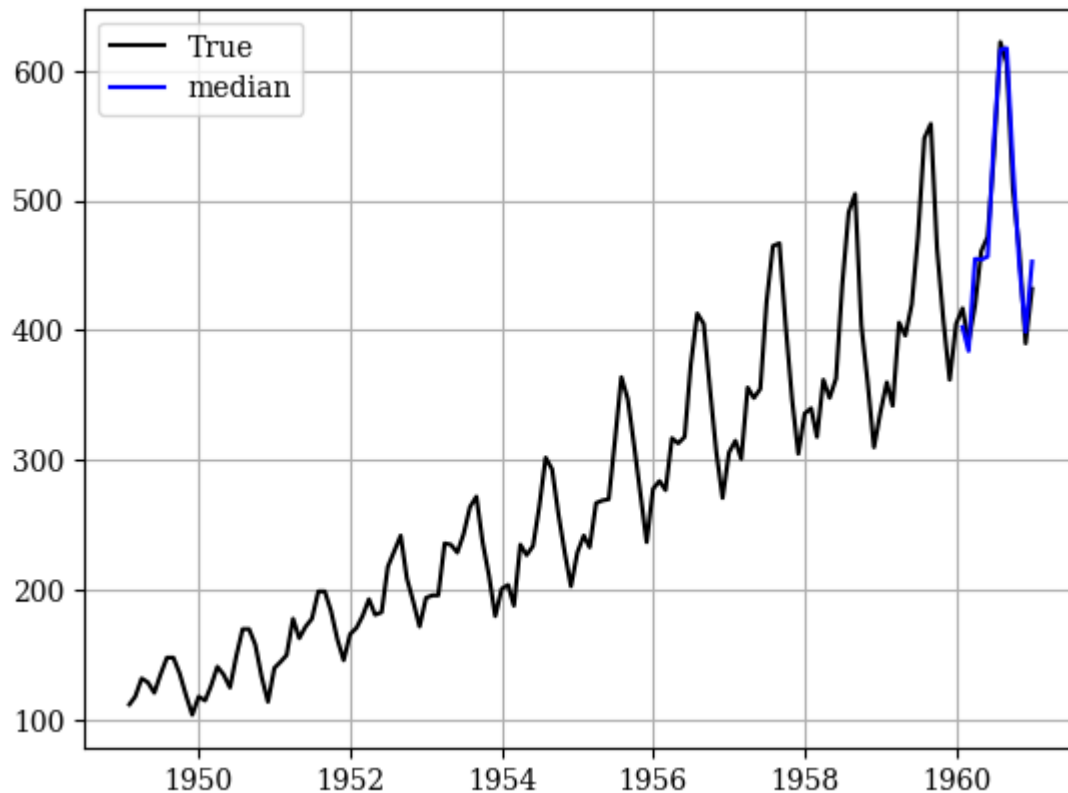
| 0/? [00:00...

Training: |

| 0/? [00:00...

```
Validation: |  
| 0/? [00:00...  
Validation: |  
| 0/? [00:00...  
Validation: |  
| 0/? [00:00...  
Predicting: |  
| 0/? [00:00...
```

Out[18]: []



```
In [19]: from neuralforecast.losses.numpy import mae, mse
```

```
y_true = Y_test_df.y.values  
y_hat = Y_hat_df['NHITS'].values  
  
print('MAE: ', mae(y_hat, y_true))  
print('MSE: ', mse(y_hat, y_true))
```

MAE: 14.19897206624349

MSE: 270.2152161945899

## AutoNHITS Implementation

### Exchange rate

```
In [1]: from ray import tune  
import pandas as pd
```

```
from neuralforecast.core import NeuralForecast
from neuralforecast.auto import AutoNHITS
```

```
In [2]: Y_df = pd.read_csv("raw_data/df_Exchange.csv")

Y_df['ds'] = pd.to_datetime(Y_df['ds'])

# For this excercise we are going to take 20% of the DataSet
n_time = len(Y_df.ds.unique())
val_size = int(.1 * n_time)
test_size = int(.2 * n_time)

Y_df.groupby('unique_id').head(2)
```

```
Out[2]:
```

	unique_id	ds	y
<b>0</b>	0	1990-01-01	0.606785
<b>1</b>	0	1990-01-02	0.570900
<b>7588</b>	1	1990-01-01	-0.361671
<b>7589</b>	1	1990-01-02	-0.367639
<b>15176</b>	2	1990-01-01	0.735367
<b>15177</b>	2	1990-01-02	0.729629
<b>22764</b>	3	1990-01-01	-1.164373
<b>22765</b>	3	1990-01-02	-1.170907
<b>30352</b>	4	1990-01-01	2.851890
<b>30353</b>	4	1990-01-02	2.851890
<b>37940</b>	5	1990-01-01	-1.861369
<b>37941</b>	5	1990-01-02	-1.838665
<b>45528</b>	6	1990-01-01	-1.820047
<b>45529</b>	6	1990-01-02	-1.847258
<b>53116</b>	OT	1990-01-01	-0.124081
<b>53117</b>	OT	1990-01-02	-0.113588

```
In [3]: horizon = 96 # 24hrs = 4 * 15 min.

# Use your own config or AutoNHITS.default_config
nhits_config = {
    "learning_rate": tune.choice([1e-3]),
    "max_steps": tune.choice([100]),
    "input_size": tune.choice([5 * horizon]),
    "batch_size": tune.choice([8]),
    "windows_batch_size": tune.choice([256]),
    "n_pool_kernel_size": tune.choice([[2, 2, 2], [16, 8, 1]]),
    "n_freq_downsample": tune.choice([[168, 24, 1], [24, 12, 1], [1, 1, 1]]),
    "activation": tune.choice(['ReLU']),
```

```

    "n_blocks": tune.choice([[1, 1, 1]]),
    "mlp_units": tune.choice([[512, 512], [512, 512], [512, 512]]),
    "interpolation_mode": tune.choice(['linear']),
    "val_check_steps": tune.choice([10]),
    "random_seed": tune.randint(1, 10),
}

```

```

In [4]: models = [AutoNHITS(h=horizon,
                           config=nhits_config,
                           num_samples=5)]

```

```

In [5]: nf = NeuralForecast(
        models=models,
        freq='D')

Y_hat_df = nf.cross_validation(df=Y_df, val_size=val_size,
                              test_size=test_size, n_windows=None)

```

```

(_train_tune pid=6155) Seed set to 6
(_train_tune pid=6155) 2023-11-04 14:21:28.456271: I tensorflow/core/util/port.cc:111] oneDNN custom operations are on. You may see slightly different numerical results due to floating-point round-off errors from different computation orders. To turn them off, set the environment variable `TF_ENABLE_ONEDNN_OPTS=0`.
(_train_tune pid=6155) 2023-11-04 14:21:28.458635: I tensorflow/tsl/cuda/cudart_stub.cc:28] Could not find cuda drivers on your machine, GPU will not be used.
(_train_tune pid=6155) 2023-11-04 14:21:28.494230: E tensorflow/compiler/xla/stream_executor/cuda/cuda_dnn.cc:9342] Unable to register cuDNN factory: Attempting to register factory for plugin cuDNN when one has already been registered
(_train_tune pid=6155) 2023-11-04 14:21:28.494266: E tensorflow/compiler/xla/stream_executor/cuda/cuda_fft.cc:609] Unable to register cuFFT factory: Attempting to register factory for plugin cuFFT when one has already been registered
(_train_tune pid=6155) 2023-11-04 14:21:28.494295: E tensorflow/compiler/xla/stream_executor/cuda/cuda_blas.cc:1518] Unable to register cuBLAS factory: Attempting to register factory for plugin cuBLAS when one has already been registered
(_train_tune pid=6155) 2023-11-04 14:21:28.502893: I tensorflow/core/platform/cpu_feature_guard.cc:182] This TensorFlow binary is optimized to use available CPU instructions in performance-critical operations.
(_train_tune pid=6155) To enable the following instructions: AVX2 AVX_VNNI FMA, in other operations, rebuild TensorFlow with the appropriate compiler flags.
(_train_tune pid=6155) 2023-11-04 14:21:29.276967: W tensorflow/compiler/tf2tensorrt/utils/py_utils.cc:38] TF-TRT Warning: Could not find TensorRT

```

```

Sanity Checking DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
Sanity Checking DataLoader 0: 100%|████████| 1/1 [00:00<00:00, 3.56it/s]
Epoch 0: 0%|          | 0/1 [00:00<?, ?it/s]
Epoch 1: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.205, train_loss_epoch=0.205]
Epoch 1: 100%|████████| 1/1 [00:00<00:00, 10.63it/s, v_num=0, train_loss_step=0.232, train_loss_epoch=0.205]
Epoch 2: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.232, train_loss_epoch=0.232]
Epoch 3: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.235, train_loss_epoch=0.235]
Epoch 4: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207]
Epoch 5: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207]
Epoch 6: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.228, train_loss_epoch=0.228]
Epoch 7: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.248, train_loss_epoch=0.248]
Epoch 8: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.217, train_loss_epoch=0.217]
Epoch 9: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207]
Epoch 9: 100%|████████| 1/1 [00:00<00:00, 9.96it/s, v_num=0, train_loss_step=0.229, train_loss_epoch=0.207]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|████████| 1/1 [00:00<00:00, 3.74it/s]
Epoch 10: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.229, train_loss_epoch=0.229, valid_loss=0.264]
Epoch 11: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207, valid_loss=0.264]
Epoch 12: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.204, valid_loss=0.264]
Epoch 13: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.228, train_loss_epoch=0.228, valid_loss=0.264]
Epoch 14: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.249, train_loss_epoch=0.249, valid_loss=0.264]
Epoch 15: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207, valid_loss=0.264]
Epoch 16: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.184, train_loss_epoch=0.184, valid_loss=0.264]
Epoch 17: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.206, train_loss_epoch=0.206, valid_loss=0.264]
Epoch 18: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.200, train_loss_epoch=0.200, valid_loss=0.264]
Epoch 19: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.218, train_loss_epoch=0.218, valid_loss=0.264]
Epoch 19: 100%|████████| 1/1 [00:00<00:00, 7.69it/s, v_num=0, train_loss_step=0.205, train_loss_epoch=0.218, valid_loss=0.264]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)

```

```

Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 3.43it/s]
Epoch 20: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.205, train_loss_epoch=0.205, valid_loss=0.298]
Epoch 21: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.211, train_loss_epoch=0.211, valid_loss=0.298]
Epoch 22: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.215, train_loss_epoch=0.215, valid_loss=0.298]
Epoch 23: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.213, train_loss_epoch=0.213, valid_loss=0.298]
Epoch 24: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.208, train_loss_epoch=0.208, valid_loss=0.298]
Epoch 25: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214, valid_loss=0.298]
Epoch 26: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.215, train_loss_epoch=0.215, valid_loss=0.298]
Epoch 27: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207, valid_loss=0.298]
Epoch 28: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.201, train_loss_epoch=0.201, valid_loss=0.298]
Epoch 29: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.222, train_loss_epoch=0.222, valid_loss=0.298]
Epoch 29: 100%|██████████| 1/1 [00:00<00:00, 9.48it/s, v_num=0, train_loss_step=0.222, train_loss_epoch=0.222, valid_loss=0.298]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 3.52it/s]
Epoch 30: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.222, train_loss_epoch=0.222, valid_loss=0.360]
Epoch 31: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.215, train_loss_epoch=0.215, valid_loss=0.360]
Epoch 32: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.205, train_loss_epoch=0.205, valid_loss=0.360]
Epoch 33: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207, valid_loss=0.360]
Epoch 34: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.226, train_loss_epoch=0.226, valid_loss=0.360]
Epoch 35: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207, valid_loss=0.360]
Epoch 36: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.198, train_loss_epoch=0.198, valid_loss=0.360]
Epoch 37: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.206, train_loss_epoch=0.206, valid_loss=0.360]
Epoch 38: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.211, train_loss_epoch=0.211, valid_loss=0.360]
Epoch 39: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.208, train_loss_epoch=0.208, valid_loss=0.360]
Epoch 39: 100%|██████████| 1/1 [00:00<00:00, 5.96it/s, v_num=0, train_loss_step=0.193, train_loss_epoch=0.208, valid_loss=0.360]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 3.19it/s]
Epoch 40: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1

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93, train_loss_epoch=0.193, valid_loss=0.266]
Epoch 41: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
07, train_loss_epoch=0.207, valid_loss=0.266]
Epoch 42: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211, valid_loss=0.266]
Epoch 43: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205, valid_loss=0.266]
Epoch 44: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195, valid_loss=0.266]
Epoch 45: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197, valid_loss=0.266]
Epoch 46: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
16, train_loss_epoch=0.216, valid_loss=0.266]
Epoch 47: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192, valid_loss=0.266]
Epoch 48: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211, valid_loss=0.266]
Epoch 49: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
16, train_loss_epoch=0.216, valid_loss=0.266]
Epoch 49: 100%|██████████| 1/1 [00:00<00:00, 7.50it/s, v_num=0, train_loss_
step=0.199, train_loss_epoch=0.216, valid_loss=0.266]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 2.88it/s]
Epoch 50: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.272]
Epoch 51: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197, valid_loss=0.272]
Epoch 52: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.272]
Epoch 53: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197, valid_loss=0.272]
Epoch 54: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.272]
Epoch 55: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209, valid_loss=0.272]
Epoch 56: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195, valid_loss=0.272]
Epoch 57: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205, valid_loss=0.272]
Epoch 58: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
16, train_loss_epoch=0.216, valid_loss=0.272]
Epoch 59: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198, valid_loss=0.272]
Epoch 59: 100%|██████████| 1/1 [00:00<00:00, 8.26it/s, v_num=0, train_loss_
step=0.199, train_loss_epoch=0.198, valid_loss=0.272]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 3.13it/s]
Epoch 60: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.305]
Epoch 61: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2

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01, train_loss_epoch=0.201, valid_loss=0.305]
Epoch 62: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
86, train_loss_epoch=0.186, valid_loss=0.305]
Epoch 63: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197, valid_loss=0.305]
Epoch 64: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195, valid_loss=0.305]
Epoch 65: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.305]
Epoch 66: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200, valid_loss=0.305]
Epoch 67: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196, valid_loss=0.305]
Epoch 68: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
35, train_loss_epoch=0.235, valid_loss=0.305]
Epoch 69: 100%|██████████| 1/1 [00:00<00:00, 13.34it/s, v_num=0, train_loss_
step=0.183, train_loss_epoch=0.193, valid_loss=0.305]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.84it/s]
Epoch 70: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
83, train_loss_epoch=0.183, valid_loss=0.277]
Epoch 71: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
93, train_loss_epoch=0.193, valid_loss=0.277]
Epoch 72: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194, valid_loss=0.277]
Epoch 73: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
93, train_loss_epoch=0.193, valid_loss=0.277]
Epoch 74: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
86, train_loss_epoch=0.186, valid_loss=0.277]
Epoch 76: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
22, train_loss_epoch=0.222, valid_loss=0.277]
Epoch 77: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209, valid_loss=0.277]
Epoch 78: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
07, train_loss_epoch=0.207, valid_loss=0.277]
Epoch 79: 100%|██████████| 1/1 [00:00<00:00, 13.51it/s, v_num=0, train_loss_
step=0.206, train_loss_epoch=0.206, valid_loss=0.277]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.99it/s]
Epoch 80: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206, valid_loss=0.361]
Epoch 81: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184, valid_loss=0.361]
Epoch 82: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196, valid_loss=0.361]
Epoch 83: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
16, train_loss_epoch=0.216, valid_loss=0.361]
Epoch 84: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
03, train_loss_epoch=0.203, valid_loss=0.361]
Epoch 85: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1

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92, train_loss_epoch=0.192, valid_loss=0.361]
Epoch 87: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
02, train_loss_epoch=0.202, valid_loss=0.361]
Epoch 88: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
07, train_loss_epoch=0.207, valid_loss=0.361]
Epoch 89: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
86, train_loss_epoch=0.186, valid_loss=0.361]
Epoch 89: 100%|██████████| 1/1 [00:00<00:00, 11.39it/s, v_num=0, train_loss_
step=0.204, train_loss_epoch=0.186, valid_loss=0.361]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.67it/s]
Epoch 90: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204, valid_loss=0.286]
Epoch 91: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206, valid_loss=0.286]
Epoch 92: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
10, train_loss_epoch=0.210, valid_loss=0.286]
Epoch 93: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205, valid_loss=0.286]
Epoch 94: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200, valid_loss=0.286]
Epoch 96: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
80, train_loss_epoch=0.180, valid_loss=0.286]
Epoch 97: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
08, train_loss_epoch=0.208, valid_loss=0.286]
Epoch 98: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201, valid_loss=0.286]
Epoch 99: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214, valid_loss=0.286]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 10.27it/s, v_num=0, train_loss_
step=0.194, train_loss_epoch=0.214, valid_loss=0.286]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.27it/s]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 2.87it/s, v_num=0, train_loss_
step=0.194, train_loss_epoch=0.194, valid_loss=0.340]
Sanity Checking: |          | 0/? [00:00<?, ?it/s]
Sanity Checking DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155) Seed set to 7

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Epoch 0: 0%|          | 0/1 [00:00<?, ?it/s]
Epoch 1: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.23
5, train_loss_epoch=0.235]
Epoch 2: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.25
6, train_loss_epoch=0.256]
Epoch 3: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.22
8, train_loss_epoch=0.228]
Epoch 4: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.20
8, train_loss_epoch=0.208]
Epoch 5: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.22
2, train_loss_epoch=0.222]
Epoch 6: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.22
8, train_loss_epoch=0.228]
Epoch 7: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.20
6, train_loss_epoch=0.206]
Epoch 8: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.21
6, train_loss_epoch=0.216]
Epoch 9: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.20
5, train_loss_epoch=0.205]
Epoch 9: 100%|██████████| 1/1 [00:00<00:00, 9.74it/s, v_num=0, train_loss_s
tep=0.219, train_loss_epoch=0.205]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|         | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.03it/s]
Epoch 10: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
19, train_loss_epoch=0.219, valid_loss=0.246]
Epoch 11: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214, valid_loss=0.246]
Epoch 12: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
21, train_loss_epoch=0.221, valid_loss=0.246]
Epoch 13: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197, valid_loss=0.246]
Epoch 14: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
13, train_loss_epoch=0.213, valid_loss=0.246]
Epoch 15: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197, valid_loss=0.246]
Epoch 16: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
20, train_loss_epoch=0.220, valid_loss=0.246]
Epoch 17: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209, valid_loss=0.246]
Epoch 17: 100%|██████████| 1/1 [00:00<00:00, 10.53it/s, v_num=0, train_loss_
step=0.234, train_loss_epoch=0.209, valid_loss=0.246]
Epoch 18: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
34, train_loss_epoch=0.234, valid_loss=0.246]
Epoch 19: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
16, train_loss_epoch=0.216, valid_loss=0.246]
Epoch 19: 100%|██████████| 1/1 [00:00<00:00, 10.87it/s, v_num=0, train_loss_
step=0.210, train_loss_epoch=0.216, valid_loss=0.246]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|         | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.85it/s]
Epoch 20: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2

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10, train_loss_epoch=0.210, valid_loss=0.291]
Epoch 21: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209, valid_loss=0.291]
Epoch 22: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205, valid_loss=0.291]
Epoch 23: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
18, train_loss_epoch=0.218, valid_loss=0.291]
Epoch 24: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
19, train_loss_epoch=0.219, valid_loss=0.291]
Epoch 25: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
21, train_loss_epoch=0.221, valid_loss=0.291]
Epoch 27: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214, valid_loss=0.291]
Epoch 28: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
23, train_loss_epoch=0.223, valid_loss=0.291]
Epoch 29: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201, valid_loss=0.291]
Epoch 29: 100%|██████████| 1/1 [00:00<00:00, 11.55it/s, v_num=0, train_loss_
step=0.212, train_loss_epoch=0.201, valid_loss=0.291]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.78it/s]
Epoch 30: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
12, train_loss_epoch=0.212, valid_loss=0.291]
Epoch 31: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
07, train_loss_epoch=0.207, valid_loss=0.291]
Epoch 32: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200, valid_loss=0.291]
Epoch 33: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201, valid_loss=0.291]
Epoch 34: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
18, train_loss_epoch=0.218, valid_loss=0.291]
Epoch 35: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
02, train_loss_epoch=0.202, valid_loss=0.291]
Epoch 36: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198, valid_loss=0.291]
Epoch 37: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.291]
Epoch 39: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205, valid_loss=0.291]
Epoch 39: 100%|██████████| 1/1 [00:00<00:00, 9.51it/s, v_num=0, train_loss_
step=0.199, train_loss_epoch=0.205, valid_loss=0.291]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.11it/s]
Epoch 40: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.343]
Epoch 41: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209, valid_loss=0.343]
Epoch 42: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
19, train_loss_epoch=0.219, valid_loss=0.343]
Epoch 42: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2

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00, train_loss_epoch=0.200, valid_loss=0.343]
Epoch 45: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.343]
Epoch 46: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196, valid_loss=0.343]
Epoch 47: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196, valid_loss=0.343]
Epoch 48: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
87, train_loss_epoch=0.187, valid_loss=0.343]
Epoch 49: 100%|████████| 1/1 [00:00<00:00, 12.69it/s, v_num=0, train_loss_
step=0.219, train_loss_epoch=0.188, valid_loss=0.343]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|████████| 1/1 [00:00<00:00, 4.35it/s]
Epoch 49: 100%|████████| 1/1 [00:00<00:00, 3.16it/s, v_num=0, train_loss_
step=0.219, train_loss_epoch=0.188, valid_loss=0.343]
Epoch 49: 100%|████████| 1/1 [00:00<00:00, 3.10it/s, v_num=0, train_loss_
step=0.219, train_loss_epoch=0.219, valid_loss=0.343]
Epoch 50: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
19, train_loss_epoch=0.219, valid_loss=0.343]
Epoch 51: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
08, train_loss_epoch=0.208, valid_loss=0.343]
Epoch 52: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201, valid_loss=0.343]
Epoch 53: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204, valid_loss=0.343]
Epoch 54: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206, valid_loss=0.343]
Epoch 55: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211, valid_loss=0.343]
Epoch 56: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
93, train_loss_epoch=0.193, valid_loss=0.343]
Epoch 57: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200, valid_loss=0.343]
Epoch 58: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206, valid_loss=0.343]
Epoch 59: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188, valid_loss=0.343]
Epoch 59: 100%|████████| 1/1 [00:00<00:00, 8.69it/s, v_num=0, train_loss_
step=0.185, train_loss_epoch=0.188, valid_loss=0.343]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|████████| 1/1 [00:00<00:00, 3.62it/s]
Epoch 60: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
85, train_loss_epoch=0.185, valid_loss=0.286]
Epoch 61: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
15, train_loss_epoch=0.215, valid_loss=0.286]
Epoch 62: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.286]
Epoch 63: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.286]
Epoch 64: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2

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02, train_loss_epoch=0.202, valid_loss=0.286]
Epoch 65: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
08, train_loss_epoch=0.208, valid_loss=0.286]
Epoch 66: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209, valid_loss=0.286]
Epoch 67: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
80, train_loss_epoch=0.180, valid_loss=0.286]
Epoch 67: 100%|████████| 1/1 [00:00<00:00, 8.93it/s, v_num=0, train_loss_
step=0.207, train_loss_epoch=0.180, valid_loss=0.286]
Epoch 68: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
07, train_loss_epoch=0.207, valid_loss=0.286]
Epoch 68: 100%|████████| 1/1 [00:00<00:00, 9.49it/s, v_num=0, train_loss_
step=0.195, train_loss_epoch=0.195, valid_loss=0.286]
Epoch 69: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195, valid_loss=0.286]
Epoch 69: 100%|████████| 1/1 [00:00<00:00, 10.00it/s, v_num=0, train_loss_
step=0.193, train_loss_epoch=0.195, valid_loss=0.286]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|████████| 1/1 [00:00<00:00, 3.43it/s]
Epoch 69: 100%|████████| 1/1 [00:00<00:00, 2.42it/s, v_num=0, train_loss_
step=0.193, train_loss_epoch=0.193, valid_loss=0.282]
Epoch 70: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
93, train_loss_epoch=0.193, valid_loss=0.282]
Epoch 71: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211, valid_loss=0.282]
Epoch 72: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.282]
Epoch 73: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200, valid_loss=0.282]
Epoch 74: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201, valid_loss=0.282]
Epoch 75: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
90, train_loss_epoch=0.190, valid_loss=0.282]
Epoch 76: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.282]
Epoch 77: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.282]
Epoch 78: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
90, train_loss_epoch=0.190, valid_loss=0.282]
Epoch 79: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
82, train_loss_epoch=0.182, valid_loss=0.282]
Epoch 79: 100%|████████| 1/1 [00:00<00:00, 11.43it/s, v_num=0, train_loss_
step=0.199, train_loss_epoch=0.182, valid_loss=0.282]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|████████| 1/1 [00:00<00:00, 4.79it/s]
Epoch 80: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.320]
Epoch 81: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.320]
Epoch 82: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2

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01, train_loss_epoch=0.201, valid_loss=0.320]
Epoch 83: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
03, train_loss_epoch=0.203, valid_loss=0.320]
Epoch 84: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
03, train_loss_epoch=0.203, valid_loss=0.320]
Epoch 85: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
20, train_loss_epoch=0.220, valid_loss=0.320]
Epoch 86: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
61, train_loss_epoch=0.161, valid_loss=0.320]
Epoch 87: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
74, train_loss_epoch=0.174, valid_loss=0.320]
Epoch 88: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192, valid_loss=0.320]
Epoch 89: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188, valid_loss=0.320]
Epoch 89: 100%|██████████| 1/1 [00:00<00:00, 11.96it/s, v_num=0, train_loss_
step=0.174, train_loss_epoch=0.188, valid_loss=0.320]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.76it/s]
Epoch 90: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
74, train_loss_epoch=0.174, valid_loss=0.333]
Epoch 91: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
10, train_loss_epoch=0.210, valid_loss=0.333]
Epoch 93: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
86, train_loss_epoch=0.186, valid_loss=0.333]
Epoch 94: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.333]
Epoch 95: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188, valid_loss=0.333]
Epoch 96: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
87, train_loss_epoch=0.187, valid_loss=0.333]
Epoch 97: 100%|██████████| 1/1 [00:00<00:00, 12.33it/s, v_num=0, train_loss_
step=0.190, train_loss_epoch=0.190, valid_loss=0.333]
Epoch 98: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
90, train_loss_epoch=0.190, valid_loss=0.333]
Epoch 99: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211, valid_loss=0.333]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 12.28it/s, v_num=0, train_loss_
step=0.191, train_loss_epoch=0.211, valid_loss=0.333]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.76it/s]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 3.28it/s, v_num=0, train_loss_
step=0.191, train_loss_epoch=0.191, valid_loss=0.291]
(_train_tune pid=6155) Seed set to 9

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Sanity Checking DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
Epoch 0: 0%|          | 0/1 [00:00<?, ?it/s]
Epoch 1: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.225, train_loss_epoch=0.225]
Epoch 2: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.231, train_loss_epoch=0.231]
Epoch 3: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.210, train_loss_epoch=0.210]
Epoch 4: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.233, train_loss_epoch=0.233]
Epoch 5: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.213, train_loss_epoch=0.213]
Epoch 7: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.205, train_loss_epoch=0.205]
Epoch 8: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.241, train_loss_epoch=0.241]
Epoch 9: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.196, train_loss_epoch=0.196]
Epoch 9: 100%|██████████| 1/1 [00:00<00:00, 9.22it/s, v_num=0, train_loss_step=0.216, train_loss_epoch=0.196]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.73it/s]
Epoch 10: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.216, train_loss_epoch=0.216, valid_loss=0.283]
Epoch 11: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.209, train_loss_epoch=0.209, valid_loss=0.283]
Epoch 12: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.232, train_loss_epoch=0.232, valid_loss=0.283]
Epoch 13: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.215, train_loss_epoch=0.215, valid_loss=0.283]
Epoch 14: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.216, train_loss_epoch=0.216, valid_loss=0.283]
Epoch 15: 100%|██████████| 1/1 [00:00<00:00, 11.22it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.283]
Epoch 15: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.283]
Epoch 16: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.283]
Epoch 17: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.219, train_loss_epoch=0.219, valid_loss=0.283]
Epoch 18: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.242, train_loss_epoch=0.242, valid_loss=0.283]
Epoch 19: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.208, train_loss_epoch=0.208, valid_loss=0.283]
Epoch 19: 100%|██████████| 1/1 [00:00<00:00, 10.91it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.208, valid_loss=0.283]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.72it/s]
Epoch 20: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214, valid_loss=0.344]

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Epoch 21: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.344]
Epoch 22: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.231, train_loss_epoch=0.231, valid_loss=0.344]
Epoch 23: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.201, train_loss_epoch=0.201, valid_loss=0.344]
Epoch 25: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.213, train_loss_epoch=0.213, valid_loss=0.344]
Epoch 26: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.191, train_loss_epoch=0.191, valid_loss=0.344]
Epoch 27: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214, valid_loss=0.344]
Epoch 28: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.218, train_loss_epoch=0.218, valid_loss=0.344]
Epoch 29: 100%|██████████| 1/1 [00:00<00:00, 11.85it/s, v_num=0, train_loss_step=0.222, train_loss_epoch=0.205, valid_loss=0.344]
(_train_tune pid=6155)
Validation: |          | 0/? [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.50it/s]
Epoch 30: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.222, train_loss_epoch=0.222, valid_loss=0.272]
Epoch 31: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.201, train_loss_epoch=0.201, valid_loss=0.272]
Epoch 32: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.209, train_loss_epoch=0.209, valid_loss=0.272]
Epoch 33: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.212, train_loss_epoch=0.212, valid_loss=0.272]
Epoch 34: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.239, train_loss_epoch=0.239, valid_loss=0.272]
Epoch 36: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.227, train_loss_epoch=0.227, valid_loss=0.272]
Epoch 37: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.218, train_loss_epoch=0.218, valid_loss=0.272]
Epoch 38: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.218, train_loss_epoch=0.218, valid_loss=0.272]
Epoch 39: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.179, train_loss_epoch=0.179, valid_loss=0.272]
Epoch 39: 100%|██████████| 1/1 [00:00<00:00, 10.65it/s, v_num=0, train_loss_step=0.186, train_loss_epoch=0.179, valid_loss=0.272]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.72it/s]
Epoch 40: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.186, train_loss_epoch=0.186, valid_loss=0.292]
Epoch 41: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.204, valid_loss=0.292]
Epoch 42: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.219, train_loss_epoch=0.219, valid_loss=0.292]
Epoch 43: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.217, train_loss_epoch=0.217, valid_loss=0.292]
```

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Epoch 44: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.202, train_loss_epoch=0.202, valid_loss=0.292]
Epoch 45: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207, valid_loss=0.292]
Epoch 46: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.202, train_loss_epoch=0.202, valid_loss=0.292]
Epoch 47: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.202, train_loss_epoch=0.202, valid_loss=0.292]
Epoch 48: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.211, train_loss_epoch=0.211, valid_loss=0.292]
Epoch 49: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.210, train_loss_epoch=0.210, valid_loss=0.292]
Epoch 49: 100%|██████████| 1/1 [00:00<00:00, 10.62it/s, v_num=0, train_loss_step=0.210, train_loss_epoch=0.210, valid_loss=0.292]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.35it/s]
Epoch 50: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.210, train_loss_epoch=0.210, valid_loss=0.302]
Epoch 51: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.202, train_loss_epoch=0.202, valid_loss=0.302]
Epoch 52: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.213, train_loss_epoch=0.213, valid_loss=0.302]
Epoch 53: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.189, train_loss_epoch=0.189, valid_loss=0.302]
Epoch 54: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.215, train_loss_epoch=0.215, valid_loss=0.302]
Epoch 55: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.189, train_loss_epoch=0.189, valid_loss=0.302]
Epoch 56: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.181, train_loss_epoch=0.181, valid_loss=0.302]
Epoch 57: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.190, train_loss_epoch=0.190, valid_loss=0.302]
Epoch 58: 100%|██████████| 1/1 [00:00<00:00, 10.87it/s, v_num=0, train_loss_step=0.200, train_loss_epoch=0.200, valid_loss=0.302]
Epoch 59: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.200, train_loss_epoch=0.200, valid_loss=0.302]
Epoch 59: 100%|██████████| 1/1 [00:00<00:00, 11.33it/s, v_num=0, train_loss_step=0.183, train_loss_epoch=0.200, valid_loss=0.302]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.97it/s]
Epoch 60: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.183, train_loss_epoch=0.183, valid_loss=0.280]
Epoch 61: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.280]
Epoch 62: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.171, train_loss_epoch=0.171, valid_loss=0.280]
Epoch 63: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.209, train_loss_epoch=0.209, valid_loss=0.280]
Epoch 64: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.280]
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Epoch 65: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
21, train_loss_epoch=0.221, valid_loss=0.280]
Epoch 66: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206, valid_loss=0.280]
Epoch 67: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195, valid_loss=0.280]
Epoch 69: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204, valid_loss=0.280]
Epoch 69: 100%|██████████| 1/1 [00:00<00:00, 11.47it/s, v_num=0, train_loss_
step=0.187, train_loss_epoch=0.204, valid_loss=0.280]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.66it/s]
Epoch 70: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
87, train_loss_epoch=0.187, valid_loss=0.266]
Epoch 71: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
03, train_loss_epoch=0.203, valid_loss=0.266]
Epoch 72: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
91, train_loss_epoch=0.191, valid_loss=0.266]
Epoch 73: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184, valid_loss=0.266]
Epoch 74: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201, valid_loss=0.266]
Epoch 75: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
90, train_loss_epoch=0.190, valid_loss=0.266]
Epoch 76: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.266]
Epoch 78: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188, valid_loss=0.266]
Epoch 79: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
23, train_loss_epoch=0.223, valid_loss=0.266]
Epoch 79: 100%|██████████| 1/1 [00:00<00:00, 12.20it/s, v_num=0, train_loss_
step=0.194, train_loss_epoch=0.223, valid_loss=0.266]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.63it/s]
Epoch 80: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194, valid_loss=0.295]
Epoch 81: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194, valid_loss=0.295]
Epoch 82: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184, valid_loss=0.295]
Epoch 83: 100%|██████████| 1/1 [00:00<00:00, 12.15it/s, v_num=0, train_loss_
step=0.214, train_loss_epoch=0.214, valid_loss=0.295]
Epoch 84: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214, valid_loss=0.295]
Epoch 85: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
13, train_loss_epoch=0.213, valid_loss=0.295]
Epoch 86: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
73, train_loss_epoch=0.173, valid_loss=0.295]
Epoch 87: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
13, train_loss_epoch=0.213, valid_loss=0.295]

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Epoch 88: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.175, train_loss_epoch=0.175, valid_loss=0.295]
Epoch 89: 100%|████████| 1/1 [00:00<00:00, 11.09it/s, v_num=0, train_loss_step=0.202, train_loss_epoch=0.218, valid_loss=0.295]
(_train_tune pid=6155)
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|████████| 1/1 [00:00<00:00, 4.58it/s]
Epoch 90: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.202, train_loss_epoch=0.202, valid_loss=0.324]
Epoch 91: 100%|████████| 1/1 [00:00<00:00, 10.74it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.198, valid_loss=0.324]
Epoch 91: 100%|████████| 1/1 [00:00<00:00, 10.68it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.324]
Epoch 92: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.324]
Epoch 93: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.213, train_loss_epoch=0.213, valid_loss=0.324]
Epoch 94: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.187, train_loss_epoch=0.187, valid_loss=0.324]
Epoch 95: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.183, train_loss_epoch=0.183, valid_loss=0.324]
Epoch 96: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.175, train_loss_epoch=0.175, valid_loss=0.324]
Epoch 97: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.169, train_loss_epoch=0.169, valid_loss=0.324]
Epoch 98: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.195, train_loss_epoch=0.195, valid_loss=0.324]
Epoch 98: 100%|████████| 1/1 [00:00<00:00, 10.91it/s, v_num=0, train_loss_step=0.217, train_loss_epoch=0.217, valid_loss=0.324]
Epoch 99: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.217, train_loss_epoch=0.217, valid_loss=0.324]
Epoch 99: 100%|████████| 1/1 [00:00<00:00, 6.34it/s, v_num=0, train_loss_step=0.191, train_loss_epoch=0.217, valid_loss=0.324]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|████████| 1/1 [00:00<00:00, 4.43it/s]
Epoch 99: 100%|████████| 1/1 [00:00<00:00, 2.52it/s, v_num=0, train_loss_step=0.191, train_loss_epoch=0.191, valid_loss=0.316]
Sanity Checking DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155) Seed set to 3

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Epoch 0: 0%|          | 0/1 [00:00<?, ?it/s]
Epoch 1: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.211, train_loss_epoch=0.211]
Epoch 2: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.236, train_loss_epoch=0.236]
Epoch 3: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.227, train_loss_epoch=0.227]
Epoch 4: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.225, train_loss_epoch=0.225]
Epoch 5: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.223, train_loss_epoch=0.223]
Epoch 6: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214]
Epoch 8: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.206, train_loss_epoch=0.206]
Epoch 9: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.227, train_loss_epoch=0.227]
Epoch 9: 100%|██████████| 1/1 [00:00<00:00, 11.78it/s, v_num=0, train_loss_step=0.219, train_loss_epoch=0.227]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.68it/s]
Epoch 10: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.219, train_loss_epoch=0.219, valid_loss=0.272]
Epoch 11: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.219, train_loss_epoch=0.219, valid_loss=0.272]
Epoch 12: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.218, train_loss_epoch=0.218, valid_loss=0.272]
Epoch 13: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.211, train_loss_epoch=0.211, valid_loss=0.272]
Epoch 14: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.209, train_loss_epoch=0.209, valid_loss=0.272]
Epoch 15: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.221, train_loss_epoch=0.221, valid_loss=0.272]
Epoch 16: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.232, train_loss_epoch=0.232, valid_loss=0.272]
Epoch 17: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.218, train_loss_epoch=0.218, valid_loss=0.272]
Epoch 18: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.212, train_loss_epoch=0.212, valid_loss=0.272]
Epoch 19: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.226, train_loss_epoch=0.226, valid_loss=0.272]
Epoch 19: 100%|██████████| 1/1 [00:00<00:00, 9.78it/s, v_num=0, train_loss_step=0.210, train_loss_epoch=0.226, valid_loss=0.272]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 3.88it/s]
Epoch 20: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.210, train_loss_epoch=0.210, valid_loss=0.271]
Epoch 21: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.204, valid_loss=0.271]
Epoch 22: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2

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32, train_loss_epoch=0.232, valid_loss=0.271]
Epoch 23: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
18, train_loss_epoch=0.218, valid_loss=0.271]
Epoch 24: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
34, train_loss_epoch=0.234, valid_loss=0.271]
Epoch 25: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
17, train_loss_epoch=0.217, valid_loss=0.271]
Epoch 27: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196, valid_loss=0.271]
Epoch 28: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
28, train_loss_epoch=0.228, valid_loss=0.271]
Epoch 29: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
85, train_loss_epoch=0.185, valid_loss=0.271]
Epoch 29: 100%|██████████| 1/1 [00:00<00:00, 11.96it/s, v_num=0, train_loss_
step=0.209, train_loss_epoch=0.185, valid_loss=0.271]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.14it/s]
Epoch 30: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209, valid_loss=0.274]
Epoch 31: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205, valid_loss=0.274]
Epoch 32: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201, valid_loss=0.274]
Epoch 34: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
12, train_loss_epoch=0.212, valid_loss=0.274]
Epoch 35: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188, valid_loss=0.274]
Epoch 36: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
86, train_loss_epoch=0.186, valid_loss=0.274]
Epoch 37: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214, valid_loss=0.274]
Epoch 38: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204, valid_loss=0.274]
Epoch 39: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
17, train_loss_epoch=0.217, valid_loss=0.274]
Epoch 39: 100%|██████████| 1/1 [00:00<00:00, 10.77it/s, v_num=0, train_loss_
step=0.217, train_loss_epoch=0.217, valid_loss=0.274]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.41it/s]
Epoch 40: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
17, train_loss_epoch=0.217, valid_loss=0.310]
Epoch 41: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
02, train_loss_epoch=0.202, valid_loss=0.310]
Epoch 42: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195, valid_loss=0.310]
Epoch 43: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195, valid_loss=0.310]
Epoch 44: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192, valid_loss=0.310]
Epoch 46: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1

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94, train_loss_epoch=0.194, valid_loss=0.310]
Epoch 47: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214, valid_loss=0.310]
Epoch 48: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.310]
Epoch 49: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.310]
Epoch 49: 100%|██████████| 1/1 [00:00<00:00, 12.12it/s, v_num=0, train_loss_
step=0.203, train_loss_epoch=0.199, valid_loss=0.310]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 5.03it/s]
Epoch 50: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
03, train_loss_epoch=0.203, valid_loss=0.324]
Epoch 51: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
18, train_loss_epoch=0.218, valid_loss=0.324]
Epoch 52: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198, valid_loss=0.324]
Epoch 53: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
90, train_loss_epoch=0.190, valid_loss=0.324]
Epoch 54: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
12, train_loss_epoch=0.212, valid_loss=0.324]
Epoch 56: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205, valid_loss=0.324]
Epoch 57: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
76, train_loss_epoch=0.176, valid_loss=0.324]
Epoch 59: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194, valid_loss=0.324]
Epoch 59: 100%|██████████| 1/1 [00:00<00:00, 11.38it/s, v_num=0, train_loss_
step=0.190, train_loss_epoch=0.194, valid_loss=0.324]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.69it/s]
Epoch 60: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
90, train_loss_epoch=0.190, valid_loss=0.320]
Epoch 61: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198, valid_loss=0.320]
Epoch 62: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188, valid_loss=0.320]
Epoch 63: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
86, train_loss_epoch=0.186, valid_loss=0.320]
Epoch 65: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
91, train_loss_epoch=0.191, valid_loss=0.320]
Epoch 66: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
08, train_loss_epoch=0.208, valid_loss=0.320]
Epoch 67: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
79, train_loss_epoch=0.179, valid_loss=0.320]
Epoch 68: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201, valid_loss=0.320]
Epoch 69: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201, valid_loss=0.320]
Epoch 69: 100%|██████████| 1/1 [00:00<00:00, 11.41it/s, v_num=0, train_loss_

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step=0.196, train_loss_epoch=0.201, valid_loss=0.320]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation:  0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0:  0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 5.07it/s]
Epoch 70:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196, valid_loss=0.304]
Epoch 71:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192, valid_loss=0.304]
Epoch 72:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
91, train_loss_epoch=0.191, valid_loss=0.304]
Epoch 74:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197, valid_loss=0.304]
Epoch 75:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
80, train_loss_epoch=0.180, valid_loss=0.304]
Epoch 76:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206, valid_loss=0.304]
Epoch 77:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
76, train_loss_epoch=0.176, valid_loss=0.304]
Epoch 78:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184, valid_loss=0.304]
Epoch 79: 100%|██████████| 1/1 [00:00<00:00, 12.66it/s, v_num=0, train_loss_
step=0.193, train_loss_epoch=0.165, valid_loss=0.304]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation:  0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0:  0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.93it/s]
Epoch 79: 100%|██████████| 1/1 [00:00<00:00, 3.49it/s, v_num=0, train_loss_
step=0.193, train_loss_epoch=0.165, valid_loss=0.296]
Epoch 81:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
86, train_loss_epoch=0.186, valid_loss=0.296]
Epoch 82:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
86, train_loss_epoch=0.186, valid_loss=0.296]
Epoch 83:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
82, train_loss_epoch=0.182, valid_loss=0.296]
Epoch 84:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
77, train_loss_epoch=0.177, valid_loss=0.296]
Epoch 85:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.296]
Epoch 86:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
72, train_loss_epoch=0.172, valid_loss=0.296]
Epoch 87:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
74, train_loss_epoch=0.174, valid_loss=0.296]
Epoch 88:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
85, train_loss_epoch=0.185, valid_loss=0.296]
Epoch 89:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
83, train_loss_epoch=0.183, valid_loss=0.296]
Epoch 89: 100%|██████████| 1/1 [00:00<00:00, 11.53it/s, v_num=0, train_loss_
step=0.166, train_loss_epoch=0.183, valid_loss=0.296]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation:  0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0:  0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.86it/s]

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Epoch 90: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
66, train_loss_epoch=0.166, valid_loss=0.338]
Epoch 91: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
86, train_loss_epoch=0.186, valid_loss=0.338]
Epoch 92: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
80, train_loss_epoch=0.180, valid_loss=0.338]
Epoch 93: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.338]
Epoch 94: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
76, train_loss_epoch=0.176, valid_loss=0.338]
Epoch 95: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
81, train_loss_epoch=0.181, valid_loss=0.338]
Epoch 96: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204, valid_loss=0.338]
Epoch 97: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
82, train_loss_epoch=0.182, valid_loss=0.338]
Epoch 98: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188, valid_loss=0.338]
Epoch 99: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197, valid_loss=0.338]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 11.36it/s, v_num=0, train_loss_
step=0.190, train_loss_epoch=0.197, valid_loss=0.338]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.43it/s]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 3.05it/s, v_num=0, train_loss_
step=0.190, train_loss_epoch=0.190, valid_loss=0.370]
(_train_tune pid=6155) Seed set to 6

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Sanity Checking DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
Epoch 0: 0%|          | 0/1 [00:00<?, ?it/s]
Epoch 1: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.204]
Epoch 2: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.233, train_loss_epoch=0.233]
Epoch 3: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.237, train_loss_epoch=0.237]
Epoch 4: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207]
Epoch 5: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207]
Epoch 6: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.229, train_loss_epoch=0.229]
Epoch 7: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.248, train_loss_epoch=0.248]
Epoch 8: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207]
Epoch 9: 100%|██████████| 1/1 [00:00<00:00, 10.77it/s, v_num=0, train_loss_step=0.229, train_loss_epoch=0.207]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.50it/s]
Epoch 11: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207, valid_loss=0.264]
Epoch 12: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.204, valid_loss=0.264]
Epoch 13: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.228, train_loss_epoch=0.228, valid_loss=0.264]
Epoch 14: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.249, train_loss_epoch=0.249, valid_loss=0.264]
Epoch 16: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.182, train_loss_epoch=0.182, valid_loss=0.264]
Epoch 17: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.205, train_loss_epoch=0.205, valid_loss=0.264]
Epoch 18: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.199, train_loss_epoch=0.199, valid_loss=0.264]
Epoch 19: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.218, train_loss_epoch=0.218, valid_loss=0.264]
Epoch 19: 100%|██████████| 1/1 [00:00<00:00, 12.24it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.218, valid_loss=0.264]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.53it/s]
Epoch 20: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.204, valid_loss=0.309]
Epoch 21: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.211, train_loss_epoch=0.211, valid_loss=0.309]
Epoch 22: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214, valid_loss=0.309]
Epoch 23: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.212, train_loss_epoch=0.212, valid_loss=0.309]

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Epoch 24: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.208, train_loss_epoch=0.208, valid_loss=0.309]
Epoch 25: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214, valid_loss=0.309]
Epoch 26: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.215, train_loss_epoch=0.215, valid_loss=0.309]
Epoch 28: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.197, train_loss_epoch=0.197, valid_loss=0.309]
Epoch 29: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.219, train_loss_epoch=0.219, valid_loss=0.309]
Epoch 29: 100%|██████████| 1/1 [00:00<00:00, 11.52it/s, v_num=0, train_loss_step=0.219, train_loss_epoch=0.219, valid_loss=0.309]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.83it/s]
Epoch 30: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.219, train_loss_epoch=0.219, valid_loss=0.334]
Epoch 31: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214, valid_loss=0.334]
Epoch 32: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.334]
Epoch 33: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.201, train_loss_epoch=0.201, valid_loss=0.334]
Epoch 34: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.224, train_loss_epoch=0.224, valid_loss=0.334]
Epoch 35: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.210, train_loss_epoch=0.210, valid_loss=0.334]
Epoch 36: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.197, train_loss_epoch=0.197, valid_loss=0.334]
Epoch 36: 100%|██████████| 1/1 [00:00<00:00, 7.97it/s, v_num=0, train_loss_step=0.201, train_loss_epoch=0.201, valid_loss=0.334]
Epoch 37: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.201, train_loss_epoch=0.201, valid_loss=0.334]
Epoch 38: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.209, train_loss_epoch=0.209, valid_loss=0.334]
Epoch 39: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.208, train_loss_epoch=0.208, valid_loss=0.334]
Epoch 39: 100%|██████████| 1/1 [00:00<00:00, 12.33it/s, v_num=0, train_loss_step=0.194, train_loss_epoch=0.208, valid_loss=0.334]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.45it/s]
Epoch 40: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.194, train_loss_epoch=0.194, valid_loss=0.265]
Epoch 41: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.265]
Epoch 42: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.208, train_loss_epoch=0.208, valid_loss=0.265]
Epoch 43: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.265]
Epoch 44: 100%|██████████| 1/1 [00:00<00:00, 11.14it/s, v_num=0, train_loss_step=0.197, train_loss_epoch=0.197, valid_loss=0.265]

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Epoch 45: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197, valid_loss=0.265]
Epoch 46: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
15, train_loss_epoch=0.215, valid_loss=0.265]
Epoch 47: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192, valid_loss=0.265]
Epoch 48: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
10, train_loss_epoch=0.210, valid_loss=0.265]
Epoch 49: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
16, train_loss_epoch=0.216, valid_loss=0.265]
Epoch 49: 100%|██████████| 1/1 [00:00<00:00, 11.18it/s, v_num=0, train_loss_
step=0.196, train_loss_epoch=0.216, valid_loss=0.265]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.45it/s]
Epoch 50: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196, valid_loss=0.279]
Epoch 51: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195, valid_loss=0.279]
Epoch 52: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197, valid_loss=0.279]
Epoch 53: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
93, train_loss_epoch=0.193, valid_loss=0.279]
Epoch 54: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
87, train_loss_epoch=0.187, valid_loss=0.279]
Epoch 55: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205, valid_loss=0.279]
Epoch 56: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195, valid_loss=0.279]
Epoch 58: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
08, train_loss_epoch=0.208, valid_loss=0.279]
Epoch 59: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194, valid_loss=0.279]
Epoch 59: 100%|██████████| 1/1 [00:00<00:00, 11.79it/s, v_num=0, train_loss_
step=0.198, train_loss_epoch=0.194, valid_loss=0.279]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.60it/s]
Epoch 60: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198, valid_loss=0.314]
Epoch 61: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198, valid_loss=0.314]
Epoch 62: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184, valid_loss=0.314]
Epoch 63: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
91, train_loss_epoch=0.191, valid_loss=0.314]
Epoch 64: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192, valid_loss=0.314]
Epoch 65: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188, valid_loss=0.314]
Epoch 67: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192, valid_loss=0.314]

```

```

Epoch 68: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
30, train_loss_epoch=0.230, valid_loss=0.314]
Epoch 69: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184, valid_loss=0.314]
Epoch 69: 100%|██████████| 1/1 [00:00<00:00, 10.85it/s, v_num=0, train_loss_
step=0.175, train_loss_epoch=0.184, valid_loss=0.314]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.82it/s]
Epoch 70: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
75, train_loss_epoch=0.175, valid_loss=0.275]
Epoch 72: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188, valid_loss=0.275]
Epoch 73: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189, valid_loss=0.275]
Epoch 74: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
77, train_loss_epoch=0.177, valid_loss=0.275]
Epoch 75: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195, valid_loss=0.275]
Epoch 76: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214, valid_loss=0.275]
Epoch 77: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205, valid_loss=0.275]
Epoch 79: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201, valid_loss=0.275]
Epoch 79: 100%|██████████| 1/1 [00:00<00:00, 10.51it/s, v_num=0, train_loss_
step=0.199, train_loss_epoch=0.201, valid_loss=0.275]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.51it/s]
Epoch 80: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199, valid_loss=0.379]
Epoch 82: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
90, train_loss_epoch=0.190, valid_loss=0.379]
Epoch 83: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
10, train_loss_epoch=0.210, valid_loss=0.379]
Epoch 84: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196, valid_loss=0.379]
Epoch 85: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
87, train_loss_epoch=0.187, valid_loss=0.379]
Epoch 86: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192, valid_loss=0.379]
Epoch 88: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
02, train_loss_epoch=0.202, valid_loss=0.379]
Epoch 89: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184, valid_loss=0.379]
Epoch 89: 100%|██████████| 1/1 [00:00<00:00, 12.59it/s, v_num=0, train_loss_
step=0.195, train_loss_epoch=0.184, valid_loss=0.379]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)

```



```

Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.21it/s]
Epoch 90: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.195, train_loss_epoch=0.195, valid_loss=0.320]
Epoch 91: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203, valid_loss=0.320]
Epoch 92: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.206, train_loss_epoch=0.206, valid_loss=0.320]
Epoch 93: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.198, train_loss_epoch=0.198, valid_loss=0.320]
Epoch 94: 100%|██████████| 1/1 [00:00<00:00, 11.47it/s, v_num=0, train_loss_step=0.173, train_loss_epoch=0.173, valid_loss=0.320]
Epoch 95: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.173, train_loss_epoch=0.173, valid_loss=0.320]
Epoch 96: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.172, train_loss_epoch=0.172, valid_loss=0.320]
Epoch 97: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.204, valid_loss=0.320]
Epoch 98: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.198, train_loss_epoch=0.198, valid_loss=0.320]
Epoch 99: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207, valid_loss=0.320]

```

Seed set to 7

```

Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 10.58it/s, v_num=0, train_loss_step=0.189, train_loss_epoch=0.207, valid_loss=0.320]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=6155)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 4.67it/s]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 3.10it/s, v_num=0, train_loss_step=0.189, train_loss_epoch=0.189, valid_loss=0.355]

```

2023-11-04 14:22:36.024653: I tensorflow/core/util/port.cc:111] oneDNN custom operations are on. You may see slightly different numerical results due to floating-point round-off errors from different computation orders. To turn them off, set the environment variable `TF\_ENABLE\_ONEDNN\_OPTS=0`.

2023-11-04 14:22:36.026315: I tensorflow/tsl/cuda/cudart\_stub.cc:28] Could not find cuda drivers on your machine, GPU will not be used.

2023-11-04 14:22:36.050932: E tensorflow/compiler/xla/stream\_executor/cuda/cuda\_dnn.cc:9342] Unable to register cuDNN factory: Attempting to register factory for plugin cuDNN when one has already been registered

2023-11-04 14:22:36.050955: E tensorflow/compiler/xla/stream\_executor/cuda/cuda\_fft.cc:609] Unable to register cuFFT factory: Attempting to register factory for plugin cuFFT when one has already been registered

2023-11-04 14:22:36.050972: E tensorflow/compiler/xla/stream\_executor/cuda/cuda\_blas.cc:1518] Unable to register cuBLAS factory: Attempting to register factory for plugin cuBLAS when one has already been registered

2023-11-04 14:22:36.058040: I tensorflow/core/platform/cpu\_feature\_guard.cc:182] This TensorFlow binary is optimized to use available CPU instructions in performance-critical operations.

To enable the following instructions: AVX2 AVX\_VNNI FMA, in other operations, rebuild TensorFlow with the appropriate compiler flags.

2023-11-04 14:22:36.624180: W tensorflow/compiler/tf2tensorrt/utils/py\_utils.cc:38] TF-TRT Warning: Could not find TensorRT

Sanity Checking: |

| 0/? [00:00...

```
Training: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Predicting: |
| 0/? [00:00...
```

```
In [5]: nf = NeuralForecast(
        models=models,
        freq='D')

Y_hat_df = nf.cross_validation(df=Y_df, val_size=val_size,
                              test_size=test_size, n_windows=None)
```



```
(_train_tune pid=7588) Seed set to 8
(_train_tune pid=7588) 2023-11-02 03:18:33.048410: I tensorflow/core/util/port.cc:111] oneDNN custom operations are on. You may see slightly different numerical results due to floating-point round-off errors from different computation orders. To turn them off, set the environment variable `TF_ENABLE_ONE_DNN_OPTS=0`.
(_train_tune pid=7588) 2023-11-02 03:18:33.081815: I tensorflow/tsl/cuda/cudart_stub.cc:28] Could not find cuda drivers on your machine, GPU will not be used.
(_train_tune pid=7588) 2023-11-02 03:18:33.234842: E tensorflow/compiler/xla/stream_executor/cuda/cuda_dnn.cc:9342] Unable to register cuDNN factory: Attempting to register factory for plugin cuDNN when one has already been registered
(_train_tune pid=7588) 2023-11-02 03:18:33.235007: E tensorflow/compiler/xla/stream_executor/cuda/cuda_fft.cc:609] Unable to register cuFFT factory: Attempting to register factory for plugin cuFFT when one has already been registered
(_train_tune pid=7588) 2023-11-02 03:18:33.235157: E tensorflow/compiler/xla/stream_executor/cuda/cuda_blas.cc:1518] Unable to register cuBLAS factory: Attempting to register factory for plugin cuBLAS when one has already been registered
(_train_tune pid=7588) 2023-11-02 03:18:33.357964: I tensorflow/core/platform/cpu_feature_guard.cc:182] This TensorFlow binary is optimized to use available CPU instructions in performance-critical operations.
(_train_tune pid=7588) To enable the following instructions: AVX2 AVX_VNNI FMA, in other operations, rebuild TensorFlow with the appropriate compiler flags.
(_train_tune pid=7588) 2023-11-02 03:18:37.752386: W tensorflow/compiler/tf2tensorrt/Utils/py_utils.cc:38] TF-TRT Warning: Could not find TensorRT
```

```

Sanity Checking DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
Sanity Checking DataLoader 0: 100%|██████████| 1/1 [00:01<00:00, 0.88it/s]
Epoch 0: 0%|          | 0/1 [00:00<?, ?it/s]
Epoch 1: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.224, train_loss_epoch=0.224]
Epoch 2: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.215, train_loss_epoch=0.215]
Epoch 3: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.215, train_loss_epoch=0.215]
Epoch 4: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.194, train_loss_epoch=0.194]
Epoch 5: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207]
Epoch 6: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.209, train_loss_epoch=0.209]
Epoch 7: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.230, train_loss_epoch=0.230]
Epoch 8: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.210, train_loss_epoch=0.210]
Epoch 9: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.230, train_loss_epoch=0.230]
Epoch 10: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.221, train_loss_epoch=0.221]
Epoch 11: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.210, train_loss_epoch=0.210]
Epoch 11: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.199, train_loss_epoch=0.199]
Epoch 12: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.199, train_loss_epoch=0.199]
Epoch 13: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.218, train_loss_epoch=0.218]
Epoch 14: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203]
Epoch 14: 100%|██████████| 1/1 [00:00<00:00, 1.76it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203]
Epoch 14: 100%|██████████| 1/1 [00:00<00:00, 1.76it/s, v_num=0, train_loss_step=0.231, train_loss_epoch=0.231]
Epoch 15: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.231, train_loss_epoch=0.231]
Epoch 15: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.215, train_loss_epoch=0.215]
Epoch 16: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.215, train_loss_epoch=0.215]
Epoch 17: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.212, train_loss_epoch=0.212]
Epoch 18: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.183, train_loss_epoch=0.183]
Epoch 19: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.194, train_loss_epoch=0.194]
Epoch 20: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.228, train_loss_epoch=0.228]
Epoch 21: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214]
Epoch 22: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207]
Epoch 23: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2

```

```

61, train_loss_epoch=0.261]
Epoch 24: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
16, train_loss_epoch=0.216]
Epoch 25: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
08, train_loss_epoch=0.208]
Epoch 26: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204]
Epoch 27: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194]
Epoch 28: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192]
Epoch 29: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
19, train_loss_epoch=0.219]
Epoch 30: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198]
Epoch 31: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188]
Epoch 32: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
02, train_loss_epoch=0.202]
Epoch 33: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214]
Epoch 34: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201]
Epoch 35: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 36: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
17, train_loss_epoch=0.217]
Epoch 37: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
02, train_loss_epoch=0.202]
Epoch 38: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
21, train_loss_epoch=0.221]
Epoch 39: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
15, train_loss_epoch=0.215]
Epoch 40: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
36, train_loss_epoch=0.236]
Epoch 41: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
10, train_loss_epoch=0.210]
Epoch 42: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
10, train_loss_epoch=0.210]
Epoch 43: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
31, train_loss_epoch=0.231]
Epoch 44: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204]
Epoch 45: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206]
Epoch 46: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 47: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
83, train_loss_epoch=0.183]
Epoch 48: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189]
Epoch 49: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192]
Epoch 50: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197]
Epoch 51: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1

```

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96, train_loss_epoch=0.196]
Epoch 52: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
87, train_loss_epoch=0.187]
Epoch 53: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184]
Epoch 54: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 55: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204]
Epoch 56: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 57: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
16, train_loss_epoch=0.216]
Epoch 58: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
33, train_loss_epoch=0.233]
Epoch 59: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184]
Epoch 60: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
37, train_loss_epoch=0.237]
Epoch 61: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
16, train_loss_epoch=0.216]
Epoch 62: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
83, train_loss_epoch=0.183]
Epoch 63: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 64: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194]
Epoch 65: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
13, train_loss_epoch=0.213]
Epoch 66: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
18, train_loss_epoch=0.218]
Epoch 67: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184]
Epoch 68: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209]
Epoch 69: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
27, train_loss_epoch=0.227]
Epoch 70: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211]
Epoch 71: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
12, train_loss_epoch=0.212]
Epoch 72: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
20, train_loss_epoch=0.220]
Epoch 73: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
10, train_loss_epoch=0.210]
Epoch 74: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189]
Epoch 75: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 76: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184]
Epoch 77: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
83, train_loss_epoch=0.183]
Epoch 78: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 79: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1

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97, train_loss_epoch=0.197]
Epoch 80: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184]
Epoch 81: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
90, train_loss_epoch=0.190]
Epoch 82: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206]
Epoch 83: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 84: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 85: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198]
Epoch 86: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195]
Epoch 87: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
03, train_loss_epoch=0.203]
Epoch 88: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
81, train_loss_epoch=0.181]
Epoch 89: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
03, train_loss_epoch=0.203]
Epoch 90: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 91: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
10, train_loss_epoch=0.210]
Epoch 92: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
82, train_loss_epoch=0.182]
Epoch 93: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
80, train_loss_epoch=0.180]
Epoch 94: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206]
Epoch 95: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195]
Epoch 96: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 97: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205]
Epoch 98: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198]
Epoch 99: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
90, train_loss_epoch=0.190]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 5.85it/s, v_num=0, train_loss_
step=0.199, train_loss_epoch=0.190]
Validation: |          | 0/? [00:00<?, ?it/s]
(_train_tune pid=7588)
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=7588)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 1.45it/s]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 1.09it/s, v_num=0, train_loss_
step=0.199, train_loss_epoch=0.199, valid_loss=0.339]
(_train_tune pid=7588) Seed set to 3

```

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Sanity Checking DataLoader 0:  0%|          | 0/1 [00:00<?, ?it/s]
Epoch 0:  0%|          | 0/1 [00:00<?, ?it/s]
Epoch 1:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.210, train_loss_epoch=0.210]
Epoch 2:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.241, train_loss_epoch=0.241]
Epoch 2: 100%|██████████| 1/1 [00:00<00:00, 2.87it/s, v_num=0, train_loss_step=0.241, train_loss_epoch=0.241]
Epoch 2: 100%|██████████| 1/1 [00:00<00:00, 2.86it/s, v_num=0, train_loss_step=0.227, train_loss_epoch=0.241]
Epoch 3:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.227, train_loss_epoch=0.227]
Epoch 4:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.224, train_loss_epoch=0.224]
Epoch 5:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.223, train_loss_epoch=0.223]
Epoch 6:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214]
Epoch 7:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.249, train_loss_epoch=0.249]
Epoch 8:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.206, train_loss_epoch=0.206]
Epoch 9:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.227, train_loss_epoch=0.227]
Epoch 10:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.219, train_loss_epoch=0.219]
Epoch 11:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.202, train_loss_epoch=0.202]
Epoch 12:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.216, train_loss_epoch=0.216]
Epoch 13:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.227, train_loss_epoch=0.227]
Epoch 14:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214]
Epoch 15:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.225, train_loss_epoch=0.225]
Epoch 16:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.221, train_loss_epoch=0.221]
Epoch 17:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.198, train_loss_epoch=0.198]
Epoch 18:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.214, train_loss_epoch=0.214]
Epoch 19:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.200, train_loss_epoch=0.200]
Epoch 20:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.234, train_loss_epoch=0.234]
Epoch 20: 100%|██████████| 1/1 [00:00<00:00, 1.65it/s, v_num=0, train_loss_step=0.209, train_loss_epoch=0.209]
Epoch 21:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.209, train_loss_epoch=0.209]
Epoch 22:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.217, train_loss_epoch=0.217]
Epoch 23:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203]
Epoch 24:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.231, train_loss_epoch=0.231]

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Epoch 25: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 26: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.214, train\_loss\_epoch=0.214]  
Epoch 27: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.199, train\_loss\_epoch=0.199]  
Epoch 28: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.178, train\_loss\_epoch=0.178]  
Epoch 29: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.232, train\_loss\_epoch=0.232]  
Epoch 30: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.190, train\_loss\_epoch=0.190]  
Epoch 31: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.205, train\_loss\_epoch=0.205]  
Epoch 32: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.214, train\_loss\_epoch=0.214]  
Epoch 33: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.203, train\_loss\_epoch=0.203]  
Epoch 34: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.216, train\_loss\_epoch=0.216]  
Epoch 35: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.180, train\_loss\_epoch=0.180]  
Epoch 36: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.191, train\_loss\_epoch=0.191]  
Epoch 37: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.214, train\_loss\_epoch=0.214]  
Epoch 37: 100%|██████████| 1/1 [00:00<00:00, 1.28it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.214]  
Epoch 37: 100%|██████████| 1/1 [00:00<00:00, 1.28it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 38: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 39: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.233, train\_loss\_epoch=0.233]  
Epoch 40: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.227, train\_loss\_epoch=0.227]  
Epoch 41: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.199, train\_loss\_epoch=0.199]  
Epoch 42: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.204, train\_loss\_epoch=0.204]  
Epoch 43: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 44: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.225, train\_loss\_epoch=0.225]  
Epoch 45: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.220, train\_loss\_epoch=0.220]  
Epoch 46: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.211, train\_loss\_epoch=0.211]  
Epoch 47: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.218, train\_loss\_epoch=0.218]  
Epoch 48: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.199, train\_loss\_epoch=0.199]  
Epoch 48: 100%|██████████| 1/1 [00:00<00:00, 2.56it/s, v\_num=0, train\_loss\_step=0.199, train\_loss\_epoch=0.199]  
Epoch 49: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.199, train\_loss\_epoch=0.199]

Epoch 50: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.217, train\_loss\_epoch=0.217]  
Epoch 51: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.216, train\_loss\_epoch=0.216]  
Epoch 52: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.206, train\_loss\_epoch=0.206]  
Epoch 53: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.196, train\_loss\_epoch=0.196]  
Epoch 53: 100%|██████████| 1/1 [00:00<00:00, 5.17it/s, v\_num=0, train\_loss\_step=0.234, train\_loss\_epoch=0.196]  
Epoch 54: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.234, train\_loss\_epoch=0.234]  
Epoch 55: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.204, train\_loss\_epoch=0.204]  
Epoch 56: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.201, train\_loss\_epoch=0.201]  
Epoch 57: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.219, train\_loss\_epoch=0.219]  
Epoch 58: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.215, train\_loss\_epoch=0.215]  
Epoch 59: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.208, train\_loss\_epoch=0.208]  
Epoch 60: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.213, train\_loss\_epoch=0.213]  
Epoch 61: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.206, train\_loss\_epoch=0.206]  
Epoch 62: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.176, train\_loss\_epoch=0.176]  
Epoch 63: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.190, train\_loss\_epoch=0.190]  
Epoch 63: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.169, train\_loss\_epoch=0.169]  
Epoch 64: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.169, train\_loss\_epoch=0.169]  
Epoch 65: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.209, train\_loss\_epoch=0.209]  
Epoch 66: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.209, train\_loss\_epoch=0.209]  
Epoch 66: 100%|██████████| 1/1 [00:00<00:00, 3.30it/s, v\_num=0, train\_loss\_step=0.184, train\_loss\_epoch=0.184]  
Epoch 67: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.184, train\_loss\_epoch=0.184]  
Epoch 68: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.226, train\_loss\_epoch=0.226]  
Epoch 69: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.211, train\_loss\_epoch=0.211]  
Epoch 70: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.210, train\_loss\_epoch=0.210]  
Epoch 71: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.201, train\_loss\_epoch=0.201]  
Epoch 71: 100%|██████████| 1/1 [00:00<00:00, 2.77it/s, v\_num=0, train\_loss\_step=0.185, train\_loss\_epoch=0.201]  
Epoch 72: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.185, train\_loss\_epoch=0.185]  
Epoch 73: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.215, train\_loss\_epoch=0.215]



Epoch 73: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.189, train\_loss\_epoch=0.189]  
Epoch 74: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.189, train\_loss\_epoch=0.189]  
Epoch 75: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.206, train\_loss\_epoch=0.206]  
Epoch 76: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.213, train\_loss\_epoch=0.213]  
Epoch 77: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.218, train\_loss\_epoch=0.218]  
Epoch 78: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.193, train\_loss\_epoch=0.193]  
Epoch 79: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.194, train\_loss\_epoch=0.194]  
Epoch 80: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.213, train\_loss\_epoch=0.213]  
Epoch 81: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.204, train\_loss\_epoch=0.204]  
Epoch 82: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.203, train\_loss\_epoch=0.203]  
Epoch 83: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.202, train\_loss\_epoch=0.202]  
Epoch 84: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.181, train\_loss\_epoch=0.181]  
Epoch 85: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.209, train\_loss\_epoch=0.209]  
Epoch 86: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.188, train\_loss\_epoch=0.188]  
Epoch 87: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.194, train\_loss\_epoch=0.194]  
Epoch 88: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.205, train\_loss\_epoch=0.205]  
Epoch 89: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.203, train\_loss\_epoch=0.203]  
Epoch 90: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.174, train\_loss\_epoch=0.174]  
Epoch 91: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.195, train\_loss\_epoch=0.195]  
Epoch 92: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.201, train\_loss\_epoch=0.201]  
Epoch 93: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.194, train\_loss\_epoch=0.194]  
Epoch 94: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 95: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 96: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 96: 100%|██████████| 1/1 [00:00<00:00, 4.17it/s, v\_num=0, train\_loss\_step=0.195, train\_loss\_epoch=0.195]  
Epoch 96: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.195, train\_loss\_epoch=0.195]  
Epoch 97: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.195, train\_loss\_epoch=0.195]  
Epoch 98: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.209, train\_loss\_epoch=0.209]

```
Epoch 99: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203]
Epoch 99: 100%|████████| 1/1 [00:00<00:00, 1.96it/s, v_num=0, train_loss_step=0.199, train_loss_epoch=0.203]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=7588)
Validation DataLoader 0: 100%|████████| 1/1 [00:01<00:00, 0.92it/s]
Epoch 99: 100%|████████| 1/1 [00:01<00:00, 0.62it/s, v_num=0, train_loss_step=0.199, train_loss_epoch=0.203, valid_loss=0.339]
Epoch 99: 100%|████████| 1/1 [00:01<00:00, 0.61it/s, v_num=0, train_loss_step=0.199, train_loss_epoch=0.199, valid_loss=0.339]
(_train_tune pid=7588) Seed set to 6
```

```

Sanity Checking DataLoader 0:  0%|          | 0/1 [00:00<?, ?it/s]
Epoch 0:  0%|          | 0/1 [00:00<?, ?it/s]
Epoch 1:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.20
2, train_loss_epoch=0.202]
Epoch 2:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.30
3, train_loss_epoch=0.303]
Epoch 3:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.23
7, train_loss_epoch=0.237]
Epoch 4:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.21
1, train_loss_epoch=0.211]
Epoch 5:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.20
7, train_loss_epoch=0.207]
Epoch 6:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.22
7, train_loss_epoch=0.227]
Epoch 7:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.25
2, train_loss_epoch=0.252]
Epoch 7: 100%|██████████| 1/1 [00:00<00:00, 3.01it/s, v_num=0, train_loss_s
tep=0.217, train_loss_epoch=0.217]
Epoch 8:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.21
7, train_loss_epoch=0.217]
Epoch 9:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.20
9, train_loss_epoch=0.209]
Epoch 10:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
29, train_loss_epoch=0.229]
Epoch 11:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214]
Epoch 12:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
12, train_loss_epoch=0.212]
Epoch 13:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
90, train_loss_epoch=0.190]
Epoch 14:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
42, train_loss_epoch=0.242]
Epoch 15:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
29, train_loss_epoch=0.229]
Epoch 16:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 17:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 18:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211]
Epoch 19:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198]
Epoch 20:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 21:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
13, train_loss_epoch=0.213]
Epoch 22:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
22, train_loss_epoch=0.222]
Epoch 23:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211]
Epoch 24:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
13, train_loss_epoch=0.213]
Epoch 25:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
32, train_loss_epoch=0.232]
Epoch 26:  0%|         | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
93, train_loss_epoch=0.193]

```

Epoch 27: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.217, train\_loss\_epoch=0.217]  
Epoch 28: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.224, train\_loss\_epoch=0.224]  
Epoch 29: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.200, train\_loss\_epoch=0.200]  
Epoch 30: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.198, train\_loss\_epoch=0.198]  
Epoch 31: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 32: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.197, train\_loss\_epoch=0.197]  
Epoch 33: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.226, train\_loss\_epoch=0.226]  
Epoch 34: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.224, train\_loss\_epoch=0.224]  
Epoch 35: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.189, train\_loss\_epoch=0.189]  
Epoch 36: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.196, train\_loss\_epoch=0.196]  
Epoch 37: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.185, train\_loss\_epoch=0.185]  
Epoch 38: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.202, train\_loss\_epoch=0.202]  
Epoch 39: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.217, train\_loss\_epoch=0.217]  
Epoch 40: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.198, train\_loss\_epoch=0.198]  
Epoch 41: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.193, train\_loss\_epoch=0.193]  
Epoch 42: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.225, train\_loss\_epoch=0.225]  
Epoch 42: 100%|██████████| 1/1 [00:00<00:00, 3.00it/s, v\_num=0, train\_loss\_step=0.205, train\_loss\_epoch=0.225]  
Epoch 43: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.205, train\_loss\_epoch=0.205]  
Epoch 44: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.216, train\_loss\_epoch=0.216]  
Epoch 45: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.181, train\_loss\_epoch=0.181]  
Epoch 46: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.199, train\_loss\_epoch=0.199]  
Epoch 47: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.187, train\_loss\_epoch=0.187]  
Epoch 48: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.187, train\_loss\_epoch=0.187]  
Epoch 48: 100%|██████████| 1/1 [00:00<00:00, 2.68it/s, v\_num=0, train\_loss\_step=0.218, train\_loss\_epoch=0.218]  
Epoch 49: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.218, train\_loss\_epoch=0.218]  
Epoch 50: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.198, train\_loss\_epoch=0.198]  
Epoch 51: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.198, train\_loss\_epoch=0.198]  
Epoch 52: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.192, train\_loss\_epoch=0.192]

```

Epoch 53: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
07, train_loss_epoch=0.207]
Epoch 54: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195]
Epoch 55: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
27, train_loss_epoch=0.227]
Epoch 56: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 57: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
83, train_loss_epoch=0.183]
Epoch 58: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
07, train_loss_epoch=0.207]
Epoch 59: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 60: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201]
Epoch 61: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204]
Epoch 62: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 63: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
02, train_loss_epoch=0.202]
Epoch 64: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
15, train_loss_epoch=0.215]
Epoch 65: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195]
Epoch 66: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
08, train_loss_epoch=0.208]
Epoch 67: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204]
Epoch 68: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
24, train_loss_epoch=0.224]
Epoch 69: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192]
Epoch 70: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
86, train_loss_epoch=0.186]
Epoch 71: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205]
Epoch 72: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 73: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
80, train_loss_epoch=0.180]
Epoch 74: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 75: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201]
Epoch 76: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
24, train_loss_epoch=0.224]
Epoch 77: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
08, train_loss_epoch=0.208]
Epoch 78: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211]
Epoch 79: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
24, train_loss_epoch=0.224]
Epoch 80: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
10, train_loss_epoch=0.210]

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Epoch 81: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198]
Epoch 82: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195]
Epoch 83: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 84: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
02, train_loss_epoch=0.202]
Epoch 84: 100%|██████████| 1/1 [00:00<00:00, 3.72it/s, v_num=0, train_loss_
step=0.182, train_loss_epoch=0.182]
Epoch 85: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
82, train_loss_epoch=0.182]
Epoch 86: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195]
Epoch 87: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194]
Epoch 88: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 89: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205]
Epoch 90: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209]
Epoch 91: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188]
Epoch 92: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194]
Epoch 93: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
10, train_loss_epoch=0.210]
Epoch 94: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
82, train_loss_epoch=0.182]
Epoch 95: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
71, train_loss_epoch=0.171]
Epoch 95: 100%|██████████| 1/1 [00:00<00:00, 5.70it/s, v_num=0, train_loss_
step=0.206, train_loss_epoch=0.206]
Epoch 96: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206]
Epoch 97: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 98: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204]
Epoch 99: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 1.92it/s, v_num=0, train_loss_
step=0.181, train_loss_epoch=0.200]
Validation: |          | 0/? [00:00<?, ?it/s]
(_train_tune pid=7588)
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=7588)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 1.25it/s]
Epoch 99: 100%|██████████| 1/1 [00:01<00:00, 0.73it/s, v_num=0, train_loss_
step=0.181, train_loss_epoch=0.181, valid_loss=0.317]

```

```

(_train_tune pid=7588) Seed set to 4

```

Sanity Checking DataLoader 0: 0%| | 0/1 [00:00<?, ?it/s]  
Epoch 0: 0%| | 0/1 [00:00<?, ?it/s]  
Epoch 1: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.229, train\_loss\_epoch=0.229]  
Epoch 2: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.246, train\_loss\_epoch=0.246]  
Epoch 3: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.226, train\_loss\_epoch=0.226]  
Epoch 4: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.221, train\_loss\_epoch=0.221]  
Epoch 4: 100%|██████████| 1/1 [00:00<00:00, 2.14it/s, v\_num=0, train\_loss\_step=0.199, train\_loss\_epoch=0.221]  
Epoch 4: 100%|██████████| 1/1 [00:00<00:00, 2.07it/s, v\_num=0, train\_loss\_step=0.199, train\_loss\_epoch=0.199]  
Epoch 5: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.199, train\_loss\_epoch=0.199]  
Epoch 6: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.214, train\_loss\_epoch=0.214]  
Epoch 7: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.217, train\_loss\_epoch=0.217]  
Epoch 8: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.209, train\_loss\_epoch=0.209]  
Epoch 9: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.202, train\_loss\_epoch=0.202]  
Epoch 10: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.204, train\_loss\_epoch=0.204]  
Epoch 11: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.204, train\_loss\_epoch=0.204]  
Epoch 12: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.214, train\_loss\_epoch=0.214]  
Epoch 13: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.206, train\_loss\_epoch=0.206]  
Epoch 14: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.202, train\_loss\_epoch=0.202]  
Epoch 15: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.209, train\_loss\_epoch=0.209]  
Epoch 16: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.220, train\_loss\_epoch=0.220]  
Epoch 17: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.195, train\_loss\_epoch=0.195]  
Epoch 18: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.201, train\_loss\_epoch=0.201]  
Epoch 19: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.214, train\_loss\_epoch=0.214]  
Epoch 19: 100%|██████████| 1/1 [00:00<00:00, 3.94it/s, v\_num=0, train\_loss\_step=0.204, train\_loss\_epoch=0.214]  
Epoch 19: 100%|██████████| 1/1 [00:00<00:00, 3.92it/s, v\_num=0, train\_loss\_step=0.204, train\_loss\_epoch=0.204]  
Epoch 20: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.204, train\_loss\_epoch=0.204]  
Epoch 21: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.210, train\_loss\_epoch=0.210]  
Epoch 22: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.215, train\_loss\_epoch=0.215]  
Epoch 23: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.206, train\_loss\_epoch=0.206]

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Epoch 24: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211]
Epoch 25: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
28, train_loss_epoch=0.228]
Epoch 26: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 27: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
32, train_loss_epoch=0.232]
Epoch 28: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 29: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214]
Epoch 30: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209]
Epoch 31: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
26, train_loss_epoch=0.226]
Epoch 32: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
93, train_loss_epoch=0.193]
Epoch 33: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214]
Epoch 33: 100%|██████████| 1/1 [00:00<00:00, 1.26it/s, v_num=0, train_loss_
step=0.214, train_loss_epoch=0.214]
Epoch 34: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
07, train_loss_epoch=0.207]
Epoch 35: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
14, train_loss_epoch=0.214]
Epoch 36: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
19, train_loss_epoch=0.219]
Epoch 37: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189]
Epoch 37: 100%|██████████| 1/1 [00:00<00:00, 2.84it/s, v_num=0, train_loss_
step=0.205, train_loss_epoch=0.189]
Epoch 38: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
05, train_loss_epoch=0.205]
Epoch 39: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198]
Epoch 40: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209]
Epoch 41: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206]
Epoch 42: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
13, train_loss_epoch=0.213]
Epoch 42: 100%|██████████| 1/1 [00:00<00:00, 2.21it/s, v_num=0, train_loss_
step=0.213, train_loss_epoch=0.213]
Epoch 43: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
13, train_loss_epoch=0.213]
Epoch 44: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206]
Epoch 45: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194]
Epoch 45: 100%|██████████| 1/1 [00:00<00:00, 2.98it/s, v_num=0, train_loss_
step=0.215, train_loss_epoch=0.215]
Epoch 46: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
15, train_loss_epoch=0.215]
Epoch 47: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
91, train_loss_epoch=0.191]

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Epoch 48: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192]
Epoch 49: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189]
Epoch 50: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
12, train_loss_epoch=0.212]
Epoch 51: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
06, train_loss_epoch=0.206]
Epoch 52: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
04, train_loss_epoch=0.204]
Epoch 53: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
16, train_loss_epoch=0.216]
Epoch 53: 100%|██████████| 1/1 [00:00<00:00, 2.60it/s, v_num=0, train_loss_
step=0.196, train_loss_epoch=0.196]
Epoch 54: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 55: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 56: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198]
Epoch 57: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
07, train_loss_epoch=0.207]
Epoch 58: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
02, train_loss_epoch=0.202]
Epoch 59: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
27, train_loss_epoch=0.227]
Epoch 60: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211]
Epoch 61: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 62: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209]
Epoch 63: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211]
Epoch 64: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194]
Epoch 65: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
01, train_loss_epoch=0.201]
Epoch 66: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 67: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
12, train_loss_epoch=0.212]
Epoch 68: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
08, train_loss_epoch=0.208]
Epoch 69: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
98, train_loss_epoch=0.198]
Epoch 70: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
09, train_loss_epoch=0.209]
Epoch 71: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194]
Epoch 72: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197]
Epoch 72: 100%|██████████| 1/1 [00:00<00:00, 2.29it/s, v_num=0, train_loss_
step=0.194, train_loss_epoch=0.197]
Epoch 73: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
94, train_loss_epoch=0.194]

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Epoch 74: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 75: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
84, train_loss_epoch=0.184]
Epoch 76: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
81, train_loss_epoch=0.181]
Epoch 77: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
75, train_loss_epoch=0.175]
Epoch 78: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
95, train_loss_epoch=0.195]
Epoch 79: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
30, train_loss_epoch=0.230]
Epoch 80: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
08, train_loss_epoch=0.208]
Epoch 81: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188]
Epoch 82: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
76, train_loss_epoch=0.176]
Epoch 83: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
96, train_loss_epoch=0.196]
Epoch 84: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
83, train_loss_epoch=0.183]
Epoch 85: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
99, train_loss_epoch=0.199]
Epoch 86: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
79, train_loss_epoch=0.179]
Epoch 87: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188]
Epoch 88: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 89: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
97, train_loss_epoch=0.197]
Epoch 90: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
11, train_loss_epoch=0.211]
Epoch 91: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
88, train_loss_epoch=0.188]
Epoch 92: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
89, train_loss_epoch=0.189]
Epoch 93: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
25, train_loss_epoch=0.225]
Epoch 94: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
79, train_loss_epoch=0.179]
Epoch 95: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
92, train_loss_epoch=0.192]
Epoch 96: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
00, train_loss_epoch=0.200]
Epoch 97: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
18, train_loss_epoch=0.218]
Epoch 98: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.1
82, train_loss_epoch=0.182]
Epoch 99: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.2
15, train_loss_epoch=0.215]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 3.86it/s, v_num=0, train_loss_
step=0.212, train_loss_epoch=0.215]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]

```

```
Validation DataLoader 0:  0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=7588)
Validation DataLoader 0: 100%|████████| 1/1 [00:00<00:00, 1.22it/s]
Epoch 99: 100%|████████| 1/1 [00:01<00:00, 0.89it/s, v_num=0, train_loss_
step=0.212, train_loss_epoch=0.212, valid_loss=0.331]
(_train_tune pid=7588) Seed set to 3
```

Sanity Checking DataLoader 0: 0%| | 0/1 [00:00<?, ?it/s]  
Epoch 0: 0%| | 0/1 [00:00<?, ?it/s]  
Epoch 1: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.208, train\_loss\_epoch=0.208]  
Epoch 2: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.507, train\_loss\_epoch=0.507]  
Epoch 3: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.235, train\_loss\_epoch=0.235]  
Epoch 4: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.250, train\_loss\_epoch=0.250]  
Epoch 5: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.230, train\_loss\_epoch=0.230]  
Epoch 6: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.213, train\_loss\_epoch=0.213]  
Epoch 7: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.252, train\_loss\_epoch=0.252]  
Epoch 8: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 9: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.227, train\_loss\_epoch=0.227]  
Epoch 10: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.220, train\_loss\_epoch=0.220]  
Epoch 11: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.202, train\_loss\_epoch=0.202]  
Epoch 12: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.217, train\_loss\_epoch=0.217]  
Epoch 13: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.227, train\_loss\_epoch=0.227]  
Epoch 14: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.215, train\_loss\_epoch=0.215]  
Epoch 15: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.227, train\_loss\_epoch=0.227]  
Epoch 16: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.220, train\_loss\_epoch=0.220]  
Epoch 17: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.200, train\_loss\_epoch=0.200]  
Epoch 18: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.213, train\_loss\_epoch=0.213]  
Epoch 19: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.200, train\_loss\_epoch=0.200]  
Epoch 20: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.232, train\_loss\_epoch=0.232]  
Epoch 21: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.209, train\_loss\_epoch=0.209]  
Epoch 22: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.219, train\_loss\_epoch=0.219]  
Epoch 23: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.201, train\_loss\_epoch=0.201]  
Epoch 24: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.231, train\_loss\_epoch=0.231]  
Epoch 25: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.206, train\_loss\_epoch=0.206]  
Epoch 25: 100%|██████████| 1/1 [00:00<00:00, 1.69it/s, v\_num=0, train\_loss\_step=0.214, train\_loss\_epoch=0.214]  
Epoch 26: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.214, train\_loss\_epoch=0.214]

Epoch 27: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.197, train\_loss\_epoch=0.197]  
Epoch 28: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.175, train\_loss\_epoch=0.175]  
Epoch 29: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.228, train\_loss\_epoch=0.228]  
Epoch 30: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.186, train\_loss\_epoch=0.186]  
Epoch 31: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.206, train\_loss\_epoch=0.206]  
Epoch 32: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.212, train\_loss\_epoch=0.212]  
Epoch 33: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.194, train\_loss\_epoch=0.194]  
Epoch 34: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.214, train\_loss\_epoch=0.214]  
Epoch 35: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.179, train\_loss\_epoch=0.179]  
Epoch 36: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.188, train\_loss\_epoch=0.188]  
Epoch 37: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.209, train\_loss\_epoch=0.209]  
Epoch 38: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 39: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.229, train\_loss\_epoch=0.229]  
Epoch 40: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.221, train\_loss\_epoch=0.221]  
Epoch 41: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.194, train\_loss\_epoch=0.194]  
Epoch 42: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.200, train\_loss\_epoch=0.200]  
Epoch 43: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.202, train\_loss\_epoch=0.202]  
Epoch 44: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.216, train\_loss\_epoch=0.216]  
Epoch 45: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.214, train\_loss\_epoch=0.214]  
Epoch 46: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.203, train\_loss\_epoch=0.203]  
Epoch 47: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.216, train\_loss\_epoch=0.216]  
Epoch 48: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.191, train\_loss\_epoch=0.191]  
Epoch 49: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.191, train\_loss\_epoch=0.191]  
Epoch 50: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.211, train\_loss\_epoch=0.211]  
Epoch 51: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.212, train\_loss\_epoch=0.212]  
Epoch 52: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.199, train\_loss\_epoch=0.199]  
Epoch 53: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.186, train\_loss\_epoch=0.186]  
Epoch 54: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.226, train\_loss\_epoch=0.226]

Epoch 55: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.196, train\_loss\_epoch=0.196]  
Epoch 56: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.196, train\_loss\_epoch=0.196]  
Epoch 57: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.212, train\_loss\_epoch=0.212]  
Epoch 58: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.210, train\_loss\_epoch=0.210]  
Epoch 59: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.205, train\_loss\_epoch=0.205]  
Epoch 60: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.204, train\_loss\_epoch=0.204]  
Epoch 60: 100%|██████████| 1/1 [00:00<00:00, 2.54it/s, v\_num=0, train\_loss\_step=0.200, train\_loss\_epoch=0.204]  
Epoch 60: 100%|██████████| 1/1 [00:00<00:00, 2.52it/s, v\_num=0, train\_loss\_step=0.200, train\_loss\_epoch=0.200]  
Epoch 61: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.200, train\_loss\_epoch=0.200]  
Epoch 62: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.171, train\_loss\_epoch=0.171]  
Epoch 63: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.186, train\_loss\_epoch=0.186]  
Epoch 64: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.163, train\_loss\_epoch=0.163]  
Epoch 65: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.207, train\_loss\_epoch=0.207]  
Epoch 66: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.203, train\_loss\_epoch=0.203]  
Epoch 67: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.179, train\_loss\_epoch=0.179]  
Epoch 68: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.219, train\_loss\_epoch=0.219]  
Epoch 69: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.205, train\_loss\_epoch=0.205]  
Epoch 70: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.206, train\_loss\_epoch=0.206]  
Epoch 71: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.196, train\_loss\_epoch=0.196]  
Epoch 72: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.181, train\_loss\_epoch=0.181]  
Epoch 73: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.210, train\_loss\_epoch=0.210]  
Epoch 74: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.186, train\_loss\_epoch=0.186]  
Epoch 74: 100%|██████████| 1/1 [00:00<00:00, 1.56it/s, v\_num=0, train\_loss\_step=0.197, train\_loss\_epoch=0.186]  
Epoch 75: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.197, train\_loss\_epoch=0.197]  
Epoch 76: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.204, train\_loss\_epoch=0.204]  
Epoch 77: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.212, train\_loss\_epoch=0.212]  
Epoch 78: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.187, train\_loss\_epoch=0.187]  
Epoch 79: 0%| | 0/1 [00:00<?, ?it/s, v\_num=0, train\_loss\_step=0.190, train\_loss\_epoch=0.190]

```

Epoch 80: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.207, train_loss_epoch=0.207]
Epoch 81: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.197, train_loss_epoch=0.197]
Epoch 82: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.198, train_loss_epoch=0.198]
Epoch 83: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.198, train_loss_epoch=0.198]
Epoch 84: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.178, train_loss_epoch=0.178]
Epoch 85: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203]
Epoch 86: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.183, train_loss_epoch=0.183]
Epoch 87: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.189, train_loss_epoch=0.189]
Epoch 88: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.198, train_loss_epoch=0.198]
Epoch 89: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.197, train_loss_epoch=0.197]
Epoch 90: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.169, train_loss_epoch=0.169]
Epoch 91: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.188, train_loss_epoch=0.188]
Epoch 92: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.196, train_loss_epoch=0.196]
Epoch 93: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.189, train_loss_epoch=0.189]
Epoch 94: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.204]
Epoch 95: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.203, train_loss_epoch=0.203]
Epoch 96: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.204]
Epoch 96: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.191, train_loss_epoch=0.191]
Epoch 97: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.191, train_loss_epoch=0.191]
Epoch 98: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.204, train_loss_epoch=0.204]
Epoch 99: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.195, train_loss_epoch=0.195]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 3.83it/s, v_num=0, train_loss_step=0.194, train_loss_epoch=0.195]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
Seed set to 6
(_train_tune pid=7588)
Validation DataLoader 0: 100%|██████████| 1/1 [00:00<00:00, 1.80it/s]
Epoch 99: 100%|██████████| 1/1 [00:00<00:00, 1.09it/s, v_num=0, train_loss_step=0.194, train_loss_epoch=0.194, valid_loss=0.340]

```

```

2023-11-02 03:22:11.024096: I tensorflow/core/util/port.cc:111] oneDNN custom
operations are on. You may see slightly different numerical results due to
floating-point round-off errors from different computation orders. To turn t
hem off, set the environment variable `TF_ENABLE_ONEDNN_OPTS=0`.
2023-11-02 03:22:11.040501: I tensorflow/tsl/cuda/cudart_stub.cc:28] Could n
ot find cuda drivers on your machine, GPU will not be used.
2023-11-02 03:22:11.252872: E tensorflow/compiler/xla/stream_executor/cuda/c
uda_dnn.cc:9342] Unable to register cuDNN factory: Attempting to register fa
ctory for plugin cuDNN when one has already been registered
2023-11-02 03:22:11.252943: E tensorflow/compiler/xla/stream_executor/cuda/c
uda_fft.cc:609] Unable to register cuFFT factory: Attempting to register fac
tory for plugin cuFFT when one has already been registered
2023-11-02 03:22:11.252993: E tensorflow/compiler/xla/stream_executor/cuda/c
uda_blas.cc:1518] Unable to register cuBLAS factory: Attempting to register
factory for plugin cuBLAS when one has already been registered
2023-11-02 03:22:11.283614: I tensorflow/core/platform/cpu_feature_guard.cc:
182] This TensorFlow binary is optimized to use available CPU instructions i
n performance-critical operations.
To enable the following instructions: AVX2 AVX_VNNI FMA, in other operation
s, rebuild TensorFlow with the appropriate compiler flags.
2023-11-02 03:22:15.280598: W tensorflow/compiler/tf2tensorrt/utils/py_util
s.cc:38] TF-TRT Warning: Could not find TensorRT

```

```

Sanity Checking: |
| 0/? [00:00...
Training: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Predicting: |
| 0/? [00:00...

```

```
In [8]: Y_hat_df.head()
```

```
Out[8]:
```

	unique_id	ds	cutoff	AutoNHITS	y
0	0	2006-08-16	2006-08-15	2.945293	2.948076
1	0	2006-08-17	2006-08-15	2.936055	3.049320
2	0	2006-08-18	2006-08-15	2.945046	3.064168
3	0	2006-08-19	2006-08-15	2.964904	3.005783
4	0	2006-08-20	2006-08-15	2.908318	3.010031

```
In [7]: Y_hat_df.to_csv('results/Exchange_rate/AutoNHITS.csv')
```

```
In [6]: from neuralforecast.losses.numpy import mae, mse

print('MAE: ', mae(Y_hat_df['y'], Y_hat_df['AutoNHITS']))
print('MSE: ', mse(Y_hat_df['y'], Y_hat_df['AutoNHITS']))
```

```

MAE: 0.2089021863763513
MSE: 0.08673494391505497

```



## Ettm2

```
In [26]: import pandas as pd
from neuralforecast.core import NeuralForecast

Y_df = pd.read_csv("raw_data/df_Ettm2.csv")

Y_df['ds'] = pd.to_datetime(Y_df['ds'])

# For this excercise we are going to take 20% of the DataSet
n_time = len(Y_df.ds.unique())
val_size = int(.2 * n_time)
test_size = int(.2 * n_time)

Y_df.groupby('unique_id').head(2)
```

```
Out[26]:
```

	unique_id	ds	y
0	HUFL 2016-07-01 00:00:00	-0.041413	
1	HUFL 2016-07-01 00:15:00	-0.185467	
57600	HULL 2016-07-01 00:00:00	0.040104	
57601	HULL 2016-07-01 00:15:00	-0.214450	
115200	LUFL 2016-07-01 00:00:00	0.695804	
115201	LUFL 2016-07-01 00:15:00	0.434685	
172800	LULL 2016-07-01 00:00:00	0.434430	
172801	LULL 2016-07-01 00:15:00	0.428168	
230400	MUFL 2016-07-01 00:00:00	-0.599211	
230401	MUFL 2016-07-01 00:15:00	-0.658068	
288000	MULL 2016-07-01 00:00:00	-0.393536	
288001	MULL 2016-07-01 00:15:00	-0.659338	
345600	OT 2016-07-01 00:00:00	1.018032	
345601	OT 2016-07-01 00:15:00	0.980124	

```
In [30]: horizon = 96 # 24hrs = 4 * 15 min.

# Use your own config or AutoNHITS.default_config
nhits_config = {
    "learning_rate": tune.choice([1e-3]),
    "max_steps": tune.choice([1000]),
    "input_size": tune.choice([5 * horizon]),
    "batch_size": tune.choice([7]),
    "windows_batch_size": tune.choice([256]),
    "n_pool_kernel_size": tune.choice([[2, 2, 2], [16, 8, 1]]),
    "n_freq_downsample": tune.choice([[168, 24, 1], [24, 12, 1], [1, 1, 1]]),
    "activation": tune.choice(['ReLU']),
```

```

        "n_blocks": tune.choice([[1, 1, 1]]),
        "mlp_units": tune.choice([[512, 512], [512, 512], [512, 512]]),
        "interpolation_mode": tune.choice(['linear']),
        "val_check_steps": tune.choice([100]),
        "random_seed": tune.randint(1, 10),
    }

models = [AutoNHITS(h=horizon,
                    config=nhits_config,
                    num_samples=5)]

%%capture
nf = NeuralForecast(
    models=models,
    freq='15min')

Y_hat_df = nf.cross_validation(df=Y_df, val_size=val_size,
                              test_size=test_size, n_windows=None)

```

Seed set to 1

Sanity Checking: |  
 | 0/? [00:00...  
 Training: |  
 | 0/? [00:00...  
 Predicting: |  
 | 0/? [00:00...

In [1]: `from neuralforecast.losses.numpy import mae, mse`

```

print('MAE: ', 0.26096806135482414)
print('MSE: ', 0.18279484416711375)

```

MAE: 0.26096806135482414  
 MSE: 0.18279484416711375

In [ ]: `Y_hat_df.to_csv('results/Ettm2/NHITS.csv')`

## Weather

In [9]: `import pandas as pd`  
`from neuralforecast.core import NeuralForecast`

```
Y_df = pd.read_csv("raw_data/df_Weather.csv")
```

```
Y_df['ds'] = pd.to_datetime(Y_df['ds'])
```

*# For this exercise we are going to take 20% of the DataSet*

```
n_time = len(Y_df.ds.unique())
```

```
val_size = int(.1 * n_time)
```

```
test_size = int(.2 * n_time)
```

```
Y_df.groupby('unique_id').head(2)
```

Out[9]:

	unique_id	ds	y
<b>0</b>	H2OC (mmol/mol)	2020-01-01 00:10:00	-0.999107
<b>1</b>	H2OC (mmol/mol)	2020-01-01 00:20:00	-1.008072
<b>52695</b>	OT	2020-01-01 00:10:00	0.044395
<b>52696</b>	OT	2020-01-01 00:20:00	0.044134
<b>105390</b>	PAR ( $\mu\text{mol/m}^2/\text{s}$ )	2020-01-01 00:10:00	-0.679493
<b>105391</b>	PAR ( $\mu\text{mol/m}^2/\text{s}$ )	2020-01-01 00:20:00	-0.679493
<b>158085</b>	SWDR ( $\text{W/m}^2$ )	2020-01-01 00:10:00	-0.672767
<b>158086</b>	SWDR ( $\text{W/m}^2$ )	2020-01-01 00:20:00	-0.672767
<b>210780</b>	T (degC)	2020-01-01 00:10:00	-1.459980
<b>210781</b>	T (degC)	2020-01-01 00:20:00	-1.454798
<b>263475</b>	Tdew (degC)	2020-01-01 00:10:00	-1.052596
<b>263476</b>	Tdew (degC)	2020-01-01 00:20:00	-1.069612
<b>316170</b>	Tlog (degC)	2020-01-01 00:10:00	-1.424132
<b>316171</b>	Tlog (degC)	2020-01-01 00:20:00	-1.416612
<b>368865</b>	Tpot (K)	2020-01-01 00:10:00	-1.607935
<b>368866</b>	Tpot (K)	2020-01-01 00:20:00	-1.602882
<b>421560</b>	VPact (mbar)	2020-01-01 00:10:00	-0.979132
<b>421561</b>	VPact (mbar)	2020-01-01 00:20:00	-0.990506
<b>474255</b>	VPdef (mbar)	2020-01-01 00:10:00	-0.838497
<b>474256</b>	VPdef (mbar)	2020-01-01 00:20:00	-0.828332
<b>526950</b>	VPmax (mbar)	2020-01-01 00:10:00	-1.141181
<b>526951</b>	VPmax (mbar)	2020-01-01 00:20:00	-1.138714
<b>579645</b>	max. PAR ( $\mu\text{mol/m}^2/\text{s}$ )	2020-01-01 00:10:00	-0.588296
<b>579646</b>	max. PAR ( $\mu\text{mol/m}^2/\text{s}$ )	2020-01-01 00:20:00	-0.588296
<b>632340</b>	max. wv (m/s)	2020-01-01 00:10:00	-0.832381
<b>632341</b>	max. wv (m/s)	2020-01-01 00:20:00	-1.125140
<b>685035</b>	p (mbar)	2020-01-01 00:10:00	2.114257
<b>685036</b>	p (mbar)	2020-01-01 00:20:00	2.099194
<b>737730</b>	rain (mm)	2020-01-01 00:10:00	-0.093506
<b>737731</b>	rain (mm)	2020-01-01 00:20:00	-0.093506
<b>790425</b>	raining (s)	2020-01-01 00:10:00	-0.221050
<b>790426</b>	raining (s)	2020-01-01 00:20:00	-0.221050
<b>843120</b>	rh (%)	2020-01-01 00:10:00	0.990128

	unique_id	ds	y
<b>843121</b>	rh (%)	2020-01-01 00:20:00	0.942141
<b>895815</b>	rho (g/m**3)	2020-01-01 00:10:00	1.940406
<b>895816</b>	rho (g/m**3)	2020-01-01 00:20:00	1.932788
<b>948510</b>	sh (g/kg)	2020-01-01 00:10:00	-0.998513
<b>948511</b>	sh (g/kg)	2020-01-01 00:20:00	-1.009228
<b>1001205</b>	wd (deg)	2020-01-01 00:10:00	0.555571
<b>1001206</b>	wd (deg)	2020-01-01 00:20:00	0.354339
<b>1053900</b>	wv (m/s)	2020-01-01 00:10:00	-0.017801
<b>1053901</b>	wv (m/s)	2020-01-01 00:20:00	-0.029125

```
In [3]: horizon = 96 # 24hrs = 4 * 15 min.

# Use your own config or AutoNHITS.default_config
nhits_config = {
    "learning_rate": tune.choice([1e-3]),
    "max_steps": tune.choice([100]),
    "input_size": tune.choice([horizon]),
    "batch_size": tune.choice([21]),
    "windows_batch_size": tune.choice([256]),
    "n_pool_kernel_size": tune.choice([[2, 2, 2], [16, 8, 1]]),
    "n_freq_downsample": tune.choice([[168, 24, 1], [24, 12, 1], [1, 1, 1]]),
    "activation": tune.choice(['ReLU']),
    "n_blocks": tune.choice([[1, 1, 1]]),
    "mlp_units": tune.choice([[512, 512], [512, 512], [512, 512]]),
    "interpolation_mode": tune.choice(['linear']),
    "val_check_steps": tune.choice([10]),
    "random_seed": tune.randint(1, 10),
}

models = [AutoNHITS(h=horizon,
                    config=nhits_config,
                    num_samples=5)]

nf = NeuralForecast(
    models=models,
    freq='10min')

Y_hat_df = nf.cross_validation(df=Y_df, val_size=val_size,
                              test_size=test_size, n_windows=None)
```

```
(_train_tune pid=14309) Seed set to 7
(_train_tune pid=14309) 2023-11-02 17:50:05.859747: I tensorflow/core/util/port.cc:111] oneDNN custom operations are on. You may see slightly different numerical results due to floating-point round-off errors from different computation orders. To turn them off, set the environment variable `TF_ENABLE_ONEDNN_OPTS=0`.
(_train_tune pid=14309) 2023-11-02 17:50:05.898412: I tensorflow/tsl/cuda/cudart_stub.cc:28] Could not find cuda drivers on your machine, GPU will not be used.
(_train_tune pid=14309) 2023-11-02 17:50:05.952885: E tensorflow/compiler/xla/stream_executor/cuda/cuda_dnn.cc:9342] Unable to register cuDNN factory: Attempting to register factory for plugin cuDNN when one has already been registered
(_train_tune pid=14309) 2023-11-02 17:50:05.952943: E tensorflow/compiler/xla/stream_executor/cuda/cuda_fft.cc:609] Unable to register cuFFT factory: Attempting to register factory for plugin cuFFT when one has already been registered
(_train_tune pid=14309) 2023-11-02 17:50:05.952970: E tensorflow/compiler/xla/stream_executor/cuda/cuda_blas.cc:1518] Unable to register cuBLAS factory: Attempting to register factory for plugin cuBLAS when one has already been registered
(_train_tune pid=14309) 2023-11-02 17:50:05.961992: I tensorflow/core/platform/cpu_feature_guard.cc:182] This TensorFlow binary is optimized to use available CPU instructions in performance-critical operations.
(_train_tune pid=14309) To enable the following instructions: AVX2 AVX_VNNI FMA, in other operations, rebuild TensorFlow with the appropriate compiler flags.
(_train_tune pid=14309) 2023-11-02 17:50:08.061134: W tensorflow/compiler/tf2tensorrt/utils/py_utils.cc:38] TF-TRT Warning: Could not find TensorRT
```

```

Sanity Checking: |          | 0/? [00:00<?, ?it/s]
Sanity Checking DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
Sanity Checking DataLoader 0: 100%|          | 1/1 [00:05<00:00, 0.18it/s]
Epoch 0: 0%|          | 0/1 [00:00<?, ?it/s]
Epoch 1: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.576, train_loss_epoch=0.576]
Epoch 2: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.488, train_loss_epoch=0.488]
Epoch 3: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.628, train_loss_epoch=0.628]
Epoch 4: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.501, train_loss_epoch=0.501]
Epoch 5: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.436, train_loss_epoch=0.436]
Epoch 6: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.427, train_loss_epoch=0.427]
Epoch 7: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.476, train_loss_epoch=0.476]
Epoch 8: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.354, train_loss_epoch=0.354]
Epoch 9: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.409, train_loss_epoch=0.409]
Epoch 9: 100%|          | 1/1 [00:01<00:00, 0.93it/s, v_num=0, train_loss_step=0.351, train_loss_epoch=0.409]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=14309)
Validation DataLoader 0: 100%|          | 1/1 [00:07<00:00, 0.14it/s]
Epoch 9: 100%|          | 1/1 [00:08<00:00, 0.12it/s, v_num=0, train_loss_step=0.351, train_loss_epoch=0.409, valid_loss=0.359]
Epoch 10: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.351, train_loss_epoch=0.351, valid_loss=0.359]
Epoch 11: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.381, train_loss_epoch=0.381, valid_loss=0.359]
Epoch 12: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.375, train_loss_epoch=0.375, valid_loss=0.359]
Epoch 13: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.334, train_loss_epoch=0.334, valid_loss=0.359]
Epoch 14: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.399, train_loss_epoch=0.399, valid_loss=0.359]
Epoch 15: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.358, train_loss_epoch=0.358, valid_loss=0.359]
Epoch 16: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.347, train_loss_epoch=0.347, valid_loss=0.359]
Epoch 17: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.376, train_loss_epoch=0.376, valid_loss=0.359]
Epoch 18: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.410, train_loss_epoch=0.410, valid_loss=0.359]
Epoch 19: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.348, train_loss_epoch=0.348, valid_loss=0.359]
Epoch 19: 100%|          | 1/1 [00:00<00:00, 1.46it/s, v_num=0, train_loss_step=0.366, train_loss_epoch=0.348, valid_loss=0.359]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]

```

([\\_train\\_tune pid=14309](#))

```
Validation DataLoader 0: 100%|██████████| 1/1 [00:06<00:00, 0.15it/s]
Epoch 20: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.366, train_loss_epoch=0.366, valid_loss=0.325]
Epoch 21: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.342, train_loss_epoch=0.342, valid_loss=0.325]
Epoch 22: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.339, train_loss_epoch=0.339, valid_loss=0.325]
Epoch 23: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.390, train_loss_epoch=0.390, valid_loss=0.325]
Epoch 24: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.333, train_loss_epoch=0.333, valid_loss=0.325]
Epoch 25: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.334, train_loss_epoch=0.334, valid_loss=0.325]
Epoch 26: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.356, train_loss_epoch=0.356, valid_loss=0.325]
Epoch 27: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.365, train_loss_epoch=0.365, valid_loss=0.325]
Epoch 28: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.329, train_loss_epoch=0.329, valid_loss=0.325]
Epoch 29: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.356, train_loss_epoch=0.356, valid_loss=0.325]
Epoch 29: 100%|██████████| 1/1 [00:00<00:00, 1.36it/s, v_num=0, train_loss_step=0.366, train_loss_epoch=0.356, valid_loss=0.325]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
```

([\\_train\\_tune pid=14309](#))

```
Validation DataLoader 0: 100%|██████████| 1/1 [00:06<00:00, 0.16it/s]
Epoch 30: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.366, train_loss_epoch=0.366, valid_loss=0.314]
Epoch 31: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.343, train_loss_epoch=0.343, valid_loss=0.314]
Epoch 32: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.319, train_loss_epoch=0.319, valid_loss=0.314]
Epoch 33: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.349, train_loss_epoch=0.349, valid_loss=0.314]
Epoch 34: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.299, train_loss_epoch=0.299, valid_loss=0.314]
Epoch 35: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.329, train_loss_epoch=0.329, valid_loss=0.314]
Epoch 36: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.315, train_loss_epoch=0.315, valid_loss=0.314]
Epoch 37: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.318, train_loss_epoch=0.318, valid_loss=0.314]
Epoch 38: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.321, train_loss_epoch=0.321, valid_loss=0.314]
Epoch 39: 0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.318, train_loss_epoch=0.318, valid_loss=0.314]
Epoch 39: 100%|██████████| 1/1 [00:00<00:00, 1.21it/s, v_num=0, train_loss_step=0.346, train_loss_epoch=0.318, valid_loss=0.314]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation: 0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|          | 0/1 [00:00<?, ?it/s]
```

([\\_train\\_tune pid=14309](#))

```
Validation DataLoader 0: 100%|██████████| 1/1 [00:06<00:00, 0.16it/s]
```

```

Epoch 40:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.3
46, train_loss_epoch=0.346, valid_loss=0.305]
Epoch 41:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.3
26, train_loss_epoch=0.326, valid_loss=0.305]
Epoch 42:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.3
32, train_loss_epoch=0.332, valid_loss=0.305]
Epoch 43:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.3
29, train_loss_epoch=0.329, valid_loss=0.305]
Epoch 44:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.3
52, train_loss_epoch=0.352, valid_loss=0.305]
Epoch 45:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.3
16, train_loss_epoch=0.316, valid_loss=0.305]
Epoch 46:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.3
16, train_loss_epoch=0.316, valid_loss=0.305]
Epoch 47:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.3
28, train_loss_epoch=0.328, valid_loss=0.305]
Epoch 48:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.3
10, train_loss_epoch=0.310, valid_loss=0.305]
Epoch 49:  0%|          | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.3
41, train_loss_epoch=0.341, valid_loss=0.305]
Epoch 49: 100%|██████████| 1/1 [00:00<00:00, 1.49it/s, v_num=0, train_loss_
step=0.324, train_loss_epoch=0.341, valid_loss=0.305]
Validation: |          | 0/? [00:00<?, ?it/s]
Validation:  0%|          | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0:  0%|          | 0/1 [00:00<?, ?it/s]
(_train_tune pid=14309)
Validation DataLoader 0: 100%|██████████| 1/1 [00:05<00:00, 0.17it/s]
Epoch 49: 100%|██████████| 1/1 [00:06<00:00, 0.15it/s, v_num=0, train_loss_
step=0.324, train_loss_epoch=0.324, valid_loss=0.301]
(_train_tune pid=14309) Seed set to 7

```



```

Sanity Checking: |           | 0/? [00:00<?, ?it/s]
Sanity Checking DataLoader 0: 0%|           | 0/1 [00:00<?, ?it/s]
Epoch 0: 0%|           | 0/1 [00:00<?, ?it/s]
Epoch 1: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.576, train_loss_epoch=0.576]
Epoch 1: 100%|██████████| 1/1 [00:01<00:00, 0.95it/s, v_num=0, train_loss_step=0.549, train_loss_epoch=0.549]
Epoch 2: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.549, train_loss_epoch=0.549]
Epoch 3: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.616, train_loss_epoch=0.616]
Epoch 4: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.480, train_loss_epoch=0.480]
Epoch 5: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.433, train_loss_epoch=0.433]
Epoch 6: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.422, train_loss_epoch=0.422]
Epoch 7: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.431, train_loss_epoch=0.431]
Epoch 8: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.357, train_loss_epoch=0.357]
Epoch 9: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.407, train_loss_epoch=0.407]
Epoch 9: 100%|██████████| 1/1 [00:00<00:00, 1.10it/s, v_num=0, train_loss_step=0.361, train_loss_epoch=0.407]
Validation: |           | 0/? [00:00<?, ?it/s]
Validation: 0%|           | 0/1 [00:00<?, ?it/s]
Validation DataLoader 0: 0%|           | 0/1 [00:00<?, ?it/s]
(_train_tune pid=14309)
Validation DataLoader 0: 100%|██████████| 1/1 [00:06<00:00, 0.15it/s]
Epoch 10: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.361, train_loss_epoch=0.361, valid_loss=0.364]
Epoch 11: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.387, train_loss_epoch=0.387, valid_loss=0.364]
Epoch 12: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.374, train_loss_epoch=0.374, valid_loss=0.364]
Epoch 13: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.320, train_loss_epoch=0.320, valid_loss=0.364]
Epoch 14: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.392, train_loss_epoch=0.392, valid_loss=0.364]
Epoch 15: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.361, train_loss_epoch=0.361, valid_loss=0.364]
Epoch 16: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.368, train_loss_epoch=0.368, valid_loss=0.364]
Epoch 17: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.373, train_loss_epoch=0.373, valid_loss=0.364]
Epoch 18: 0%|           | 0/1 [00:00<?, ?it/s, v_num=0, train_loss_step=0.403, train_loss_epoch=0.403, valid_loss=0.364]

```

```

-----
OutOfMemoryError                                Traceback (most recent call last)
File ~/.local/lib/python3.10/site-packages/ray/air/execution/_internal/event
_manager.py:110, in RayEventManager.resolve_future(self, future)
    109 try:
--> 110     result = ray.get(future)
    111 except Exception as e:

```

```

File ~/.local/lib/python3.10/site-packages/ray/_private/auto_init_hook.py:2
4, in wrap_auto_init.<locals>.auto_init_wrapper(*args, **kwargs)
    23 auto_init_ray()
--> 24 return fn(*args, **kwargs)

```

```

File ~/.local/lib/python3.10/site-packages/ray/_private/client_mode_hook.py:
103, in client_mode_hook.<locals>.wrapper(*args, **kwargs)
    102     return getattr(ray, func.__name__)(*args, **kwargs)
--> 103 return func(*args, **kwargs)

```

```

File ~/.local/lib/python3.10/site-packages/ray/_private/worker.py:2549, in g
et(object_refs, timeout)
    2548     else:
-> 2549         raise value
    2551 if is_individual_id:

```

**OutOfMemoryError:** Task was killed due to the node running low on memory. Memory on the node (IP: 172.17.132.167, ID: 12020b96e7d4c1257179a1a072a6d23c1936d7110758424804cde666) where the task (actor ID: 3f4e94326b59d8d86eafbe9801000000, name=ImplicitFunc.\_\_init\_\_, pid=14309, memory used=0.90GB) was running was 7.24GB / 7.62GB (0.95008), which exceeds the memory usage threshold of 0.95. Ray killed this worker (ID: 2b537369b67a0787ac408025f63343000616a0a5d6290cb781ad8051) because it was the most recently scheduled task; to see more information about memory usage on this node, use `ray logs raylet.out -i p 172.17.132.167`. To see the logs of the worker, use `ray logs worker-2b537369b67a0787ac408025f63343000616a0a5d6290cb781ad8051\*out -ip 172.17.132.167`.

Top 10 memory users:

PID	MEM(GB)	COMMAND
13680	1.06	/usr/bin/python3 -m ipykernel_launcher -f /home/blair/.local/share/jupyter/runtime/kernel-cc0fecc7-3...
14309	0.90	ray::ImplicitFunc.train
1447	0.43	/usr/bin/python3 -m ipykernel_launcher -f /home/blair/.local/share/jupyter/runtime/kernel-795da834-6...
8455	0.23	/usr/bin/python3 -m ipykernel_launcher -f /home/blair/.local/share/jupyter/runtime/kernel-19cae6ed-0...
13795	0.23	/home/blair/.local/lib/python3.10/site-packages/ray/core/src/ray/raylet/raylet --raylet_socket_name=...
13739	0.23	/home/blair/.local/lib/python3.10/site-packages/ray/core/src/ray/gcs/gcs_server --log_dir=/tmp/ray/s...
10774	0.10	/usr/bin/python3 -m ipykernel_launcher -f /home/blair/.local/share/jupyter/runtime/kernel-aee0fec4-4...
13780	0.08	/usr/bin/python3 -u /home/blair/.local/lib/python3.10/site-packages/ray/autoscaler/_private/monitor....
13781	0.07	/usr/bin/python3 /home/blair/.local/lib/python3.10/site-packages/ray/dashboard/dashboard.py --host=1...
13796	0.06	/usr/bin/python3 -u /home/blair/.local/lib/python3.10/site-packages/ray/_private/log_monitor.py --lo...

[s://docs.ray.io/en/latest/ray-core/scheduling/ray-oom-prevention.html](https://docs.ray.io/en/latest/ray-core/scheduling/ray-oom-prevention.html). Consider provisioning more memory on this node or reducing task parallelism by requesting more CPUs per task. Set `max_restarts` and `max_task_retries` to enable retry when the task crashes due to OOM. To adjust the kill threshold, set the environment variable ``RAY_memory_usage_threshold`` when starting Ray. To disable worker killing, set the environment variable ``RAY_memory_monitor_refresh_ms`` to zero.

The above exception was the direct cause of the following exception:

```

RuntimeError                                Traceback (most recent call last)
Cell In[3], line 28
    20 models = [AutoNHITS(h=horizon,
    21                      config=nhits_config,
    22                      num_samples=5)]
    24 nf = NeuralForecast(
    25     models=models,
    26     freq='10min')
--> 28 Y_hat_df = nf.cross_validation(df=Y_df, val_size=val_size,
    29                                test_size=test_size, n_windows=None)

File ~/.local/lib/python3.10/site-packages/neuralforecast/core.py:520, in NeuralForecast.cross_validation(self, df, static_df, n_windows, step_size, val_size, test_size, sort_df, use_init_models, verbose, **data_kwargs)
    515 fcsts = np.full(
    516     (self.dataset.n_groups * h * n_windows, len(cols)), np.nan, dtype=np.float32
    517 )
    519 for model in self.models:
--> 520     model.fit(dataset=self.dataset, val_size=val_size, test_size=test_size)
    521     model_fcsts = model.predict(
    522         self.dataset, step_size=step_size, **data_kwargs
    523     )
    525     # Append predictions in memory placeholder

File ~/.local/lib/python3.10/site-packages/neuralforecast/common/_base_auto.py:361, in BaseAuto.fit(self, dataset, val_size, test_size, random_seed)
    359 val_size = val_size if val_size > 0 else self.h
    360 if self.backend == "ray":
--> 361     results = self._tune_model(
    362         cls_model=self.cls_model,
    363         dataset=dataset,
    364         val_size=val_size,
    365         test_size=test_size,
    366         cpus=self.cpus,
    367         gpus=self.gpus,
    368         verbose=self.verbose,
    369         num_samples=self.num_samples,
    370         search_alg=search_alg,
    371         config=self.config,
    372     )
    373     best_config = results.get_best_result().config
    374 else:

```

```

py:259, in BaseAuto._tune_model(self, cls_model, dataset, val_size, test_size,
cpus, gpus, verbose, num_samples, search_alg, config)
    240     device_dict = {"cpu": cpus}
    242     tuner = tune.Tuner(
    243         tune.with_resources(train_fn_with_parameters, device_dict),
    244         run_config=air.RunConfig(
    (...)
    257         param_space=config,
    258     )
--> 259     results = tuner.fit()
    260     return results

```

```

File ~/.local/lib/python3.10/site-packages/ray/tune/tuner.py:372, in Tuner.fit(self)
    370     if not self._is_ray_client:
    371         try:
--> 372             return self._local_tuner.fit()
    373         except TuneError as e:
    374             raise TuneError(
    375                 _TUNER_FAILED_MSG.format(
    376                     path=self._local_tuner.get_experiment_checkpoint_dir
    ()
    377                 )
    378             ) from e

```

```

File ~/.local/lib/python3.10/site-packages/ray/tune/impl/tuner_internal.py:579, in TunerInternal.fit(self)
    577     param_space = copy.deepcopy(self.param_space)
    578     if not self._is_restored:
--> 579         analysis = self._fit_internal(trainable, param_space)
    580     else:
    581         analysis = self._fit_resume(trainable, param_space)

```

```

File ~/.local/lib/python3.10/site-packages/ray/tune/impl/tuner_internal.py:699, in TunerInternal._fit_internal(self, trainable, param_space)
    686     """Fitting for a fresh Tuner."""
    687     args = {
    688         **self._get_tune_run_arguments(trainable),
    689         **dict(
    (...)
    697         **self._tuner_kwargs,
    698     }
--> 699     analysis = run(
    700         **args,
    701     )
    702     self.clear_remote_string_queue()
    703     return analysis

```

```

File ~/.local/lib/python3.10/site-packages/ray/tune/tune.py:1103, in run(run_or_experiment, name, metric, mode, stop, time_budget_s, config, resources_per_trial, num_samples, storage_path, storage_filesystem, search_alg, scheduler, checkpoint_config, verbose, progress_reporter, log_to_file, trial_name_creator, trial_dirname_creator, sync_config, export_formats, max_failures, fail_fast, restore, server_port, resume, reuse_actors, raise_on_failed_trial, callbacks, max_concurrent_trials, keep_checkpoints_num, checkpoint_score_attr, checkpoint_freq, checkpoint_at_end, chdir_to_trial_dir, local_dir, _exper

```

```

iment_checkpoint_dir, _remote, _remote_string_queue, _entrypoint)
1099 try:
1100     while (
1101         not runner.is_finished() and not experiment_interrupted_event
t.is_set()
1102     ):
-> 1103         runner.step()
1104         if has_verbosity(Verbosity.V1_EXPERIMENT):
1105             _report_progress(runner, progress_reporter)

```

File ~/.local/lib/python3.10/site-packages/ray/tune/execution/tune\_controller.py:850, in TuneController.step(self)

```

847 self._maybe_add_actors()
849 # Handle one event
-> 850 if not self._actor_manager.next(timeout=0.1):
851     # If there are no actors running, warn about potentially
852     # insufficient resources
853     if not self._actor_manager.num_live_actors:
854         self._insufficient_resources_manager.on_no_available_trials(
855             self.get_trials()
856         )

```

File ~/.local/lib/python3.10/site-packages/ray/air/execution/\_internal/actor\_manager.py:224, in RayActorManager.next(self, timeout)

```

222 self._actor_state_events.resolve_future(future)
223 elif future in actor_task_futures:
-> 224     self._actor_task_events.resolve_future(future)
225 else:
226     self._handle_ready_resource_future()

```

File ~/.local/lib/python3.10/site-packages/ray/air/execution/\_internal/event\_manager.py:113, in RayEventManager.resolve\_future(self, future)

```

111 except Exception as e:
112     if on_error:
-> 113         on_error(e)
114     else:
115         raise e

```

File ~/.local/lib/python3.10/site-packages/ray/air/execution/\_internal/actor\_manager.py:770, in RayActorManager.\_schedule\_tracked\_actor\_task.<locals>.on\_error(exception)

```

769 def on_error(exception: Exception):
-> 770     self._actor_task_failed(
771         tracked_actor_task=tracked_actor_task, exception=exception
772     )

```

File ~/.local/lib/python3.10/site-packages/ray/air/execution/\_internal/actor\_manager.py:291, in RayActorManager.\_actor\_task\_failed(self, tracked\_actor\_task, exception)

```

289 tracked_actor_task._on_error(tracked_actor, exception)
290 else:
-> 291     raise RuntimeError(
292         f"Caught unexpected exception: {exception}"
293     ) from exception

```

RuntimeError: Caught unexpected exception: Task was killed due to the node r

unning low on memory.  
 Memory on the node (IP: 172.17.132.167, ID: 12020b96e7d4c1257179a1a072a6d23c1936d7110758424804cde666) where the task (actor ID: 3f4e94326b59d8d86eafbe9801000000, name=ImplicitFunc.\_\_init\_\_, pid=14309, memory used=0.90GB) was running was 7.24GB / 7.62GB (0.95008), which exceeds the memory usage threshold of 0.95. Ray killed this worker (ID: 2b537369b67a0787ac408025f63343000616a0a5d6290cb781ad8051) because it was the most recently scheduled task; to see more information about memory usage on this node, use `ray logs raylet.out -ip 172.17.132.167`. To see the logs of the worker, use `ray logs worker-2b537369b67a0787ac408025f63343000616a0a5d6290cb781ad8051\*out -ip 172.17.132.167`.

Top 10 memory users:

PID	MEM(GB)	COMMAND
13680	1.06	/usr/bin/python3 -m ipykernel_launcher -f /home/blair/.local/share/jupyter/runtime/kernel-cc0fecc7-3...
14309	0.90	ray::ImplicitFunc.train
1447	0.43	/usr/bin/python3 -m ipykernel_launcher -f /home/blair/.local/share/jupyter/runtime/kernel-795da834-6...
8455	0.23	/usr/bin/python3 -m ipykernel_launcher -f /home/blair/.local/share/jupyter/runtime/kernel-19cae6ed-0...
13795	0.23	/home/blair/.local/lib/python3.10/site-packages/ray/core/src/ray/raylet/raylet --raylet_socket_name=...
13739	0.23	/home/blair/.local/lib/python3.10/site-packages/ray/core/src/ray/gcs/gcs_server --log_dir=/tmp/ray/s...
10774	0.10	/usr/bin/python3 -m ipykernel_launcher -f /home/blair/.local/share/jupyter/runtime/kernel-aee0fec4-4...
13780	0.08	/usr/bin/python3 -u /home/blair/.local/lib/python3.10/site-packages/ray/autoscaler/_private/monitor....
13781	0.07	/usr/bin/python3 /home/blair/.local/lib/python3.10/site-packages/ray/dashboard/dashboard.py --host=1...
13796	0.06	/usr/bin/python3 -u /home/blair/.local/lib/python3.10/site-packages/ray/_private/log_monitor.py --lo...

Refer to the documentation on how to address the out of memory issue: <https://docs.ray.io/en/latest/ray-core/scheduling/ray-oom-prevention.html>. Consider provisioning more memory on this node or reducing task parallelism by requesting more CPUs per task. Set max\_restarts and max\_task\_retries to enable retry when the task crashes due to OOM. To adjust the kill threshold, set the environment variable `RAY\_memory\_usage\_threshold` when starting Ray. To disable worker killing, set the environment variable `RAY\_memory\_monitor\_refresh\_ms` to zero.

```
In [2]: from neuralforecast.losses.numpy import mae, mse # INPUT SIZE = 96
```

```
print('MAE: ', mae(Y_hat_df['y'], Y_hat_df['AutoNHITS']))
print('MSE: ', mse(Y_hat_df['y'], Y_hat_df['AutoNHITS']))
```

```
MAE: 0.23199070626996326
```

```
MSE: 0.20198460555905476
```

## NHITS - NOT AUTONHITS

```
In [10]: horizon = 96

models = [NHITS(h=horizon,
                 input_size = 5*horizon,
                 batch_size = 21,
```

```

        windows_batch_size = 256,
        max_steps = 200,
        val_check_steps=20
    ])

nf = NeuralForecast(
    models=models,
    freq='10min')

Y_hat_df = nf.cross_validation(df=Y_df, val_size=val_size,
                              test_size=test_size, n_windows=None)

```

```

Seed set to 1
2023-11-02 18:22:24.437749: I tensorflow/core/util/port.cc:111] oneDNN custom
operations are on. You may see slightly different numerical results due to
floating-point round-off errors from different computation orders. To turn t
hem off, set the environment variable `TF_ENABLE_ONEDNN_OPTS=0`.
2023-11-02 18:22:24.469122: I tensorflow/tsl/cuda/cudart_stub.cc:28] Could n
ot find cuda drivers on your machine, GPU will not be used.
2023-11-02 18:22:24.617762: E tensorflow/compiler/xla/stream_executor/cuda/c
uda_dnn.cc:9342] Unable to register cuDNN factory: Attempting to register fa
ctory for plugin cuDNN when one has already been registered
2023-11-02 18:22:24.617786: E tensorflow/compiler/xla/stream_executor/cuda/c
uda_fft.cc:609] Unable to register cuFFT factory: Attempting to register fac
tory for plugin cuFFT when one has already been registered
2023-11-02 18:22:24.618739: E tensorflow/compiler/xla/stream_executor/cuda/c
uda_blas.cc:1518] Unable to register cuBLAS factory: Attempting to register
factory for plugin cuBLAS when one has already been registered
2023-11-02 18:22:24.698294: I tensorflow/core/platform/cpu_feature_guard.cc:
182] This TensorFlow binary is optimized to use available CPU instructions i
n performance-critical operations.
To enable the following instructions: AVX2 AVX_VNNI FMA, in other operation
s, rebuild TensorFlow with the appropriate compiler flags.
2023-11-02 18:22:25.704940: W tensorflow/compiler/tf2tensorrt/utils/py_util
s.cc:38] TF-TRT Warning: Could not find TensorRT
Sanity Checking: |
| 0/? [00:00...
Training: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...
Validation: |
| 0/? [00:00...

```

```
Validation: |  
| 0/? [00:00...  
Validation: |  
| 0/? [00:03...  
Predicting: |  
| 0/? [00:00...
```

```
In [11]: from neuralforecast.losses.numpy import mae, mse
```

```
print('MAE: ', mae(Y_hat_df['y'], Y_hat_df['NHITS']))  
print('MSE: ', mse(Y_hat_df['y'], Y_hat_df['NHITS']))
```

```
MAE: 0.19757447049855434  
MSE: 0.16556661850686696
```

```
In [12]: Y_hat_df.to_csv('results/Weather/NHITS.csv')
```

```
In [14]: data = {'Informer_MSE': mse(Y_hat_df['y'], Y_hat_df['NHITS']),  
                'Informer_MAE': mae(Y_hat_df['y'], Y_hat_df['NHITS'])}  
  
df = pd.DataFrame(data, index=['Weather'])  
df.to_csv('results/Weather/df_NHITS.csv')
```