

```
In [ ]: from google.colab import drive
drive.mount('/content/drive')
```

Mounted at /content/drive

```
In [ ]: import pandas as pd
```

```
In [ ]: # df      = pd.read_csv("/content/drive/MyDrive/BDA 696 Project/Datasets/processsed/YMH_Clean_UCI_Power_Consumption_Dataset.csv")
# cpi      = pd.read_csv("/content/drive/MyDrive/BDA 696 Project/Datasets/processsed/YM_Clean_France_CPI_Electricity.csv")
# temp     = pd.read_csv("/content/drive/MyDrive/BDA 696 Project/Datasets/processsed/YMH_Clean_TempISD.csv")
# cci      = pd.read_csv("/content/drive/MyDrive/BDA 696 Project/Datasets/processsed/YM_Clean_CCI.csv")
# gt1      = pd.read_csv("/content/drive/MyDrive/BDA 696 Project/Datasets/processsed/YMW_Clean_GoogleTrends1.csv")
# gt2      = pd.read_csv("/content/drive/MyDrive/BDA 696 Project/Datasets/processsed/YMW_Clean_GoogleTrends2.csv")
# gt3      = pd.read_csv("/content/drive/MyDrive/BDA 696 Project/Datasets/processsed/YMW_Clean_GoogleTrends3.csv")
```

```
In [ ]: df      = pd.read_csv("Downloads/processsed/YMH_Clean_UCI_Power_Consumption_Dataset.csv")
cpi      = pd.read_csv("Downloads/processsed/YM_Clean_France_CPI_Electricity.csv")
temp     = pd.read_csv("Downloads/processsed/YMH_Clean_TempISD.csv")
cci      = pd.read_csv("Downloads/processsed/YM_Clean_CCI.csv")
gt1      = pd.read_csv("Downloads/processsed/YMW_Clean_GoogleTrends1.csv")
gt2      = pd.read_csv("Downloads/processsed/YMW_Clean_GoogleTrends2.csv")
gt3      = pd.read_csv("Downloads/processsed/YMW_Clean_GoogleTrends3.csv")
```

C:\Users\vghavate3103\AppData\Local\Temp\ipykernel_15040\2729922107.py:1: DtypeWarning: Columns (2,3,4,5,6,7) have mixed types. Specify dtype option on import or set low_memory=False.
df = pd.read_csv("Downloads/processsed/YMH_Clean_UCI_Power_Consumption_Dataset.csv")
C:\Users\vghavate3103\AppData\Local\Temp\ipykernel_15040\2729922107.py:3: DtypeWarning: Columns (20) have mixed types. Specify dtype option on import or set low_memory=False.
temp = pd.read_csv("Downloads/processsed/YMH_Clean_TempISD.csv")

```
In [ ]: df['Date'] = pd.to_datetime(df['Date'])
df=df.query('Date.dt.minute==0')# or Date.dt.minute==30')
df=df.replace('?',0.0)
df
```

Out []:	Date	Time	Global_active_power	Global_reactive_power	Voltage	Global_intensity	Sub_metering_1	S
	2007-01-01 00:00:00	00:00:00	2.580	0.136	241.970	10.600	0.000	
	2007-01-01 01:00:00	01:00:00	2.466	0.000	241.090	10.200	0.000	
	2007-01-01 02:00:00	02:00:00	2.504	0.088	239.260	10.400	0.000	
	2007-01-01 03:00:00	03:00:00	2.648	0.254	241.630	11.000	0.000	
	2007-01-01 04:00:00	04:00:00	2.400	0.000	241.960	9.800	0.000	

	2010-11-26 17:00:00	17:00:00	0.898	0.0	237.22	3.8	0.0	
	2010-11-26 18:00:00	18:00:00	1.096	0.142	239.14	4.6	0.0	
	2010-11-26 19:00:00	19:00:00	1.81	0.0	235.59	7.6	0.0	
	2010-11-26 20:00:00	20:00:00	1.456	0.0	238.18	6.2	0.0	
	2010-11-26 21:00:00	21:00:00	0.938	0.0	239.82	3.8	0.0	

34222 rows x 9 columns

```
In [ ]: #temp['Date'] = pd.to_datetime(cci['Date'])
#df=pd.merge_asof(df,temp, on='Date')

#df.dtypes

# cpi['Date'] = pd.to_datetime(cpi['Date'])
# df=df.merge(cpi, on='Date', how='left')

# cci['Date'] = pd.to_datetime(cci['Date'])
# df=df.merge(cci, on='Date', how='left')

gt1['Date'] = pd.to_datetime(gt1['Date'])
df=df.merge(gt1, on='Date', how='left')

gt2['Date'] = pd.to_datetime(gt2['Date'])
df=df.merge(gt2, on='Date', how='left')

gt3['Date'] = pd.to_datetime(gt3['Date'])
df=df.merge(gt3, on='Date', how='left')

df['GT1_Hits']=df['GT1_Hits'].fillna(0)
df['GT2_Hits']=df['GT2_Hits'].fillna(0)
df['GT3_Hits']=df['GT3_Hits'].fillna(0)
```

```
In [ ]: df.head()
```

Out []:

	Date	Time	Global_active_power	Global_reactive_power	Voltage	Global_intensity	Sub_metering_1	Sub_met
0	2007-01-01	00:00:00	2.580	0.136	241.970	10.600	0.000	
1	2007-01-01	01:00:00	2.466	0.000	241.090	10.200	0.000	
2	2007-01-01	02:00:00	2.504	0.088	239.260	10.400	0.000	
3	2007-01-01	03:00:00	2.648	0.254	241.630	11.000	0.000	
4	2007-01-01	04:00:00	2.400	0.000	241.960	9.800	0.000	

In []:

```
!pip install lightning
!pip install pytorch_forecasting
```

Defaulting to user installation because normal site-packages is not writeable
Requirement already satisfied: lightning in c:\users\vghavate3103\appdata\roaming\python\python311\site-packages (2.1.2)
Requirement already satisfied: PyYAML<8.0,>=5.4 in c:\programdata\anaconda3\lib\site-packages (from lightning) (6.0)
Requirement already satisfied: fsspec[http]<2025.0,>2021.06.0 in c:\programdata\anaconda3\lib\site-packages (from lightning) (2023.4.0)
Requirement already satisfied: lightning-utilities<2.0,>=0.8.0 in c:\users\vghavate3103\appdata\roaming\python\python311\site-packages (from lightning) (0.10.0)
Requirement already satisfied: numpy<3.0,>=1.17.2 in c:\programdata\anaconda3\lib\site-packages (from lightning) (1.24.3)
Requirement already satisfied: packaging<25.0,>=20.0 in c:\programdata\anaconda3\lib\site-packages (from lightning) (23.1)
Requirement already satisfied: torch<4.0,>=1.12.0 in c:\users\vghavate3103\appdata\roaming\python\python311\site-packages (from lightning) (2.1.1)
Requirement already satisfied: torchmetrics<3.0,>=0.7.0 in c:\users\vghavate3103\appdata\roaming\python\python311\site-packages (from lightning) (1.2.1)
Requirement already satisfied: tqdm<6.0,>=4.57.0 in c:\programdata\anaconda3\lib\site-packages (from lightning) (4.65.0)
Requirement already satisfied: typing-extensions<6.0,>=4.0.0 in c:\programdata\anaconda3\lib\site-packages (from lightning) (4.7.1)
Requirement already satisfied: pytorch-lightning in c:\users\vghavate3103\appdata\roaming\python\python311\site-packages (from lightning) (2.1.2)
Requirement already satisfied: requests in c:\programdata\anaconda3\lib\site-packages (from fsspec[http]<2025.0,>2021.06.0->lightning) (2.31.0)
Requirement already satisfied: aiohttp!=4.0.0a0,!4.0.0a1 in c:\programdata\anaconda3\lib\site-packages (from fsspec[http]<2025.0,>2021.06.0->lightning) (3.8.5)
Requirement already satisfied: setuptools in c:\programdata\anaconda3\lib\site-packages (from lightning-utilities<2.0,>=0.8.0->lightning) (68.0.0)
Requirement already satisfied: filelock in c:\programdata\anaconda3\lib\site-packages (from torch<4.0,>=1.12.0->lightning) (3.9.0)
Requirement already satisfied: sympy in c:\programdata\anaconda3\lib\site-packages (from torch<4.0,>=1.12.0->lightning) (1.11.1)
Requirement already satisfied: networkx in c:\programdata\anaconda3\lib\site-packages (from torch<4.0,>=1.12.0->lightning) (3.1)
Requirement already satisfied: Jinja2 in c:\programdata\anaconda3\lib\site-packages (from torch<4.0,>=1.12.0->lightning) (3.1.2)
Requirement already satisfied: colorama in c:\programdata\anaconda3\lib\site-packages (from tqdm<6.0,>=4.57.0->lightning) (0.4.6)
Requirement already satisfied: attrs>=17.3.0 in c:\programdata\anaconda3\lib\site-packages (from aiohttp!=4.0.0a0,!4.0.0a1->fsspec[http]<2025.0,>2021.06.0->lightning) (22.1.0)
Requirement already satisfied: charset-normalizer<4.0,>=2.0 in c:\programdata\anaconda3\lib\site-packages (from aiohttp!=4.0.0a0,!4.0.0a1->fsspec[http]<2025.0,>2021.06.0->lightning) (2.0.4)
Requirement already satisfied: multidict<7.0,>=4.5 in c:\programdata\anaconda3\lib\site-packages (from aiohttp!=4.0.0a0,!4.0.0a1->fsspec[http]<2025.0,>2021.06.0->lightning) (6.0.2)
Requirement already satisfied: async-timeout<5.0,>=4.0.0a3 in c:\programdata\anaconda3\lib\site-packages (from aiohttp!=4.0.0a0,!4.0.0a1->fsspec[http]<2025.0,>2021.06.0->lightning) (4.0.2)
Requirement already satisfied: yarl<2.0,>=1.0 in c:\programdata\anaconda3\lib\site-packages (from aiohttp!=4.0.0a0,!4.0.0a1->fsspec[http]<2025.0,>2021.06.0->lightning) (1.8.1)
Requirement already satisfied: frozenlist>=1.1.1 in c:\programdata\anaconda3\lib\site-packages (from aiohttp!=4.0.0a0,!4.0.0a1->fsspec[http]<2025.0,>2021.06.0->lightning) (1.3.3)
Requirement already satisfied: aiosignal>=1.1.2 in c:\programdata\anaconda3\lib\site-packages (from aiohttp!=4.0.0a0,!4.0.0a1->fsspec[http]<2025.0,>2021.06.0->lightning) (1.2.0)
Requirement already satisfied: MarkupSafe>=2.0 in c:\programdata\anaconda3\lib\site-packages (from Jinja2->torch<4.0,>=1.12.0->lightning) (2.1.1)
Requirement already satisfied: idna<4,>=2.5 in c:\programdata\anaconda3\lib\site-packages (from requests->fsspec[http]<2025.0,>2021.06.0->lightning) (3.4)
Requirement already satisfied: urllib3<3,>=1.21.1 in c:\programdata\anaconda3\lib\site-packages (from requests->fsspec[http]<2025.0,>2021.06.0->lightning) (1.26.16)
Requirement already satisfied: certifi>=2017.4.17 in c:\programdata\anaconda3\lib\site-packages (from requests->fsspec[http]<2025.0,>2021.06.0->lightning) (2023.7.22)
Requirement already satisfied: mpmath>=0.19 in c:\programdata\anaconda3\lib\site-packages (from sympy->torch<4.0,>=1.12.0->lightning) (1.3.0)
Defaulting to user installation because normal site-packages is not writeable
Collecting pytorch_forecasting
Using cached pytorch_forecasting-0.10.1-py3-none-any.whl (127 kB)
Requirement already satisfied: matplotlib in c:\programdata\anaconda3\lib\site-packages (from pytorch_forecasting) (3.7.2)
Collecting optuna<3.0.0,>=2.3.0 (from pytorch_forecasting)
Using cached optuna-2.10.1-py3-none-any.whl (308 kB)
Collecting pandas<2.0.0,>=1.3.0 (from pytorch_forecasting)
Using cached pandas-1.5.3-cp311-cp311-win_amd64.whl (10.3 MB)
Collecting pytorch-lightning<2.0.0,>=1.2.4 (from pytorch_forecasting)
Using cached pytorch_lightning-1.9.5-py3-none-any.whl (829 kB)
Collecting scikit-learn<1.1,>=0.24 (from pytorch_forecasting)

Using cached scikit-learn-1.0.2.tar.gz (6.7 MB)
Installing build dependencies: started
Installing build dependencies: finished with status 'done'
Getting requirements to build wheel: started
Getting requirements to build wheel: finished with status 'done'
Preparing metadata (pyproject.toml): started
Preparing metadata (pyproject.toml): finished with status 'error'

error: subprocess-exited-with-error

Preparing metadata (pyproject.toml) did not run successfully.
exit code: 1

[66 lines of output]

Partial import of sklearn during the build process.

setup.py:128: DeprecationWarning:

```
`numpy.distutils` is deprecated since NumPy 1.23.0, as a result  
of the deprecation of `distutils` itself. It will be removed for  
Python >= 3.12. For older Python versions it will remain present.  
It is recommended to use `setuptools < 60.0` for those Python versions.  
For more details, see:  
https://numpy.org/devdocs/reference/distutils\_status\_migration.html
```

```
from numpy.distutils.command.build_ext import build_ext # noqa
INFO: No module named 'numpy.distutils._msvccompiler' in numpy.distutils; trying from distutils
Traceback (most recent call last):
  File "C:\ProgramData\anaconda3\Lib\site-packages\pip\_vendor\pyproject_hooks\_in_process\_in_process.p
y", line 353, in <module>
    main()
  File "C:\ProgramData\anaconda3\Lib\site-packages\pip\_vendor\pyproject_hooks\_in_process\_in_process.p
y", line 335, in main
    json_out['return_val'] = hook(**hook_input['kwargs'])
                             ~~~~~
  File "C:\ProgramData\anaconda3\Lib\site-packages\pip\_vendor\pyproject_hooks\_in_process\_in_process.p
y", line 149, in prepare_metadata_for_build_wheel
    return hook(metadata_directory, config_settings)
           ~~~~~
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\setupto
ols\build_meta.py", line 174, in prepare_metadata_for_build_wheel
    self.run_setup()
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\setupto
ols\build_meta.py", line 268, in run_setup
    self).run_setup(setup_script=setup_script)
           ~~~~~
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\setupto
ols\build_meta.py", line 158, in run_setup
    exec(compile(code, __file__, 'exec'), locals())
  File "setup.py", line 319, in <module>
    setup_package()
  File "setup.py", line 315, in setup_package
    setup(**metadata)
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\numpy\d
istutils\core.py", line 135, in setup
    config = configuration()
             ~~~~~
  File "setup.py", line 201, in configuration
    config.add_subpackage("sklearn")
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\numpy\d
istutils\misc_util.py", line 1050, in add_subpackage
    config_list = self.get_subpackage(subpackage_name, subpackage_path,
                             ~~~~~
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\numpy\d
istutils\misc_util.py", line 1016, in get_subpackage
    config = self._get_configuration_from_setup_py(
             ~~~~~
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\numpy\d
istutils\misc_util.py", line 958, in _get_configuration_from_setup_py
    config = setup_module.configuration(*args)
             ~~~~~
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-install-vz5byaae\scikit-learn_8388def4b00a47b99534f7
99919104e2\sklearn\setup.py", line 85, in configuration
    cythonize_extensions(top_path, config)
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-install-vz5byaae\scikit-learn_8388def4b00a47b99534f7
99919104e2\sklearn\_build_utils\_init_.py", line 47, in cythonize_extensions
    basic_check_build()
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-install-vz5byaae\scikit-learn_8388def4b00a47b99534f7
99919104e2\sklearn\_build_utils\pre_build_helpers.py", line 114, in basic_check_build
    compile_test_program(code)
  File "C:\Users\vghavate3103\AppData\Local\Temp\pip-install-vz5byaae\scikit-learn_8388def4b00a47b99534f7
99919104e2\sklearn\_build_utils\pre_build_helpers.py", line 70, in compile_test_program
    ccompiler.compile()
```

```

File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\setuptools\distutils\msvccompiler.py", line 327, in compile
    self.initialize()
File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\setuptools\distutils\msvccompiler.py", line 224, in initialize
    vc_env = _get_vc_env(plat_spec)
    ~~~~~
File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\setuptools\msvc.py", line 316, in msvc14_get_vc_env
    return _msvc14_get_vc_env(plat_spec)
    ~~~~~
File "C:\Users\vghavate3103\AppData\Local\Temp\pip-build-env-5kpyzdik\overlay\Lib\site-packages\setuptools\msvc.py", line 270, in _msvc14_get_vc_env
    raise distutils.errors.DistutilsPlatformError(
distutils.errors.DistutilsPlatformError: Microsoft Visual C++ 14.0 or greater is required. Get it with "Microsoft C++ Build Tools": https://visualstudio.microsoft.com/visual-cpp-build-tools/
[end of output]

```

note: This error originates from a subprocess, and is likely not a problem with pip.
error: metadata-generation-failed

Encountered error while generating package metadata.

See above for output.

note: This is an issue with the package mentioned above, not pip.
hint: See above for details.

```

In [ ]: import lightning.pytorch as pl
        from lightning.pytorch.callbacks import EarlyStopping, LearningRateMonitor
        from lightning.pytorch.loggers import TensorBoardLogger
        import numpy as np
        import pandas as pd
        import torch

        from pytorch_forecasting import Baseline, TemporalFusionTransformer, TimeSeriesDataSet
        from pytorch_forecasting.data import GroupNormalizer
        from pytorch_forecasting.metrics import MAE, SMAPE, PoissonLoss, QuantileLoss
        from pytorch_forecasting.models.temporal_fusion_transformer.tuning import optimize_hyperparameters

```

```

-----
ModuleNotFoundError                                Traceback (most recent call last)
Cell In[13], line 8
      5 import pandas as pd
      6 import torch
----> 8 from pytorch_forecasting import Baseline, TemporalFusionTransformer, TimeSeriesDataSet
      9 from pytorch_forecasting.data import GroupNormalizer
     10 from pytorch_forecasting.metrics import MAE, SMAPE, PoissonLoss, QuantileLoss

ModuleNotFoundError: No module named 'pytorch_forecasting'

```

```

In [ ]: earliest_time= df['Date'].min()

```

```

In [ ]: df["day_of_week"] = df['Date'].dt.dayofweek.astype(str).astype("int") # categories have be strings
        df["week_of_year"] = df['Date'].dt.isocalendar().week.astype(str).astype("int") # categories have be strings
        df["month"] = df['Date'].dt.month.astype(str).astype("int")
        df['hour'] = df['Date'].dt.hour.astype(str).astype("int")
        df['day'] = df['Date'].dt.day.astype(str).astype("int")
        #df['minute'] = df['Date'].dt.minute.astype(str).astype("int")
        df['time_idx']=df.index
        df['hours_from_start'] = (df['Date'] - earliest_time).dt.seconds / 60 / 60 + (df['Date'] - earliest_time).dt.days
        df['hours_from_start'] = df['hours_from_start'].astype('int')
        df['days_from_start'] = (df['Date'] - earliest_time).dt.days
        df['group']=0
        df['Global_active_power']=df['Global_active_power'].astype("float64")
        time_df = df[['
            'Global_active_power'
            , 'GT1_Hits'
            , 'GT2_Hits'
            , 'GT3_Hits'
            , 'day_of_week'
            , 'week_of_year'
            , 'month'
            , 'hour'
            , 'day'

```

```
, 'time_idx'
, 'hours_from_start'
, 'days_from_start'
, 'group'
]]
df.dtypes
```

```
In [ ]: time_df.isna().values.sum()
```

```
In [ ]: #Hyperparameters
#batch size=64
#number heads=4, hidden sizes=160, lr=0.001, gr_clip=0.1

max_prediction_length = 24
max_encoder_length = 7*24
training_cutoff = time_df["hours_from_start"].max() - max_prediction_length

training = TimeSeriesDataSet(
    time_df[lambda x: x.hours_from_start <= training_cutoff],
    time_idx="hours_from_start",
    target="Global_active_power",
    group_ids=['group'],
    min_encoder_length=max_encoder_length // 2,
    max_encoder_length=max_encoder_length,
    min_prediction_length=1,
    max_prediction_length=max_prediction_length,
    #static_categoricals=["consumer_id"],
    time_varying_known_reals=["hours_from_start", "day", "day_of_week", "month", 'hour'],
    time_varying_unknown_reals=['Global_active_power'],
    target_normalizer=GroupNormalizer(
        groups=["group"], transformation="softplus"
    ), # we normalize by group
    add_relative_time_idx=True,
    add_target_scales=True,
    add_encoder_length=True,
    allow_missing_timesteps=True
)

validation = TimeSeriesDataSet.from_dataset(training, time_df, predict=True, stop_randomization=True)

# create dataloaders for our model
batch_size = 64
# if you have a strong GPU, feel free to increase the number of workers
train_dataloader = training.to_dataloader(train=True, batch_size=batch_size, num_workers=5)
val_dataloader = validation.to_dataloader(train=False, batch_size=batch_size * 10, num_workers=5)
```

```
In [ ]: early_stop_callback = EarlyStopping(monitor="val_loss", min_delta=1e-4, patience=5, verbose=True, mode="min")
lr_logger = LearningRateMonitor()
logger = TensorBoardLogger("lightning_logs")

trainer = pl.Trainer(
    max_epochs=45,
    accelerator='auto',
    devices=1,
    enable_model_summary=True,
    gradient_clip_val=0.1,
    callbacks=[lr_logger, early_stop_callback],
    logger=logger)

tft = TemporalFusionTransformer.from_dataset(
    training,
    learning_rate=0.01,
    hidden_size=160,
    attention_head_size=4,
    dropout=1,
    hidden_continuous_size=160,
    output_size=7, # there are 7 quantiles by default: [0.02, 0.1, 0.25, 0.5, 0.75, 0.9, 0.98]
    loss=QuantileLoss(),
    log_interval=10,
    reduce_on_plateau_patience=4)

trainer.fit(
    tft,
```



```
train_dataloaders=train_data_loader,  
val_dataloaders=val_data_loader)
```

```
In [ ]: best_model_path = trainer.checkpoint_callback.best_model_path  
print(best_model_path)  
best_tft = TemporalFusionTransformer.load_from_checkpoint(best_model_path)
```

```
In [ ]: #Take a look at what the raw_predictions variable contains  
  
raw_predictions = best_tft.predict(val_data_loader, mode="raw", return_x=True)  
print(raw_predictions._fields)  
#('output', 'x', 'index', 'decoder_lengths', 'y')  
  
print('\n')  
print(raw_predictions.output._fields)  
# ('prediction',  
# 'encoder_attention',  
# 'decoder_attention',  
# 'static_variables',  
# 'encoder_variables',  
# 'decoder_variables',  
# 'decoder_lengths',  
# 'encoder_lengths')  
  
print('\n')  
print(raw_predictions.output.prediction.shape)  
#torch.Size([5, 24, 7])  
  
# We get predictions of 5 time-series for 24 days.  
# For each day we get 7 predictions – these are the 7 quantiles:  
#[0.02, 0.1, 0.25, 0.5, 0.75, 0.9, 0.98]  
# We are mostly interested in the 4th quantile which represents, let's say, the 'median loss'  
# fyi, although docs use the term quantiles, the most accurate term are percentiles  
  
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```

```
In [ ]: import matplotlib.pyplot as plt  
for idx in range(5): # plot all 5 consumers  
    fig, ax = plt.subplots(figsize=(10, 4))  
    best_tft.plot_prediction(raw_predictions.x, raw_predictions.output, idx=idx, add_loss_to_title=QuantileLoss)
```

```
In [ ]: raw_predictions = best_tft.predict(val_data_loader, mode="raw", return_x=True)  
interpretation = best_tft.interpret_output(raw_predictions.output, reduction="sum")  
best_tft.plot_interpretation(interpretation)
```