```
In [1]: from matplotlib import pyplot as plt
        from matplotlib.dates import MonthLocator, num2date
        from matplotlib.ticker import FuncFormatter
        from prophet import Prophet
        from prophet.diagnostics import cross validation, performance metrics
        from prophet.plot import add changepoints to plot
        import pandas as pd
        import numpy as np
        import datetime as dt
        from collections import defaultdict
        import time
        import datetime as dt
        from pytz import timezone
        tz = timezone('EST')
        from tqdm import tqdm
        from sklearn.metrics import mean absolute error, mean absolute percentage error,
        import seaborn as sns
        %config InlineBackend.figure format = 'retina'
        %matplotlib inline
        from matplotlib import pyplot as plt
        from matplotlib import style
        sns.set()
        ri2011 = pd.read excel(ri2011, 'RI')
        ri2012 = pd.read excel(ri2012, 'RI')
```

```
In [2]: ri2011 = pd.ExcelFile(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_2011
    ri2011 = pd.read_excel(ri2011, 'RI')
    ri2012 = pd.ExcelFile(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_2011
    ri2012 = pd.read_excel(ri2012, 'RI')
    ri2013 = pd.ExcelFile(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_2011
    ri2013 = pd.read_excel(ri2013, 'RI')
    ri2014 = pd.ExcelFile(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_2011
    ri2014 = pd.read_excel(ri2014, 'RI')
    ri2015 = pd.ExcelFile(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_2011
    ri2015 = pd.ExcelFile(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_2011
    ri2016 = pd.ExcelFile(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_2011
    ri2016 = pd.read_excel(ri2016, 'RI')
```

```
In [3]: ri2017 = pd.read_excel(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_201
    ri2018 = pd.read_excel(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_201
    ri2019 = pd.read_excel(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_201
    ri2020 = pd.read_excel(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_201
    ri2021 = pd.read_excel(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_201
    ri2022 = pd.read_excel(r"C:\Users\Rohan\Desktop\Big Data\Load Data\smd_hourly_201
```

In [4]: ri2022

Out[4]:

| | Date | Hr_End | DA_Demand | RT_Demand | DA_LMP | DA_EC | DA_CC | DA_MLC | RT_LMP | RT_ |
|-----|------------------------|--------|-----------|-----------|--------|--------|-------|--------|--------|------|
| 0 | 2022 - 01-01 | 1 | 699.2 | 693.413 | 32.42 | 32.35 | 0.23 | -0.16 | 25.83 | 25. |
| 1 | 2022 - 01-01 | 2 | 677.8 | 662.089 | 32.54 | 32.31 | 0.28 | -0.05 | 25.87 | 25. |
| 2 | 2022 - 01-01 | 3 | 645.2 | 638.986 | 30.74 | 30.85 | 0.00 | -0.11 | 27.53 | 27. |
| 3 | 2022 - 01-01 | 4 | 642.4 | 625.841 | 29.59 | 29.69 | 0.00 | -0.10 | 25.14 | 25. |
| 4 | 2022 - 01-01 | 5 | 637.7 | 623.152 | 30.74 | 30.86 | 0.00 | -0.12 | 29.26 | 29. |
| | | | | | | | ••• | | | |
| 739 | 2022- 01-31 | 20 | 1118.3 | 1141,213 | 227.10 | 226.40 | 0.00 | 0.70 | 296.70 | 295. |
| 740 | 2022- 01-31 | 21 | 1064.9 | 1101.191 | 203.17 | 202.82 | 0.00 | 0.35 | 264.93 | 264. |
| 741 | 2022- 01-31 | 22 | 985.5 | 1046.707 | 183.95 | 183.42 | 0.00 | 0.53 | 252.53 | 251. |
| 742 | 2022- 01-31 | 23 | 907.8 | 984.058 | 179.94 | 179.93 | 0.00 | 0.01 | 191.17 | 190. |
| 743 | 2022- 01-31 | 24 | 842.3 | 928.069 | 192.34 | 190.54 | 0.00 | 1.80 | 189.69 | 189. |

744 rows × 14 columns

```
In [5]: val2011 = ri2011['DEMAND']
  val2012 = ri2012['DEMAND']
  val2013 = ri2013['DEMAND']
  val2014 = ri2014['DEMAND']
  val2015 = ri2015['DEMAND']
  val2016 = ri2016['RT_Demand']
  val2017 = ri2017['RT_Demand']
  val2018 = ri2018['RT_Demand']
  val2019 = ri2019['RT_Demand']
  val2020 = ri2020['RT_Demand']
  val2021 = ri2021['RT_Demand']
  val2022 = ri2022['RT_Demand']
```

In [6]: values = [val2011, val2012, val2013, val2014, val2015, val2016, val2017, val2018]

values_df = pd.concat(values, axis=0, ignore_index=False)

values_df = values_df.reset_index()

period = len(values_df)

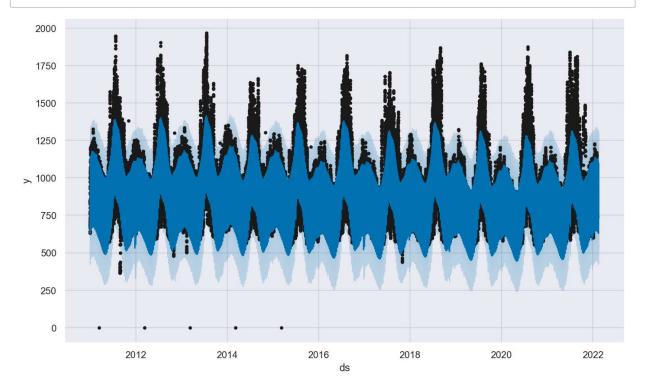
```
In [7]: rng = pd.date range('2011-01-01', periods=period, freq='1H')
                           date df = pd.DataFrame({ 'ds': rng})
                           date_df = date_df.reset_index()
  In [8]: frames = [date_df, values_df]
                           ri_load = pd.concat(frames, axis=1, ignore_index=False)
                           ri_load = ri_load.rename(columns={ri_load.columns[1]: 'ds', ri_load.columns[3]:
                           frames2 = [ri load['ds'], ri load['y']]
                           ri load = pd.concat(frames2, axis=1, ignore_index=False)
                           ri_load
  Out[8]:
                                                                                   ds
                                                                                                             У
                                       0 2011-01-01 00:00:00
                                                                                               775.000
                                       1 2011-01-01 01:00:00
                                                                                               733.000
                                       2 2011-01-01 02:00:00
                                                                                               702.000
                                       3 2011-01-01 03:00:00
                                                                                               684.000
                                       4 2011-01-01 04:00:00
                                                                                               681.000
                             97171 2022-01-31 19:00:00 1141.213
                             97172 2022-01-31 20:00:00
                                                                                           1101.191
                             97173 2022-01-31 21:00:00 1046.707
                             97174 2022-01-31 22:00:00
                                                                                               984.058
                             97175 2022-01-31 23:00:00
                                                                                               928.069
                           97176 rows × 2 columns
  In [9]: model = Prophet(
                                                  changepoint prior scale=0.5,
                                                  seasonality_mode='multiplicative',
                                                  interval width=0.95,
                           model.add_country_holidays(country_name='US')
  Out[9]: cout[9]: <p
In [10]: model.fit(ri_load)
Out[10]:  content content
In [11]: | future_pd = model.make_future_dataframe(
                                                  periods=365,
                                                  freq='1H',
                                                  include history=True
                                       )
                           # make predictions
                           forecast_pd = model.predict(future_pd)
```

In [12]: forecast_pd[['ds', 'yhat', 'yhat_lower', 'yhat_upper']].tail()

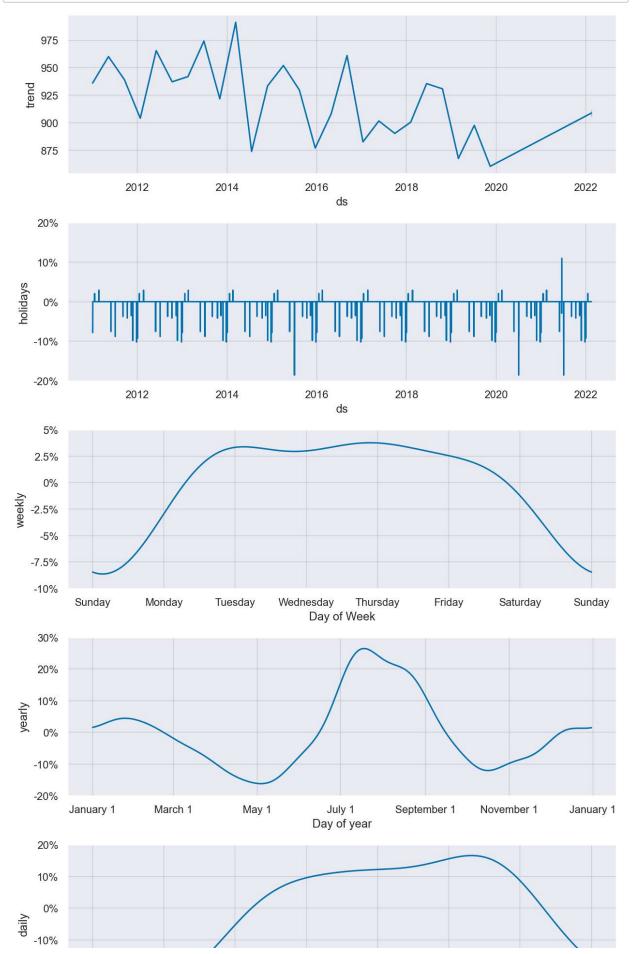
Out[12]:

| | ds | yhat | yhat_lower | yhat_upper |
|-------|---------------------|------------|------------|------------|
| 97536 | 2022-02-16 00:00:00 | 798.123495 | 599.344577 | 993.996024 |
| 97537 | 2022-02-16 01:00:00 | 758.502063 | 565.280485 | 955.048214 |
| 97538 | 2022-02-16 02:00:00 | 735.267810 | 546.581224 | 927.245388 |
| 97539 | 2022-02-16 03:00:00 | 729.627914 | 529.106838 | 923.380495 |
| 97540 | 2022-02-16 04:00:00 | 745.894001 | 527.262747 | 945.770642 |

In [13]: fig1 = model.plot(forecast_pd)



In [14]: fig2 = model.plot_components(forecast_pd)





In [15]: forecast_pd

Out[15]:

| | ds | trend | yhat_lower | yhat_upper | trend_lower | trend_upper | Christmas Day | Christm Day_lov |
|-------|----------------------------|------------|------------|------------|-------------|-------------|------------------|--------------------|
| 0 | 2011- 01-01 00:00:00 | 936.122990 | 499.060706 | 907.386175 | 936.122990 | 936.122990 | 0.0 | |
| 1 | 2011- 01-01 01:00:00 | 936.130718 | 476.948914 | 868.036109 | 936.130718 | 936.130718 | 0.0 | |
| 2 | 2011- 01-01 02:00:00 | 936.138447 | 421.885007 | 830.431302 | 936.138447 | 936.138447 | 0.0 | |
| 3 | 2011- 01-01 03:00:00 | 936.146175 | 429.554392 | 820.737068 | 936.146175 | 936.146175 | 0.0 | |
| 4 | 2011- 01-01 04:00:00 | 936.153904 | 440.630758 | 840.178129 | 936.153904 | 936.153904 | 0.0 | |
| | | | | | | | | |
| 97536 | 2022- 02-16 00:00:00 | 908.956471 | 599.344577 | 993.996024 | 905.589641 | 911.498232 | 0.0 | |
| 97537 | 2022- 02-16 01:00:00 | 908.958911 | 565.280485 | 955.048214 | 905.576123 | 911.511475 | 0.0 | |
| 97538 | 2022- 02-16 02:00:00 | 908.961350 | 546.581224 | 927.245388 | 905.562606 | 911.524718 | 0.0 | |
| 97539 | 2022- 02-16 03:00:00 | 908.963790 | 529.106838 | 923.380495 | 905.549088 | 911.537961 | 0.0 | |
| 97540 | 2022- 02-16 04:00:00 | 908.966230 | 527.262747 | 945.770642 | 905.535571 | 911.551204 | 0.0 | |
| | | | | | | | | |

97541 rows × 73 columns

In []: