

In [6]:

```
import pandas as pd
from matplotlib import pyplot
from pandas import read_csv
from pandas import to_datetime
from pandas import DataFrame
from pandas import date_range
from pandas.tseries.offsets import MonthEnd
from fbprophet import Prophet
```

In [7]:

```
df = read_csv('GHI.csv', header=0)
# summarize shape
print(df.shape)
# show first few rows
print(df.head())
```

```
(691, 2)
      Date  Volumes
0  1/2/2020         6
1  1/3/2020         6
2  1/6/2020         6
3  1/7/2020        15
4  1/8/2020        10
```

In [3]:

```
# plot the time series
#df.plot()
#pyplot.show()
```

In [8]:

```
df.columns = ['ds', 'y']
df['ds'] = to_datetime(df['ds'])
print(df.head())
```

```
      ds  y
0 2020-01-02  6
1 2020-01-03  6
2 2020-01-06  6
3 2020-01-07 15
4 2020-01-08 10
```

In [25]:

```
df['cap'] = 38
df['floor'] = 1
m = Prophet(growth = 'logistic',
             changepoint_prior_scale=0.100,
             daily_seasonality=False,
             weekly_seasonality=False,
             seasonality_mode='multiplicative',
             seasonality_prior_scale=0.1,)
m.add_seasonality(name='daily', period=1, prior_scale=0.01, fourier_order=10)
m.add_seasonality(name='weekly', period=7, prior_scale=0.05, fourier_order=10)
m.add_seasonality(name='monthly', period=30.5, prior_scale=0.07, fourier_order=15)
m.fit(df)
```

Out[25]:

```
<fbprophet.forecaster.Prophet at 0x15afb88cf40>
```

In []:

In [31]:

```
## Hyperparameter tuning
import itertools
import numpy as np
from fbprophet.diagnostics import cross_validation
from fbprophet.diagnostics import performance_metrics

#param_grid = {
#    'changepoint_prior_scale': [0.001, 0.01, 0.1, 0.5],
#    'seasonality_prior_scale': [0.01, 0.1, 1.0, 5.0, 10.0, 15],
#}

# Generate all combinations of parameters
#all_params = [dict(zip(param_grid.keys(), v)) for v in itertools.product(*param_grid.values())]
#maes = [] # Store the RMSEs for each params here

# Use cross validation to evaluate all parameters
#for params in all_params:
#    m2 = Prophet(**params).fit(df) # Fit model with given params
#    df_cv = cross_validation(m2, initial='365.25 days', period='30 days', horizon = '30
#0 days', parallel="processes")
#    df_p = performance_metrics(df_cv, rolling_window=1)
#    maes.append(df_p['mae'].values[0])

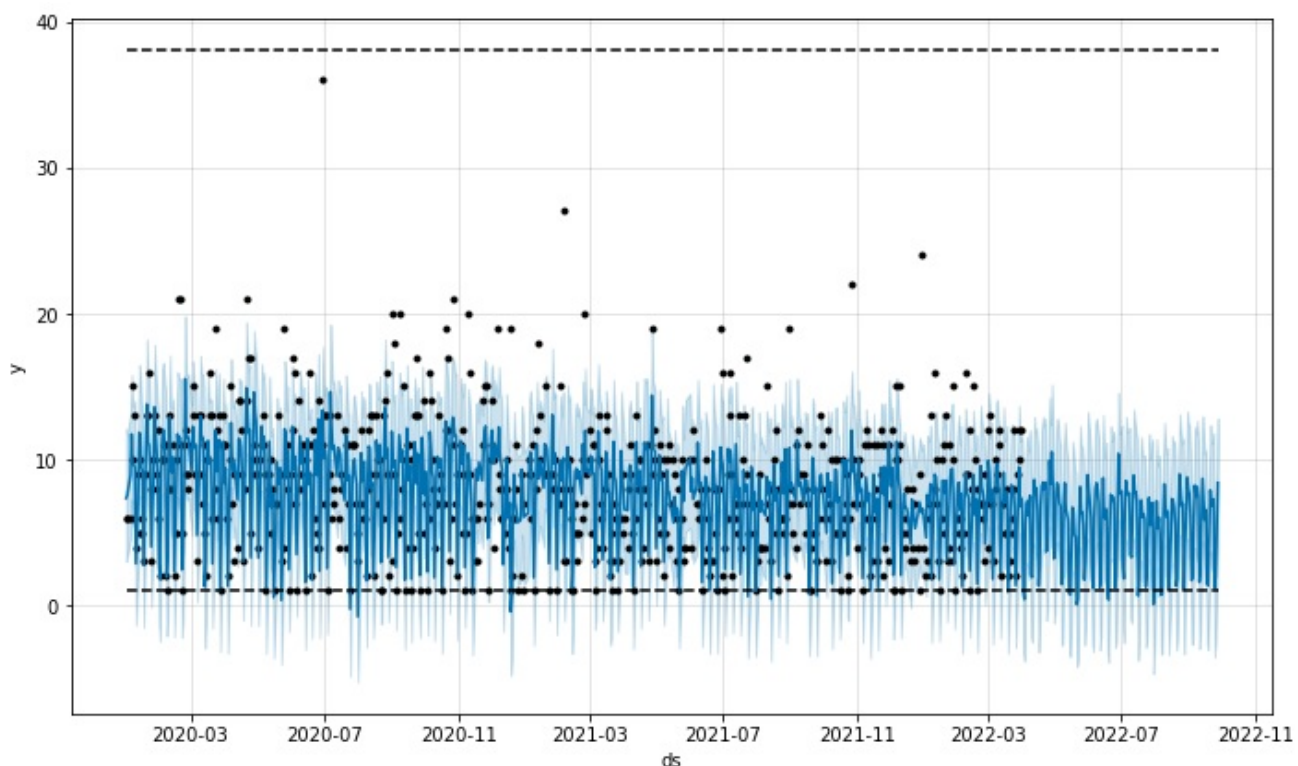
# Find the best parameters
#tuning_results = pd.DataFrame(all_params)
#tuning_results['mae'] = maes
#print(tuning_results)
```

In []:

In [26]:

```
future = m.make_future_dataframe(periods=180)
future['cap'] = 38
future['floor'] = 1

forecast = m.predict(future)
forecast[['ds', 'yhat', 'yhat_lower', 'yhat_upper']]
fig1 = m.plot(forecast)
```



```
In [ ]:
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```
In [27]:
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```
fig2 = m.plot_components(forecast)
```

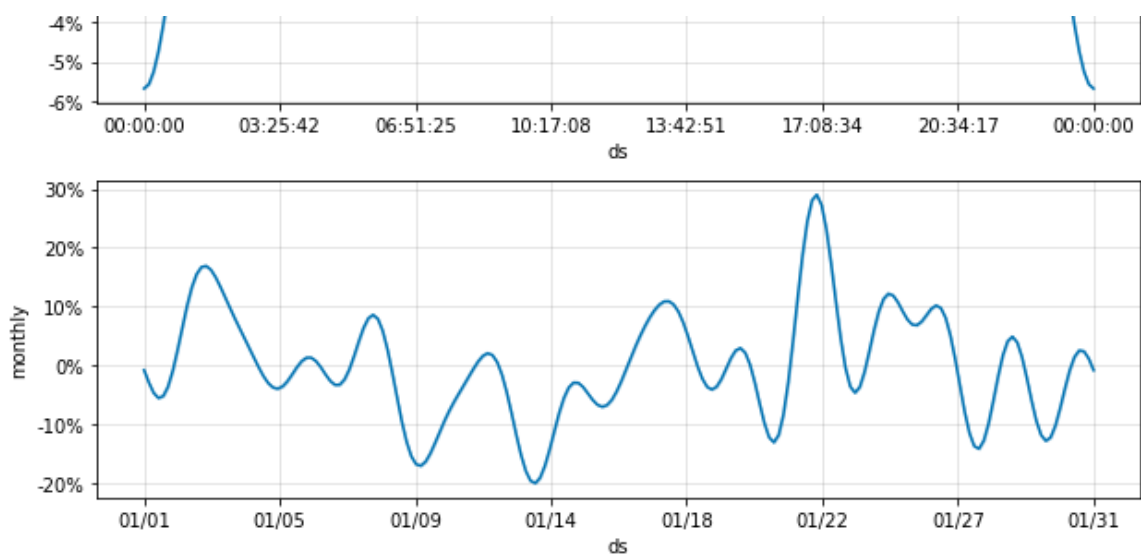
```
C:\Users\User\anaconda3\lib\site-packages\fbprophet\plot.py:422: UserWarning:  
FixedFormatter should only be used together with FixedLocator
```

```
C:\Users\User\anaconda3\lib\site-packages\fbprophet\plot.py:422: UserWarning:  
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```

```
C:\Users\User\anaconda3\lib\site-packages\fbprophet\plot.py:422: UserWarning:  
FixedFormatter should only be used together with FixedLocator
```





In [28]:

```
from fbprophet.plot import plot_plotly, plot_components_plotly
plot_plotly(m, forecast)
```

In [29]:

```
from fbprophet.diagnostics import cross_validation
df_cv = cross_validation(m, initial='365 days', period='30 days', horizon = '9 days')
```

INFO:fbprophet:Making 15 forecasts with cutoffs between 2021-01-26 00:00:00 and 2022-03-22 00:00:00
WARNING:fbprophet:Seasonality has period of 365.25 days which is larger than initial window. Consider increasing initial.

In [30]:

```
from fbprophet.diagnostics import performance_metrics
from fbprophet.plot import plot_cross_validation_metric
df_p = performance_metrics(df_cv)
fig = plot_cross_validation_metric(df_cv, metric='mape')
df_p.head()
```

C:\Users\User\anaconda3\lib\site-packages\fbprophet\plot.py:526: FutureWarning:

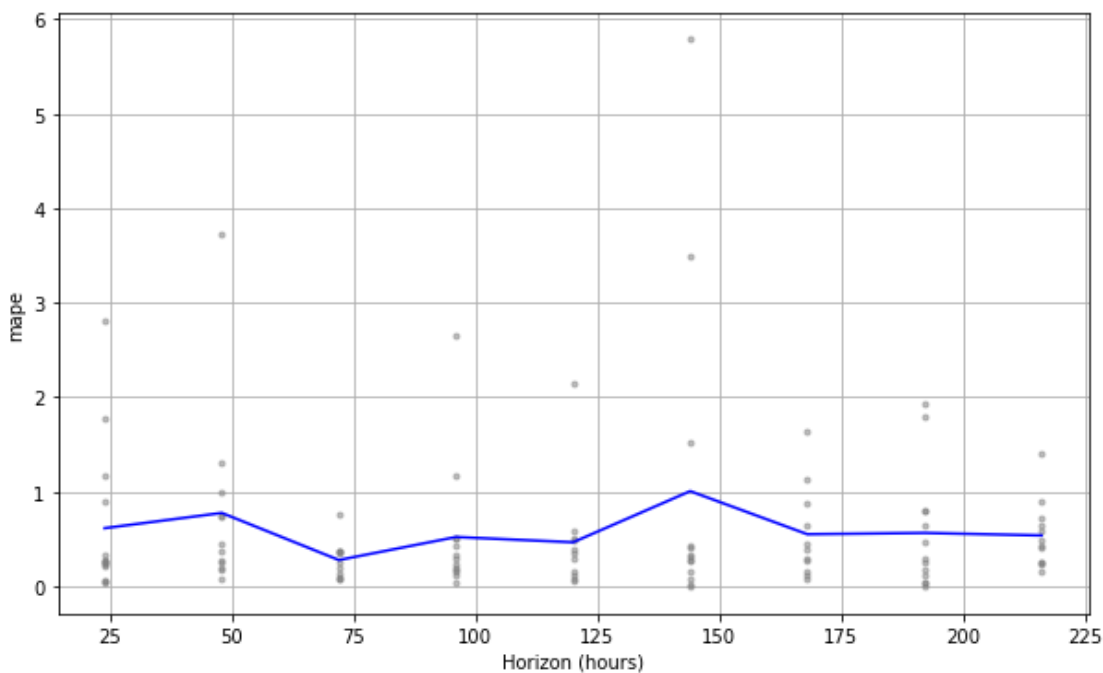
casting timedelta64[ns] values to int64 with .astype(...) is deprecated and will raise in a future version. Use .view(...) instead.

C:\Users\User\anaconda3\lib\site-packages\fbprophet\plot.py:527: FutureWarning:

casting timedelta64[ns] values to int64 with .astype(...) is deprecated and will raise in a future version. Use .view(...) instead.

Out[30]:

	horizon	mse	rmse	mae	mape	mdape	coverage
0	1 days	9.132294	3.021969	2.431790	0.616635	0.264826	0.785714
1	2 days	11.947654	3.456538	2.904134	0.777588	0.411394	0.750000
2	3 days	6.771066	2.602127	2.224381	0.279655	0.253880	0.909091
3	4 days	20.755230	4.555791	3.115989	0.523109	0.289536	0.769231
4	5 days	13.136910	3.624488	2.766823	0.467488	0.346505	0.818182



In []:

In [20]:

```
##To save predicted volumes to another csv file for validation
import pandas as pd
import os
df2 = pd.read_csv('GHI.csv', header=0)

df3 = pd.DataFrame()
df3['ds'] = forecast['ds'].copy()
df3['Actual'] = df2['Volumes'].copy()
df3['Predicted'] = forecast['yhat'].copy()
df3['Predicted'] = df3['Predicted'].astype(float).round(0)
```

```
df3.head()
```

```
df3.set_index('ds', inplace=True)  
df3.to_csv('GHI-val.csv')
```

```
In [ ]:
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In [ ]:
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In [7]:
```

```
from sklearn.metrics import mean_squared_error, r2_score, mean_absolute_error, mean_absolute_percentage_error  
df_val = read_csv('GHI-val.csv', header=0)  
#df_val  
df_val["Actual"].astype(float)  
df_val["Predicted"].astype(float)  
#df_val.dtypes  
r2_score(df_val['Actual'], df_val['Predicted'])
```

```
Out[7]:
```

```
0.48828436537313025
```

```
In [8]:
```

```
mean_squared_error(df_val['Actual'], df_val['Predicted'])
```

```
Out[8]:
```

```
25.988505747126435
```

```
In [9]:
```

```
mean_absolute_error(df_val['Actual'], df_val['Predicted'])
```

```
Out[9]:
```

```
3.9655172413793105
```

```
In [10]:
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```
mean_absolute_percentage_error(df_val['Actual'], df_val['Predicted'])
```

```
Out[10]:
```

```
996486124446920.5
```

```
In [27]:
```

```
##To Save the Model  
import json  
from fbprophet.serialize import model_to_json, model_from_json  
with open('serialized_model.json', 'w') as fout:  
    json.dump(model_to_json(m), fout)
```

```
In [23]:
```

```
import pandas as pd  
cutoffs = pd.date_range(start='2020-12-01', end='2021-03-01', freq='M')  
print(cutoffs)
```

```
DatetimeIndex(['2020-12-31', '2021-01-31', '2021-02-28'], dtype='datetime64[ns]', freq='M')
```