

```
In [ ]: import gluonts
print(gluonts.__version__)
```

0.14.4

```
In [ ]: %matplotlib inline
import matplotlib.pyplot as plt

import numpy as np
import pandas as pd

import torch
```

```
In [ ]: from gluonts.dataset.multivariate_grouper import MultivariateGrouper
from gluonts.dataset.repository.datasets import dataset_recipes, get_dataset
from gluonts.evaluation.backtest import make_evaluation_predictions
from gluonts.evaluation import MultivariateEvaluator
```

/home/songzy/anaconda3/envs/py311/lib/python3.11/site-packages/gluonts/json.py:10
 1: UserWarning: Using `json`-module for json-handling. Consider installing one of
 `orjson`, `ujson` to speed up serialization and deserialization.
 warnings.warn(

```
In [ ]: # from pts.model.tempflow import TempFlowEstimator
# from pts.model.time_grad import TimeGradEstimator
# from pts.model.transformer_tempflow import TransformerTempFlowEstimator
# from pts import Trainer
from pytorch_lightning import Trainer
```

```
In [ ]: from diffusers import (
    PNDMScheduler,
    DDIMScheduler,
    DPMSolverMultistepScheduler,
    KDPM2DiscreteScheduler,
    DEISMultistepScheduler,
)
```

```
In [ ]: device = torch.device("cuda" if torch.cuda.is_available() else "cpu")
```

```
In [ ]: def plot(target, forecast, prediction_length, prediction_intervals=(50.0, 90.0),
           label_prefix = ""
           rows = 4
           cols = 4
           fig, axs = plt.subplots(rows, cols, figsize=(24, 24))
           axx = axs.ravel()
           seq_len, target_dim = target.shape

           ps = [50.0] + [
               50.0 + f * c / 2.0 for c in prediction_intervals for f in [-1.0, +1.0]
           ]

           percentiles_sorted = sorted(set(ps))

           def alpha_for_percentile(p):
               return (p / 100.0) ** 0.3

           for dim in range(0, min(rows * cols, target_dim)):
               ax = axx[dim]
```

```

        target[-2 * prediction_length :][dim].plot(ax=ax)

    ps_data = [forecast.quantile(p / 100.0)[:, dim] for p in percentiles_sort]
    i_p50 = len(percentiles_sorted) // 2

    p50_data = ps_data[i_p50]
    p50_series = pd.Series(data=p50_data, index=forecast.index)
    p50_series.plot(color=color, ls="-", label=f"{label_prefix}median", ax=ax)

    for i in range(len(percentiles_sorted) // 2):
        ptile = percentiles_sorted[i]
        alpha = alpha_for_percentile(ptile)
        ax.fill_between(
            forecast.index,
            ps_data[i],
            ps_data[-i - 1],
            facecolor=color,
            alpha=alpha,
            interpolate=True,
        )
        # Hack to create labels for the error intervals.
        # Doesn't actually plot anything, because we only pass a single data
        pd.Series(data=p50_data[:1], index=forecast.index[:1]).plot(
            color=color,
            alpha=alpha,
            linewidth=10,
            label=f"{label_prefix}{100 - ptile * 2}%",
            ax=ax,
        )

    legend = ["observations", "median prediction"] + [f"% prediction interval"]
    axx[0].legend(legend, loc="upper left")

    if fname is not None:
        plt.savefig(fname, bbox_inches='tight', pad_inches=0.05)

```

In []: `print(f"Available datasets: {list(dataset_recipes.keys())}")`

Available datasets: ['constant', 'exchange_rate', 'solar-energy', 'electricity', 'traffic', 'exchange_rate_nips', 'electricity_nips', 'traffic_nips', 'solar_nips', 'wiki2000_nips', 'wiki-rolling_nips', 'taxi_30min', 'kaggle_web_traffic_with_missing', 'kaggle_web_traffic_without_missing', 'kaggle_web_traffic_weekly', 'm1_yearly', 'm1_quarterly', 'm1_monthly', 'nn5_daily_with_missing', 'nn5_daily_without_missing', 'nn5_weekly', 'tourism_monthly', 'tourism_quarterly', 'tourism_yearly', 'cif_2016', 'london_smart_meters_without_missing', 'wind_farms_without_missing', 'car_parts_without_missing', 'dominick', 'fred_md', 'pedestrian_counts', 'hospital', 'covid_deaths', 'kdd_cup_2018_without_missing', 'weather', 'm3_monthly', 'm3_quarterly', 'm3_yearly', 'm3_other', 'm4_hourly', 'm4_daily', 'm4_weekly', 'm4_monthly', 'm4_quarterly', 'm4_yearly', 'm5', 'uber_tlc_daily', 'uber_tlc_hourly', 'airpassengers', 'australian_electricity_demand', 'electricity_hourly', 'electricity_weekly', 'rideshare_without_missing', 'saugeenday', 'solar_10_minutes', 'solar_weekly', 'sunspot_without_missing', 'temperature_rain_without_missing', 'vehicle_trips_without_missing']

In []: `# exchange_rate_nips, electricity_nips, traffic_nips, solar_nips, wiki-rolling_n`
`dataset_electricity = get_dataset("electricity_nips", regenerate=False)`

In []: `dataset_electricity.metadata`

```
Out[ ]: MetaData(freq='H', target=None, feat_static_cat=[CategoricalFeatureInfo(name='feat_static_cat_0', cardinality='370')], feat_static_real=[], feat_dynamic_real=[], feat_dynamic_cat=[], prediction_length=24)

In [ ]: train_grouper_electricity = MultivariateGrouper(max_target_dim=min(2000, int(dataset_el
test_grouper_electricity = MultivariateGrouper(num_test_dates=int(len(dataset_el
                                              max_target_dim=min(2000, int(dataset_electric

In [ ]: dataset_train_electricity = train_grouper_electricity(dataset_electricity.train)
dataset_test_electricity = test_grouper_electricity(dataset_electricity.test)

In [ ]: scheduler = DEISMultistepScheduler(
        num_train_timesteps=150,
        beta_end=0.1,
    )

In [ ]: estimator_electricity = TimeGradEstimator(
        input_size=int(dataset_electricity.metadata.feat_static_cat[0].cardinality),
        hidden_size=64,
        num_layers=2,
        dropout_rate=0.1,
        lags_seq=[1],
        scheduler=scheduler,
        num_inference_steps=149,
        prediction_length=dataset_electricity.metadata.prediction_length,
        context_length=dataset_electricity.metadata.prediction_length * 3,
        freq=dataset_electricity.metadata.freq,
        scaling="mean",
        trainer_kwarg
        max_epochs=2, accelerator="gpu", devices="1"),
    )

In [ ]: predictor_electricity = estimator_electricity.train(dataset_train_electricity, n
```

```

GPU available: True (cuda), used: True
TPU available: False, using: 0 TPU cores
HPU available: False, using: 0 HPUs
/home/songzy/anaconda3/envs/py311/lib/python3.11/site-packages/lightning/pytorch/
trainer/configuration_validator.py:70: You defined a `validation_step` but have n
o `val_dataloader`. Skipping val loop.
You are using a CUDA device ('NVIDIA RTX A6000') that has Tensor Cores. To proper
ly utilize them, you should set `torch.set_float32_matmul_precision('medium' | 'h
igh')` which will trade-off precision for performance. For more details, read ht
tp://pytorch.org/docs/stable/generated/torch.set_float32_matmul_precision.html#to
rch.set_float32_matmul_precision
Missing logger folder: /home/songzy/myDL/TimeGrad/timegrad-s4-main/lightning_logs
LOCAL_RANK: 0 - CUDA_VISIBLE_DEVICES: [0,1]

```

	Name	Type	Params	Mode	In sizes
	Out sizes				
<hr/>					
0	model	TimeGradModel	432 K	train	[[1, 1], [1, 1], [1, 72, 5], [1, 72, 370], [1, 72, 370], [1, 24, 5]] [1, 100, 24, 370]
<hr/>					
432 K		Trainable params			
0		Non-trainable params			
432 K		Total params			
1.729		Total estimated model params size (MB)			
Training:		0/? [00:00<?, ?it/s]			
Epoch 0, global step 50: 'train_loss' reached 0.35117 (best 0.35117), saving mode 1 to '/home/songzy/myDL/TimeGrad/timegrad-s4-main/lightning_logs/version_0/checkp oints/epoch=0-step=50.ckpt' as top 1					
Epoch 1, global step 100: 'train_loss' reached 0.10801 (best 0.10801), saving mod el to '/home/songzy/myDL/TimeGrad/timegrad-s4-main/lightning_logs/version_0/check points/epoch=1-step=100.ckpt' as top 1					
'Trainer.fit' stopped: `max_epochs=2` reached.					

```
In [ ]: forecast_it_electricity, ts_it_electricity = make_evaluation_predictions(dataset
predictor=predictor_electricity
num_samples=10)
```

```
In [ ]: forecasts_electricity = list(forecast_it_electricity)
targets_electricity = list(ts_it_electricity)
```

```
In [ ]: forecasts_electricity
```

```
Out[ ]: [gluonts.model.forecast.SampleForecast(info=None, item_id=None, samples=array
([[[ 38.551365 , 111.24629 , 19.173153 , ...,
       177.69583 , 123.104454 , 87.3238 ],
      [ 71.24024 , 14.0557785, 42.238007 , ...,
       142.59763 , 134.72757 , 58.497005 ],
      [ 27.689753 , 80.02125 , 47.750633 , ...,
       171.44206 , -94.17962 , 64.9861 ],
      ...,
      [ 82.71062 , 146.94029 , 122.88683 , ...,
       228.20012 , 327.46008 , 114.8938 ],
      [ 105.948296 , 145.93352 , 88.913376 , ...,
       238.98572 , 380.29108 , 115.022385 ],
      [ 113.70903 , 109.75074 , 62.250103 , ...,
       254.49559 , 461.2211 , 91.82055 ]],
      [[ -49.559277 , 209.77446 , 84.44827 , ...,
       140.6284 , -36.77492 , 90.54461 ],
      [ 88.89584 , 102.349434 , 53.88907 , ...,
       569.051 , 218.94951 , 47.815784 ],
      [ 55.418137 , 91.43444 , 52.78603 , ...,
       15.013325 , 134.08481 , -13.477302 ],
      ...,
      [ 97.16258 , 134.67876 , 63.57168 , ...,
       199.54988 , 281.73138 , 126.7778 ],
      [ 114.427055 , 151.16203 , 84.62577 , ...,
       221.45667 , 336.2889 , 117.98814 ],
      [ 45.923 , 75.83209 , 59.89258 , ...,
       -979.57837 , -1866.586 , -216.94424 ]],
      [[ 90.08046 , -443.05972 , 257.47156 , ...,
       20.802433 , 1291.9818 , 1005.9517 ],
      [ 133.53244 , 1350.249 , 259.00778 , ...,
       184.22823 , 250.59413 , 133.50597 ],
      [ 35.35289 , 8.760716 , 56.398346 , ...,
       -1584.6827 , -715.1039 , -401.1591 ],
      ...,
      [ 82.98967 , 121.65596 , 56.765137 , ...,
       110.19183 , 191.3271 , 73.69051 ],
      [ 116.06335 , 111.44777 , 106.48282 , ...,
       569.56696 , 791.66785 , 159.86743 ],
      [ 152.55977 , 59.62127 , 70.2315 , ...,
       230.2326 , 411.07654 , 127.186646 ]],
      ...,
      [[ 49.90878 , 84.478035 , 39.548244 , ...,
       11.619471 , 202.55377 , 56.410408 ],
      [ -175.60532 , -221.31834 , 1243.0088 , ...,
       117.20223 , 287.39648 , 62.317425 ],
      [ 768.8351 , -682.68964 , 111.63029 , ...,
       90.50825 , 1679.7604 , 327.8952 ],
      ...,
      [ 77.14852 , 192.98972 , 56.1639 , ...,
       137.79916 , 331.80832 , 83.31949 ],
      [ 82.169 , 139.79787 , 69.094574 , ...,
       178.20958 , 231.45654 , 85.23568 ],
      [ 68.84375 , 107.60866 , 52.036354 , ...,
       87.54843 , 142.23184 , 75.89718 ]],
      [[ -65.29146 , 95.15295 , 21.608772 , ...,
```

```

        -7.8241434,    92.29102 ,   105.23276 ],
[ 128.41794 ,   13.350443 ,  -118.882065 , ...,
[-139.8278 ,   16.810167 ,   151.09415 ],
[ 61.67759 ,   59.33199 ,   49.86079 , ...,
141.92935 ,   143.5138 ,   85.21302 ],
...,
[ 81.445526 ,  118.094666 ,  63.71279 , ...,
102.61211 ,   261.80652 ,   41.596954 ],
[ 74.71935 ,   80.77579 ,  -84.0094 , ...,
85.65069 ,   169.22879 ,   79.472435 ],
[ 142.34091 , -1239.5497 ,  12.609534 , ...,
137.123 ,    330.45914 ,  93.53427 ]],

[[ -110.62361 , -114.08667 ,  16.504593 , ...,
30.115425 , -306.34 ,  -228.24316 ],
[ 579.6357 ,  199.86855 , -274.00546 , ...,
267.0339 ,  4348.246 ,  893.9363 ],
[ 74.66559 ,  191.82277 ,  90.85225 , ...,
76.63056 ,  194.30879 ,  62.420807 ],
...,
[ 278.65683 ,    7.3973665,  70.01877 , ...,
235.3062 ,   363.92917 ,  107.89326 ],
[ 123.061516 ,  889.4536 ,  39.611126 , ...,
318.71225 ,  326.414 ,  -17.951477 ],
[ 256.91223 ,  637.3754 ,  92.34489 , ...,
317.74838 ,  574.08704 ,  196.2275 ]]], dtype=float32), start
_date=Period('2014-09-01 01:00', 'H')),
gluonts.model.forecast.SampleForecast(info=None, item_id=None, samples=array
([[ [ 8.60130463e+01,  8.52307587e+01,  9.25410385e+01, ...,
4.13234924e+02,  5.83648071e+02,  2.67633209e+02],
[-9.97829914e+00,  8.03547592e+01,  4.52250900e+01, ...,
8.84938812e+01,  1.99056206e+01,  5.12989731e+01],
[-3.23320892e+02, -1.35166443e+02, -2.37577915e+00, ...,
-1.77043552e+01,  1.77224182e+02,  1.49805517e+01],
...,
[ 2.96019697e+00,  9.89009476e+00, -1.04272490e+01, ...,
1.58613815e+02,  4.39100403e+02, -3.79528275e+01],
[ 9.67197647e+01,  1.06140327e+02,  1.04102745e+02, ...,
2.54959488e+02,  2.66496613e+02,  1.05416534e+02],
[ 9.68462067e+01,  1.30784454e+02,  7.18152466e+01, ...,
2.22051056e+02,  2.72238525e+02,  1.07905136e+02]],

[[ 5.14840775e+01,  1.27869507e+02,  2.09732227e+01, ...,
1.81629959e+02,  2.43736389e+02,  7.87998352e+01],
[ 2.04010797e+00,  7.25760803e+01,  1.82957935e+01, ...,
1.02064575e+02,  1.46880096e+02,  7.91236496e+01],
[-3.70093536e+02, -4.86760620e+02,  1.97602024e+01, ...,
9.88839035e+01,  1.16470312e+03, -1.33760168e+03],
...,
[ 6.83595657e+01,  1.31736267e+02,  1.19207611e+02, ...,
1.78284042e+02,  2.18841339e+02,  9.37747879e+01],
[ 8.03545303e+01,  4.27039032e+01,  4.33370323e+01, ...,
1.72146408e+02,  2.51965439e+02,  7.41925735e+01],
[ 7.86145325e+01,  1.39780167e+02,  7.44652786e+01, ...,
3.29311829e+02,  7.25454529e+02,  5.75971680e+02]],

[[ 7.68159637e+01,  6.03310242e+01,  5.95423241e+01, ...,
4.64030762e+01,  2.59771332e+02,  6.71232529e+01],
[-1.81888382e+02, -2.42213425e+02, -4.22453728e+01, ...,
-4.80745239e+02, -8.50274841e+02, -1.40731308e+02],
```



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    7.52250366e+01,  1.60431274e+02,  3.83123093e+01],  

    ...,  

    [ 6.04396629e+01,  5.47485542e+01,  5.15349197e+01,  ...,  

     1.56180603e+02,  1.85440414e+02,  8.41095200e+01],  

    [ 5.56689186e+01,  1.28244843e+02,  6.48853531e+01,  ...,  

     1.98603821e+02,  3.32927155e+02,  9.20502472e+01],  

    [ 9.74806442e+01,  1.50587601e+02,  7.45084381e+01,  ...,  

     2.43007431e+02,  1.95680817e+02,  1.08576187e+02]],  

    [[ 6.18475952e+01,  1.07183296e+02,  6.06938057e+01,  ...,  

     1.53018616e+02,  2.92010223e+02,  8.92503128e+01],  

    [-3.76064545e+02, -2.99416046e+02, -4.75846672e+01,  ...,  

     4.41822461e+03,  1.08634155e+03,  -2.38808151e+02],  

    [ 6.42709274e+01,  -1.87494850e+01,  3.69584045e+01,  ...,  

     1.32167786e+02,  1.98560608e+02,  8.48542252e+01],  

    ...,  

    [ 1.79125118e+01,  -4.01042627e+03,  -2.49685638e+02,  ...,  

     2.60665131e+02,  -4.98132849e+00,  2.97236542e+02],  

    [ 3.22064896e+01,  1.39057922e+02,  5.84977989e+01,  ...,  

     1.17954132e+02,  2.18419678e+02,  9.06516495e+01],  

    [ 6.60930023e+01,  1.30620468e+02,  4.75562248e+01,  ...,  

     9.25393295e+01,  2.20726379e+02,  7.79615784e+01]],  

    [[ -2.41766907e+02,  4.28680420e+01,  5.35578308e+01,  ...,  

     8.61593872e+02,  -4.49315137e+03,  1.29324756e+03],  

    [ 6.63197021e+01,  6.64800339e+01,  5.53933182e+01,  ...,  

     -8.36196289e+02,  -3.08051807e+03,  4.37277107e+01],  

    [ 4.23811760e+01,  1.15583168e+02,  6.81196823e+01,  ...,  

     9.22418518e+01,  1.92067139e+02,  1.04096649e+02],  

    ...,  

    [ 2.07319202e+01,  1.07923416e+02,  5.39245262e+01,  ...,  

     -9.43164124e+02,  2.96996606e+03,  2.52793961e+01],  

    [ 1.39932671e+01,  5.07914257e+00,  4.51234016e+01,  ...,  

     1.31218628e+02,  2.12436646e+02,  9.04298401e+01],  

    [ 8.99135132e+01,  1.18352257e+02,  6.27324829e+01,  ...,  

     1.93187729e+02,  2.53743500e+02,  1.04031967e+02]],  

    ...,  

    [[ 7.28397980e+01,  9.39336014e+01,  7.33360214e+01,  ...,  

     1.79811462e+02,  2.90418030e+02,  1.07664627e+02],  

    [ 6.62413177e+01,  1.28354996e+02,  6.06288414e+01,  ...,  

     1.87876480e+02,  2.77217102e+02,  6.74655685e+01],  

    [ 5.38859100e+01,  1.05948814e+02,  3.79313431e+01,  ...,  

     9.04336166e+01,  1.57214005e+02,  3.83639984e+01],  

    ...,  

    [ 8.05389465e+02,  5.65527916e+01,  1.21660652e+02,  ...,  

     -5.71828430e+02,  -5.87259155e+02,  -6.11866516e+02],  

    [ 5.34942398e+01,  4.28727493e+01,  -4.37328529e+00,  ...,  

     1.23038733e+03,  3.42654938e+02,  -3.09888947e+02],  

    [ 6.71889496e+01,  1.05677223e+02,  5.53495941e+01,  ...,  

     1.23228920e+02,  1.04204742e+02,  6.64053116e+01]],  

    [[ -1.03071350e+02,  2.95760231e+01,  5.41364670e+01,  ...,  

     1.53724838e+02,  6.79984924e+02,  -3.74976959e+02],  

    [ 4.50318832e+01,  5.33350677e+01,  4.56245270e+01,  ...,  

     9.47309113e+01,  1.71808075e+02,  3.47678909e+01],  

    [ 7.44162292e+01,  9.72071457e+01,  6.26670303e+01,  ...,  

     2.10047474e+01,  1.34992081e+02,  9.32501678e+01],  

    ...,
  
```

```

[ 4.68311348e+01,  8.69571609e+01,  3.18558826e+01,  ...,  

  5.48825722e+01,  2.60901825e+02,  7.76512833e+01],  

[ 1.13849663e+02, -1.83009262e+02,  6.28094063e+01,  ...,  

  5.39310913e+01,  3.52107849e+02,  1.06972023e+02],  

[ 7.76669312e+01,  1.00694733e+02,  6.73981094e+01,  ...,  

  1.00547661e+02,  1.97394226e+02,  8.45118103e+01]],  

[[ 5.63296967e+01,  4.58520737e+01,  5.16066170e+01,  ...,  

  1.03956619e+02,  1.93574829e+02,  7.36835938e+01],  

[ 7.26054764e+01,  1.41107101e+02,  6.59917450e+01,  ...,  

  1.58335632e+02,  2.52893784e+02,  8.83612366e+01],  

[-3.36957306e+02,  8.43095932e+01,  4.70291758e+00,  ...,  

  1.74181004e+01, -1.13745142e+03, -6.21080139e+02],  

...,  

[ 1.46818329e+02, -1.03391321e+03, -1.27453552e+03,  ...,  

  1.31696136e+02,  2.43566238e+02,  9.14415131e+01],  

[ 1.09772110e+02,  1.59846558e+02,  1.05803017e+02,  ...,  

  1.47033783e+02,  2.21096390e+02,  9.60493393e+01],  

[ 5.87365303e+01,  1.43618317e+02,  3.23436089e+01,  ...,  

  1.31750656e+02, -2.22945290e+01,  8.43796005e+01]]],  

dtype=float32), start_date=Period('2014-09-03 01:00', 'H')),  

gluonts.model.forecast.SampleForecast(info=None, item_id=None, samples=array  

([[[-7.72795725e+00,  1.49972610e+02,  5.86805763e+01,  ...,  

  8.10766220e+01,  1.51440582e+02, -7.23398056e+01],  

[ 7.22448730e+01,  1.22544525e+02,  6.43328552e+01,  ...,  

  1.01322998e+02,  1.90492889e+02,  1.11904488e+02],  

[-1.86970158e+01, -1.32588348e+02, -5.40019958e+02,  ...,  

  1.16622406e+02,  4.60666580e+01, -4.67940674e+02],  

...,  

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[ 9.59304047e+01,  1.16407745e+02,  6.36826706e+01,  ...,  

  1.44652237e+02,  1.05926262e+02,  9.01277771e+01]],  

[[ 8.99803352e+00,  6.77729874e+01,  4.28448982e+01,  ...,  

  1.15290756e+02, -3.34803543e+01,  4.18683510e+01],  

[ 1.98486115e+02,  1.38271347e+02,  5.33716011e+01,  ...,  

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[[ -1.50540939e+02, 6.39556160e+01, 3.54279785e+01, ...,
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gluonts.model.forecast.SampleForecast(info=None, item_id=None, samples=array  

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...,  

[-1.96401005e+01,  6.72653198e+01,  3.46948318e+01, ...,  

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  2.06035583e+02,  1.86336960e+02,  1.00744514e+02]],  

[[ 8.02607422e+01,  9.03514862e+01, -3.99100037e+01, ...,  

  1.26151184e+03, -1.95425525e+03,  1.55891220e+02],  

[ 5.21537857e+01,  8.83076553e+01,  4.69046822e+01, ...,  

  5.43075104e+01, -5.05309814e+02,  1.06275070e+02],  

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  5.16834473e+02, -6.82398438e+02,  8.93407059e+01]],  

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gluonts.model.forecast.SampleForecast(info=None, item_id=None, samples=array  

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[  8.46714172e+01, -2.54092499e+02, -6.97911743e+02,  ...,  

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[  6.14984741e+01,  7.46657562e+01,  6.24065018e+01,  ...,  

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[[ [ 8.26811295e+01,  2.40705994e+02,  9.31993179e+01,  ...,  

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[ -6.52774536e+02, -2.32350601e+02,  6.49644470e+01,  ...,  

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...,  

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    dtype=float32), start_date=Period('2014-09-06 01:00', 'H')),  

    gluonts.model.forecast.SampleForecast(info=None, item_id=None, samples=array  

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   202.38391 ,  202.5709 ,  100.146706 ],
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 [ 81.56659 ,  118.25224 ,  54.763184 , ...,
   76.22309 ,  54.13546 ,  42.00912 ]],  

 [[ 728.80725 ,  764.9208 ,  152.62483 , ...,
   2128.504 ,  896.7481 ,  77.43048 ],
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-75.56138 , 546.36993 , -216.6977 ]], dtype=float32), start
_date=Period('2014-09-07 01:00', 'H'))]
```

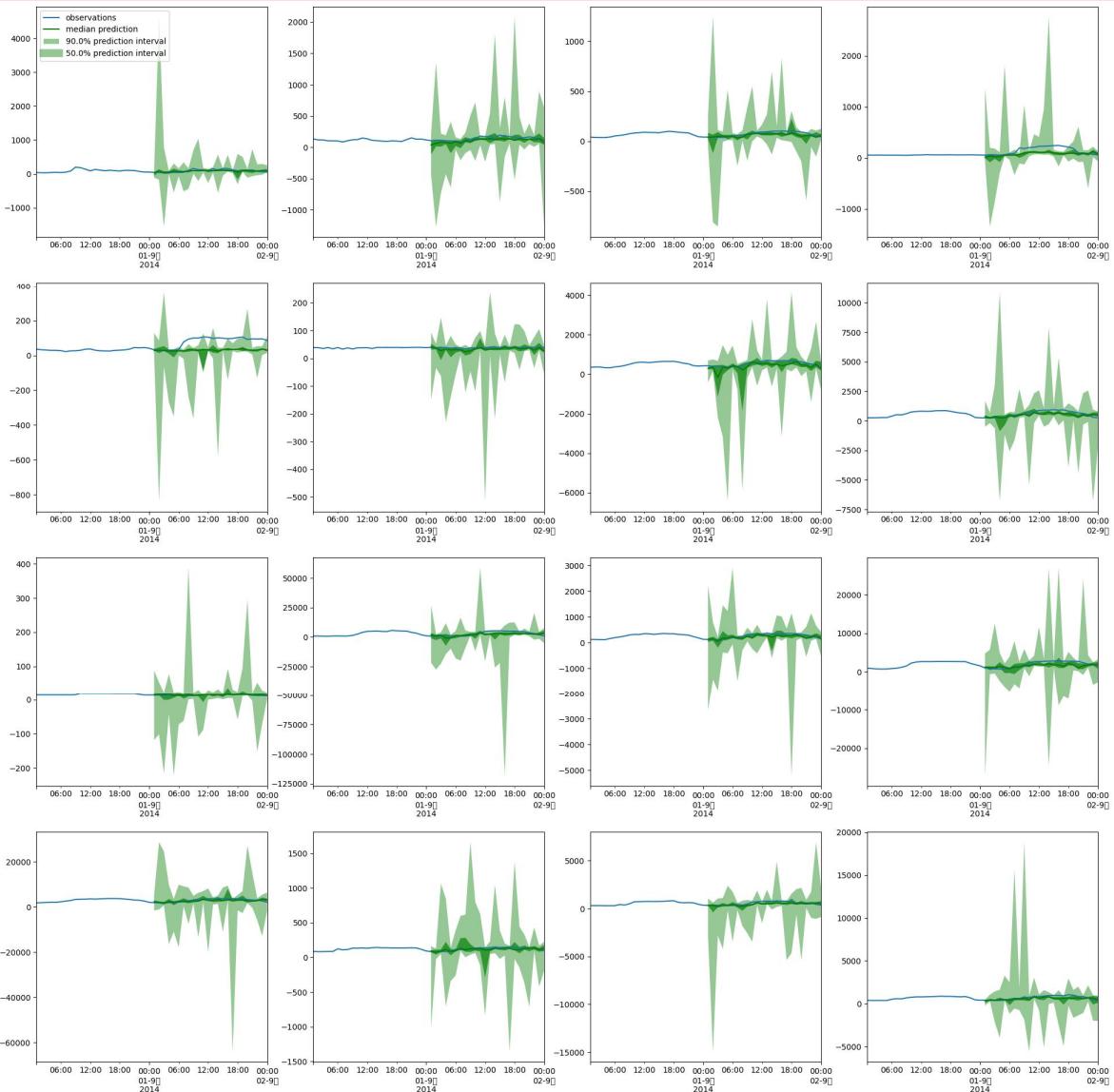
```
In [ ]: print("Electricity")

plot(
    target=targets_electricity[0],
    forecast=forecasts_electricity[0],
    prediction_length=dataset_electricity.metadata.prediction_length,
)
plt.show()
```

Electricity

```
/home/songzy/anaconda3/envs/py311/lib/python3.11/site-packages/IPython/core/pylab
tools.py:170: UserWarning: Glyph 26376 (\N{CJK UNIFIED IDEOGRAPH-6708}) missing f
rom font(s) DejaVu Sans.
```

```
fig.canvas.print_figure(bytes_io, **kw)
```



```
In [ ]: evaluator = MultivariateEvaluator(quantiles=(np.arange(20)/20.0)[1:],  
                                         target_agg_funcs={'sum': np.sum})
```

```
In [ ]: agg_metric_electricity, item_metrics_electricity = evaluator(targets_electricity)
```

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/home/songzy/anaconda3/envs/py311/lib/python3.11/site-packages/pandas/core/dtype
s/astype.py:170: UserWarning: Warning: converting a masked element to nan.
    return arr.astype(dtype, copy=True)
/home/songzy/anaconda3/envs/py311/lib/python3.11/site-packages/gluonts/evaluatio
n/_base.py:531: RuntimeWarning: divide by zero encountered in scalar divide
    totals["NRMSE"] = totals["RMSE"] / totals["abs_target_mean"]
/home/songzy/anaconda3/envs/py311/lib/python3.11/site-packages/gluonts/evaluatio
n/_base.py:532: RuntimeWarning: divide by zero encountered in scalar divide
    totals["ND"] = totals["abs_error"] / totals["abs_target_sum"]
/home/songzy/anaconda3/envs/py311/lib/python3.11/site-packages/gluonts/evaluatio
n/_base.py:536: RuntimeWarning: divide by zero encountered in scalar divide
    totals[f"QuantileLoss[{quantile}]"] / totals["abs_target_sum"]
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Running evaluation: 7it [00:00, 133.38it/s]
Running evaluation: 7it [00:00, 132.52it/s]
Running evaluation: 7it [00:00, 129.27it/s]
Running evaluation: 7it [00:00, 130.29it/s]
Running evaluation: 7it [00:00, 130.16it/s]
```

```
Running evaluation: 7it [00:00, 130.89it/s]
Running evaluation: 7it [00:00, 131.75it/s]
Running evaluation: 7it [00:00, 129.35it/s]
Running evaluation: 7it [00:00, 132.32it/s]
Running evaluation: 7it [00:00, 133.44it/s]
Running evaluation: 7it [00:00, 132.37it/s]
Running evaluation: 7it [00:00, 132.74it/s]
Running evaluation: 7it [00:00, 131.64it/s]
Running evaluation: 7it [00:00, 130.45it/s]
Running evaluation: 7it [00:00, 132.78it/s]
Running evaluation: 7it [00:00, 133.73it/s]
Running evaluation: 7it [00:00, 131.75it/s]
Running evaluation: 7it [00:00, 132.34it/s]
Running evaluation: 7it [00:00, 134.23it/s]
Running evaluation: 7it [00:00, 133.03it/s]
Running evaluation: 7it [00:00, 131.43it/s]
Running evaluation: 7it [00:00, 132.89it/s]
Running evaluation: 7it [00:00, 130.94it/s]
Running evaluation: 7it [00:00, 132.84it/s]
Running evaluation: 7it [00:00, 134.44it/s]
Running evaluation: 7it [00:00, 135.27it/s]
Running evaluation: 7it [00:00, 132.11it/s]
Running evaluation: 7it [00:00, 92.80it/s]
```

```
In [ ]: print("Electricity Results")
print("CRPS:", agg_metric_electricity["mean_wQuantileLoss"])
print("ND:", agg_metric_electricity["ND"])
print("NRMSE:", agg_metric_electricity["NRMSE"])
print("")
print("CRPS-Sum:", agg_metric_electricity["m_sum_mean_wQuantileLoss"])
print("ND-Sum:", agg_metric_electricity["m_sum_ND"])
print("NRMSE-Sum:", agg_metric_electricity["m_sum_NRMSE"])
```

Electricity Results
CRPS: 0.2707872836998276
ND: 0.29387715641085094
NRMSE: 6.013588729659628

CRPS-Sum: 0.18479722185712283
ND-Sum: 0.2467999744659055
NRMSE-Sum: 0.38316235608597204

```
In [ ]:
```