

Country-Specific Prophet

This approach creates individual Prophet models for each country of residence:

- Each country gets its own forecasting model trained on its historical data
- Captures country-specific seasonality patterns and trends
- Predicts which countries will produce the most arrivals in future months
- Naturally handles the "Country of Residence" column by training separate models

This might be a bad solution knowing each country has less data when separated to its clusters and each country would need extra supervision just to forecast accurately.

```
In [ ]:

import pandas as pd
from datetime import datetime, timedelta
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
from prophet import Prophet
from prophet.diagnostics import cross_validation, performance_metrics
from prophet.plot import plot_cross_validation_metric
import warnings
import os
import plotly.graph_objects as go
import holidays
from sklearn.metrics import mean_squared_error, mean_absolute_error, r2_score, mean_absolute_percentage_error
warnings.filterwarnings('ignore')

plt.style.use('ggplot')
sns.set_palette("colorblind")
pd.set_option('display.float_format', '{:.10f}'.format)
```

Load the CSV

```
In [ ]:

df = pd.read_csv("/content/drive/MyDrive/dataset/tourism/final-raw-dataset.csv")
df.head()
```

Out[]:

	Year	Country of Residence	January	February	March	April	May	June	July	August	September	October	November	December
0	2008	ARGENTINA	60	41	54	38	58	38	29	46	59	72	55	
1	2008	AUSTRALIA	11218	8861	10857	9904	9630	8554	8412	7965	9077	9215	9542	182
2	2008	AUSTRIA	1145	1028	990	829	555	709	1178	570	451	610	769	12
3	2008	BAHRAIN	226	160	200	239	221	303	403	258	130	308	198	2
4	2008	BANGLADESH	114	128	162	151	202	125	144	199	186	223	179	1

Data prep

Reshape to long format

In []:

```
df_long = pd.melt(
    df,
    id_vars=['Year', 'Country of Residence'],
    value_vars=['January', 'February', 'March', 'April', 'May', 'June',
                'July', 'August', 'September', 'October', 'November', 'December'],
    var_name='Month',
    value_name='Arrivals'
)

# Create a proper date column
month_map = {
    'January': 1, 'February': 2, 'March': 3, 'April': 4, 'May': 5, 'June': 6,
    'July': 7, 'August': 8, 'September': 9, 'October': 10, 'November': 11, 'December': 12
}

df_long['Month_Num'] = df_long['Month'].map(month_map)
df_long['Date'] = pd.to_datetime(df_long['Year'].astype(str) + '-' +
                                df_long['Month_Num'].astype(str) + '-01')
```

Remove future rows on current dataset

In []:

```
cutoff_index = df_long[(df_long['Date'] == pd.to_datetime('2025-04-01'))].tail(1).index[0]
df_long = df_long[df_long['Date'] <= '2025-04-01']
df_long = df_long.sort_values(['Date', 'Country of Residence'])
df_long = df_long.reset_index(drop=True)
df_long
```

Out[]:

	Year	Country of Residence	Month	Arrivals	Month_Num	Date
	0	2008	ARGENTINA	January	60	1 2008-01-01
	1	2008	AUSTRALIA	January	11218	1 2008-01-01
	2	2008	AUSTRIA	January	1145	1 2008-01-01
	3	2008	BAHRAIN	January	226	1 2008-01-01
	4	2008	BANGLADESH	January	114	1 2008-01-01

	20439	2025	VIRGIN ISLANDS (U.S.)	April	2	4 2025-04-01
	20440	2025	WALLIS AND FUTUNA	April	0	4 2025-04-01
	20441	2025	YEMEN	April	3	4 2025-04-01
	20442	2025	ZAMBIA	April	12	4 2025-04-01
	20443	2025	ZIMBABWE	April	29	4 2025-04-01

20444 rows x 6 columns

Check for zero values

In []:

```
data_quality = df_long.groupby('Country of Residence').agg(
    total_records=('Arrivals', 'count'),
    zero_values=('Arrivals', lambda x: (x == 0).sum()),
    missing_values=('Arrivals', lambda x: x.isna().sum()),
    percent_zeros=('Arrivals', lambda x: (x == 0).sum() / len(x) * 100),
    mean_arrivals=('Arrivals', 'mean'),
```

```
max_arrivals=('Arrivals', 'max')
).sort_values('percent_zeros')
data_quality
```

Out[]:

	total_records	zero_values	missing_values	percent_zeros	mean_arrivals	max_arrivals
Country of Residence						
ALAND ISLANDS	28	0	0	0.0000000000	8.3928571429	24
BRITISH INDIAN OCEAN TERRITORY	28	0	0	0.0000000000	15.2857142857	30
JERSEY	28	0	0	0.0000000000	30.5000000000	60
GUERNSEY	28	0	0	0.0000000000	16.3214285714	33
HONGKONG	168	0	0	0.0000000000	8429.4702380952	14997
...
COCOS (KEELING) ISLANDS	24	21	0	87.5000000000	0.2500000000	4
MONTSERRAT	24	22	0	91.6666666667	0.1250000000	2
SOUTH GEORGIA AND THE SOUTH SANDWICH ISLANDS	24	22	0	91.6666666667	0.0833333333	1
SAINT PIERRE AND MIQUELON	28	26	0	92.8571428571	0.0714285714	1
WESTERN SAHARA	36	34	0	94.4444444444	0.0555555556	1

249 rows x 6 columns

Identify countries with consistent data (less than 10% zeros)

In []:

```
main_countries = data_quality[(data_quality['percent_zeros'] < 10) & (data_quality['total_records'] == 208)].index.tolist()
main_countries
```

Out[]:

```
['ITALY',
 'JAPAN',
 'GERMANY',
 'IRELAND',
 'BRAZIL',
 'CANADA',
 'BAHRAIN',
 'AUSTRALIA',
 'NORWAY',
 'SOUTH AFRICA',
 'SWITZERLAND',
 'THAILAND',
 'VIETNAM',
 'USA',
 'UNITED KINGDOM',
 'SPAIN',
 'NETHERLANDS',
 'POLAND',
 'RUSSIA',
 'NEW ZEALAND',
 'MALAYSIA',
 'MEXICO',
 'KOREA',
 'CHINA',
 'FINLAND',
 'FRANCE',
 'INDONESIA',
 'INDIA',
 'BELGIUM',
```

```
'PORTUGAL',
'NEPAL',
'PAKISTAN',
'SWEDEN',
'SAUDI ARABIA',
'SINGAPORE',
'UNITED ARAB EMIRATES',
'PAPUA NEW GUINEA',
'TAIWAN',
'ARGENTINA',
'MYANMAR',
'PERU',
'NIGERIA',
'SRI LANKA',
'GREECE',
'EGYPT',
'KUWAIT',
'JORDAN',
'DENMARK',
'AUSTRIA',
'ISRAEL',
'GUAM',
'COLOMBIA',
'VENEZUELA',
'CAMBODIA',
'IRAN',
'BANGLADESH',
'BRUNEI',
'LAOS',
'LUXEMBOURG']
```

Group inconsistent countries

In []:

```
df_grouped = df_long.copy()
df_grouped['Country of Residence'] = df_grouped['Country of Residence'].apply(
    lambda x: x if x in main_countries else 'Others'
)
```

In []:

```
# Aggregate arrivals for 'Others' by date to avoid duplicate rows
main_df = df_grouped[df_grouped['Country of Residence'].isin(main_countries)]
others_df = df_grouped[~df_grouped['Country of Residence'].isin(main_countries)]

# Aggregate Others by summing arrivals on the same date
others_agg = others_df.groupby(['Year', 'Country of Residence', 'Month', 'Month_Num', 'Date']).agg({
    'Arrivals': 'sum'
}).reset_index()

df_grouped = pd.concat([main_df, others_agg], ignore_index=True).sort_values(['Date', 'Country of Residence'])
df_grouped
```

Out[]:

	Year	Country of Residence	Month	Arrivals	Month_Num	Date	
	0	2008	ARGENTINA	January	60	1	2008-01-01
	1	2008	AUSTRALIA	January	11218	1	2008-01-01
	2	2008	AUSTRIA	January	1145	1	2008-01-01
	3	2008	BAHRAIN	January	226	1	2008-01-01
	4	2008	BANGLADESH	January	114	1	2008-01-01

12267	2025	UNITED ARAB EMIRATES	April	2804	4	2025-04-01
Year		Country of Residence	Month	Arrivals	Month_Num	Date
12268	2025	UNITED KINGDOM	April	18310	4	2025-04-01
12269	2025	USA	April	75202	4	2025-04-01
12270	2025	VENEZUELA	April	11	4	2025-04-01
12271	2025	VIETNAM	April	2573	4	2025-04-01

12480 rows x 6 columns

Handle January 2022 missing values

A temporary solution

```
In [ ]:

df_fixed = df_grouped.copy()

In [ ]:

jan_2022_mask = (df_fixed['Year'] == 2022) & (df_fixed['Month'] == 'January') & (df_fixed['Arrivals'] == 0)
jan_2022_indices = df_fixed[jan_2022_mask].index

for idx in jan_2022_indices:
    country = df_fixed.loc[idx, 'Country of Residence']

    dec_2021_value = df_fixed[(df_fixed['Year'] == 2021) &
                               (df_fixed['Month'] == 'December') &
                               (df_fixed['Country of Residence'] == country)]['Arrivals'].values

    feb_2022_value = df_fixed[(df_fixed['Year'] == 2022) &
                               (df_fixed['Month'] == 'February') &
                               (df_fixed['Country of Residence'] == country)]['Arrivals'].values

    if len(dec_2021_value) > 0 and len(feb_2022_value) > 0:
        interpolated_value = (dec_2021_value[0] + feb_2022_value[0]) / 2
        df_fixed.loc[idx, 'Arrivals'] = interpolated_value
```

Data visualizations

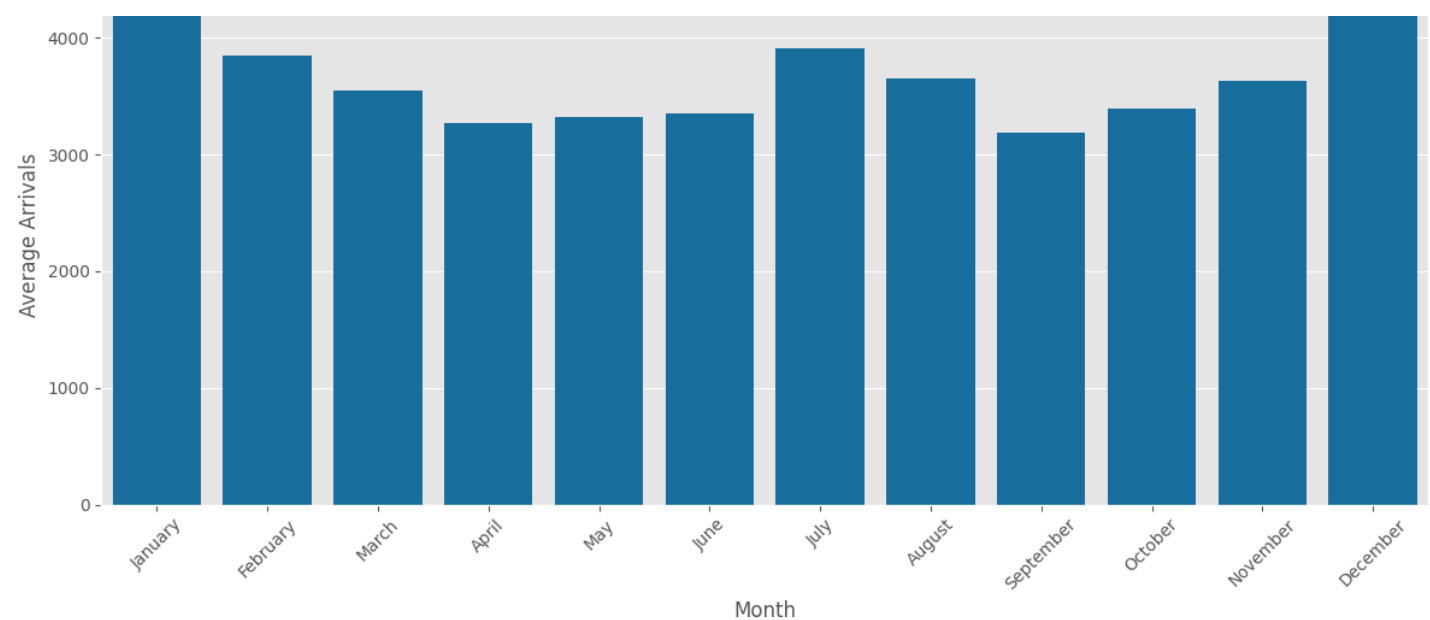
Visualize seasonal patterns

```
In [ ]:

monthly_avg = df_long.groupby(['Month_Num', 'Month'])['Arrivals'].mean().reset_index()
monthly_avg = monthly_avg.sort_values('Month_Num')

plt.figure(figsize=(12, 6))
sns.barplot(x='Month', y='Arrivals', data=monthly_avg, order=[
    'January', 'February', 'March', 'April', 'May', 'June',
    'July', 'August', 'September', 'October', 'November', 'December'
])
plt.title('Average Monthly Tourist Arrivals (Seasonal Pattern)', fontsize=16)
plt.xlabel('Month', fontsize=12)
plt.ylabel('Average Arrivals', fontsize=12)
plt.xticks(rotation=45)
plt.tight_layout()
plt.savefig('seasonal_patterns.png')
plt.show()
```

Average Monthly Tourist Arrivals (Seasonal Pattern)



Prophet model

Adjust regular holidays

holidays package in pip is so helpful here to obtain list of country holidays from 2008 - 2025

```
In [ ]:
data_years = list(range(df_long['Date'].dt.year.min(), df_long['Date'].dt.year.max() + 1))

country_code = 'PH'
country_holidays = holidays.country_holidays(country_code, years=data_years)

holiday_df = pd.DataFrame(
    [(name, date) for date, name in country_holidays.items()],
    columns=['holiday', 'ds']
)

lower_window = 0
upper_window = 0

holiday_df['lower_window'] = lower_window
holiday_df['upper_window'] = upper_window
holiday_df = holiday_df.sort_values(by='ds').reset_index(drop=True)
holiday_df
```

Out []:

	holiday	ds	lower_window	upper_window
0	New Year's Day	2008-01-01	0	0
1	Maundy Thursday	2008-03-20	0	0
2	Good Friday	2008-03-21	0	0
3	Day of Valor	2008-04-07	0	0
4	Labor Day	2008-05-01	0	0
...
336	Immaculate Conception	2025-12-08	0	0
337	Christmas Eve	2025-12-24	0	0
338	Christmas Day	2025-12-25	0	0
339	Rizal Day	2025-12-30	0	0

340	New Year's Eve	2025-12-31	0	0
	holiday	ds	lower_window	upper_window

341 rows x 4 columns

In []:

```
holiday_adjusted = holiday_df.copy()
```

In []:

```
holiday_adjusted['ds'] = pd.to_datetime(holiday_adjusted['ds'])
holiday_adjusted['ds'] = holiday_adjusted['ds'].dt.strftime('%Y-%m-01')
holiday_adjusted['ds'] = pd.to_datetime(holiday_adjusted['ds'])
holiday_adjusted = holiday_adjusted.drop_duplicates(subset=['holiday', 'ds'])
holiday_adjusted
```

Out[]:

	holiday	ds	lower_window	upper_window
0	New Year's Day	2008-01-01	0	0
1	Maundy Thursday	2008-03-01	0	0
2	Good Friday	2008-03-01	0	0
3	Day of Valor	2008-04-01	0	0
4	Labor Day	2008-05-01	0	0
...
336	Immaculate Conception	2025-12-01	0	0
337	Christmas Eve	2025-12-01	0	0
338	Christmas Day	2025-12-01	0	0
339	Rizal Day	2025-12-01	0	0
340	New Year's Eve	2025-12-01	0	0

339 rows x 4 columns

Handling COVID shocks

To prevent large dips and spikes from being captured by the trend component, we can treat the days impacted by COVID-19 as holidays that will not repeat again in the future.

Based on plotted data, these are likely the possible cases. These dates will be adjusted to first of the month since we have regular data gaps

Reference:

- https://facebook.github.io/prophet/docs/handling_shocks.html

Aggregate arrivals column by dates

Sum all arrivals by date so we can visualize what is needed to be used as a lockdown holiday for Prophet.

In []:

```
df_agg_date = df_long[['Date', 'Arrivals']].groupby('Date').sum().reset_index()
df_2019_2023 = df_agg_date[(df_agg_date['Date'].dt.year >= 2019) & (df_agg_date['Date'].dt.year <= 2023)]
```

Use `plotly.graph_objects.go` for plotting so we can use cursor to determine which needs to be logged as lockdown holidays

lockdown holidays

In []:

```
fig = go.Figure()

fig.add_trace(
    go.Scatter(
        x=df_2019_2023['Date'],
        y=df_2019_2023['Arrivals'],
        mode='lines',
        name='Tourist Arrivals',
        line=dict(color='royalblue')
    )
)

fig.update_layout(
    title='Total Monthly Tourist Arrivals (2019-2023)',
    title_font=dict(size=16),
    xaxis_title='Date',
    yaxis_title='Total Arrivals',
    xaxis_title_font=dict(size=12),
    yaxis_title_font=dict(size=12),
    width=1000,
    height=500,
    template='plotly_white'
)

fig.show()
```

In []:

```
lockdowns = pd.DataFrame([
    {
        'holiday': 'covid_impact_1', # First major drop
        'ds': '2020-02-01', # Starting with February 2020 when arrivals began dropping
        'lower_window': 0,
        'ds_upper': '2020-12-01' # Through the end of 2020
    },
    {
```



```

        'holiday': 'covid_impact_2', # Continued low levels
        'ds': '2021-01-01',
        'lower_window': 0,
        'ds_upper': '2021-12-01' # Through the end of 2021
    },
    {
        'holiday': 'covid_recovery', # Recovery period
        'ds': '2022-01-01',
        'lower_window': 0,
        'ds_upper': '2022-07-01' # First half of 2022 when recovery was still ongoing
    }
])

for t_col in ['ds', 'ds_upper']:
    lockdowns[t_col] = pd.to_datetime(lockdowns[t_col])

lockdowns['upper_window'] = (lockdowns['ds_upper'] - lockdowns['ds']).dt.days
lockdowns

```

Out[]:

	holiday	ds	lower_window	ds_upper	upper_window
0	covid_impact_1	2020-02-01	0	2020-12-01	304
1	covid_impact_2	2021-01-01	0	2021-12-01	334
2	covid_recovery	2022-01-01	0	2022-07-01	181

Building Prophet

The following recommendations are tested on aggregated data. Not country-specific data. Here is the notebook for aggregated forecasting: [link](#)

For training:

- We'll be using `multiplicative` seasonality here since that fits our problem. Tho this might cause a problem for calculating MAPE
- PH Holidays are added but adjusted to first day of month since our aggregated (monthly) data has regular gaps.
- COVID19 phase are treated as holidays also

Performance metrics (R^2 score) of model if it implements the ff.:

Configuration	R^2 Score	Improvement over Base
Base Model (No Binary Month Regressors & No Pre/Post COVID Seasonality)	0.915	-
With Binary Month Regressors Only	0.914	-0.001
With Pre/Post COVID Seasonality Only	0.902	-0.013
With Both Features	0.935	+0.020

The synergistic effect of both features together yields better results than either feature individually.

For forecasting:

- We should use `MS` since Prophet will only be able to see the first day of a month. MS stands for Month Start

References:

- https://facebook.github.io/prophet/docs/non-daily_data.html#monthly-data
- <https://facebook.github.io/prophet/docs/seasonality, holiday effects, and regressors.html#fourier-order-for-seasonalities>
- https://facebook.github.io/prophet/docs/handling_shocks.html#changes-in-seasonality-between-pre--and-post-covid
- <https://facebook.github.io/prophet/docs/seasonality, holiday effects, and regressors.html#built-in-country->

holidays

- https://facebook.github.io/prophet/docs/non-daily_data.html#holidays-with-aggregated-data

Define functions

In []:

```
def train_prophet_model(df_prophet, periods, country_name=None):
    model = Prophet(
        yearly_seasonality=False,
        seasonality_mode='multiplicative',
        holidays=pd.concat([lockdowns, holiday_adjusted]),
    )

    months = ['jan', 'feb', 'mar', 'apr', 'may', 'jun', 'jul', 'aug', 'sep', 'oct', 'nov', 'dec']

    for i, month in enumerate(months, 1):
        df_prophet[f'is_{month}'] = (df_prophet['ds'].dt.month == i).astype(int)

    for month in months:
        model.add_regressor(f'is_{month}')

    covid_outbreak_date = '2020-02-01'
    covid_end_recovery_date = '2023-07-01'

    df_prophet['pre_covid'] = pd.to_datetime(df_prophet['ds']) < pd.to_datetime(covid_outbreak_date)
    df_prophet['has_covid'] = (
        (pd.to_datetime(df_prophet['ds']) > pd.to_datetime(covid_outbreak_date)) &
        (pd.to_datetime(df_prophet['ds']) < pd.to_datetime(covid_end_recovery_date))
    )

    monthly_period = 365.5
    fourier_order = 10
    model.add_seasonality(name='monthly_pre_covid', period=monthly_period, fourier_order=fourier_order, condition_name='pre_covid')
    model.add_seasonality(name='monthly_has_covid', period=monthly_period, fourier_order=fourier_order, condition_name='has_covid')

    model.fit(df_prophet)

    future = model.make_future_dataframe(periods=periods, freq='MS')

    future['pre_covid'] = pd.to_datetime(future['ds']) < pd.to_datetime(covid_outbreak_date)
    future['has_covid'] = (
        (pd.to_datetime(future['ds']) > pd.to_datetime(covid_outbreak_date)) &
        (pd.to_datetime(future['ds']) < pd.to_datetime(covid_end_recovery_date))
    )

    for i, month in enumerate(months, 1):
        future[f'is_{month}'] = (future['ds'].dt.month == i).astype(int)

    forecast = model.predict(future)

    return model, forecast
```

In []:

```
def prepare_prophet_data(df_long, country=None):
    df_prophet = df_long[df_long['Country of Residence'] == country].copy()
    df_prophet = df_prophet.reset_index().rename(columns={'Date': 'ds', 'Arrivals': 'y'})

    return df_prophet
```

Start training

In []:

```
all_countries = df_fixed['Country of Residence'].unique().tolist()

years_to_predict = 6
months_to_predict = 12 * years_to_predict

country_models = {}
country_forecasts = {}

for country in all_countries:
    print(f"\nModeling {country} tourist arrivals...")

    df_prophet = prepare_prophet_data(df_fixed, country)
    model, forecast = train_prophet_model(df_prophet, months_to_predict)

    country_models[country] = model
    country_forecasts[country] = forecast
```

INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.

INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.

Modeling ARGENTINA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/n7feio45.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/51vwzel0.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=37950', 'data', 'file=/tmp/tmpunk9xwl5/n7feio45.json', 'init=/tmp/tmpunk9xwl5/51vwzel0.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_kr5e86o4/prophet_model-20250519093612.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:12 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:13 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling AUSTRALIA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/knp9y8yx.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/ed6m6e9w.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=67302', 'data', 'file=/tmp/tmpunk9xwl5/knp9y8yx.json', 'init=/tmp/tmpunk9xwl5/ed6m6e9w.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_gdyj9ng2/prophet_model-20250519093614.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:14 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:14 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling AUSTRIA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/halakbj3.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/s8itxg35.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=71115', 'data', 'file=/tmp/tmpunk9xwl5/halakbj3.json', 'init=/tmp/tmpunk9xwl5/s8itxg35.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_...
```

```
n', 'init=/tmp/tmpunk9xwl5/so1ex93.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model
u93q32ml/prophet_model-20250519093615.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=1
0000']
09:36:15 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:16 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to ov
erride this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to over
ride this.
```

Modeling BAHRAIN tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/g4g7mt2e.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/qp7i650e.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_mode
l/prophet_model.bin', 'random', 'seed=12032', 'data', 'file=/tmp/tmpunk9xwl5/g4g7mt2e.jso
n', 'init=/tmp/tmpunk9xwl5/qp7i650e.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model
lp695l66/prophet_model-20250519093617.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=1
0000']
09:36:17 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:17 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to ov
erride this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to over
ride this.
```

Modeling BANGLADESH tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/pzd59x43.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/01xb44q6.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_mode
l/prophet_model.bin', 'random', 'seed=98175', 'data', 'file=/tmp/tmpunk9xwl5/pzd59x43.jso
n', 'init=/tmp/tmpunk9xwl5/01xb44q6.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model
icur7teo/prophet_model-20250519093618.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=1
0000']
09:36:18 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:18 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to ov
erride this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to over
ride this.
```

Modeling BELGIUM tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/0711c7r7.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/ux0fv37a.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_mode
l/prophet_model.bin', 'random', 'seed=52426', 'data', 'file=/tmp/tmpunk9xwl5/0711c7r7.jso
n', 'init=/tmp/tmpunk9xwl5/ux0fv37a.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model
8fp7rid/prophet_model-20250519093620.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=1
0000']
09:36:20 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:20 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to ov
erride this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to over
ride this.
```

Modeling BRAZIL tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/zhrnmowy.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/opw28nk3.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=54011', 'data', 'file=/tmp/tmpunk9xwl5/zhrnmowy.json', 'init=/tmp/tmpunk9xwl5/opw28nk3.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_fjp62p3_/prophet_model-20250519093621.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:21 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:22 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling BRUNEI tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/b9v4605w.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/ozs4el70.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=97603', 'data', 'file=/tmp/tmpunk9xwl5/b9v4605w.json', 'init=/tmp/tmpunk9xwl5/ozs4el70.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_7_ucfxk6/prophet_model-20250519093623.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:23 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:24 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling CAMBODIA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/38nklshb.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/u_9vyqo8.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=7520', 'data', 'file=/tmp/tmpunk9xwl5/38nklshb.json', 'init=/tmp/tmpunk9xwl5/u_9vyqo8.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelota15qn9/prophet_model-20250519093626.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:26 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:26 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling CANADA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/jdle02h4.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/btx6274z.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=46608', 'data', 'file=/tmp/tmpunk9xwl5/jdle02h4.json', 'init=/tmp/tmpunk9xwl5/btx6274z.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modeliwlnu3tf/prophet_model-20250519093627.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:27 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:28 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
```

```
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.  
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling CHINA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/x7l90uav.json  
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/zbr10ozv.json  
DEBUG:cmdstanpy:idx 0  
DEBUG:cmdstanpy:running CmdStan, num_threads: None  
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=32116', 'data', 'file=/tmp/tmpunk9xwl5/x7l90uav.json', 'init=/tmp/tmpunk9xwl5/zbr10ozv.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model6wiokg2u/prophet_model-20250519093629.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']  
09:36:29 - cmdstanpy - INFO - Chain [1] start processing  
INFO:cmdstanpy:Chain [1] start processing  
09:36:30 - cmdstanpy - INFO - Chain [1] done processing  
INFO:cmdstanpy:Chain [1] done processing  
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.  
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling COLOMBIA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/zrm4t0st.json  
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/j9sjx_bv.json  
DEBUG:cmdstanpy:idx 0  
DEBUG:cmdstanpy:running CmdStan, num_threads: None  
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=56710', 'data', 'file=/tmp/tmpunk9xwl5/zrm4t0st.json', 'init=/tmp/tmpunk9xwl5/j9sjx_bv.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model7xv5pfei/prophet_model-20250519093631.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']  
09:36:31 - cmdstanpy - INFO - Chain [1] start processing  
INFO:cmdstanpy:Chain [1] start processing  
09:36:32 - cmdstanpy - INFO - Chain [1] done processing  
INFO:cmdstanpy:Chain [1] done processing  
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.  
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling DENMARK tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/m69rmqv5.json  
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/9y6kobws.json  
DEBUG:cmdstanpy:idx 0  
DEBUG:cmdstanpy:running CmdStan, num_threads: None  
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=18328', 'data', 'file=/tmp/tmpunk9xwl5/m69rmqv5.json', 'init=/tmp/tmpunk9xwl5/9y6kobws.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelcqiujhi4/prophet_model-20250519093633.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']  
09:36:33 - cmdstanpy - INFO - Chain [1] start processing  
INFO:cmdstanpy:Chain [1] start processing  
09:36:33 - cmdstanpy - INFO - Chain [1] done processing  
INFO:cmdstanpy:Chain [1] done processing  
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.  
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.  
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/m_8itm_q_.json
```

Modeling EGYPT tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/gm6yddht.json  
DEBUG:cmdstanpy:idx 0  
DEBUG:cmdstanpy:running CmdStan, num_threads: None  
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=39811', 'data', 'file=/tmp/tmpunk9xwl5/m_8itm_q_.json', 'init=/tmp/tmpunk9xwl5/gm6yddht.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet model
```



```
q90q5atc/prophet_model-20250519093634.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:34 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:34 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling FINLAND tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/5wb_qb3t.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/nwlo_182.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=70353', 'data', 'file=/tmp/tmpunk9xwl5/5wb_qb3t.json', 'init=/tmp/tmpunk9xwl5/nwlo_182.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model8ifswco8/prophet_model-20250519093635.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:35 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:36 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling FRANCE tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/crv7pzdb.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/i6kq4a7b.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=18179', 'data', 'file=/tmp/tmpunk9xwl5/crv7pzdb.json', 'init=/tmp/tmpunk9xwl5/i6kq4a7b.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model14znyylx/prophet_model-20250519093637.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:37 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:38 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling GERMANY tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/rqves5ir.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/nw6499h3.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=40628', 'data', 'file=/tmp/tmpunk9xwl5/rqves5ir.json', 'init=/tmp/tmpunk9xwl5/nw6499h3.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelihbuglae/prophet_model-20250519093639.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:39 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:40 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling GREECE tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/505ybugi.json
```

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/505ybwgi.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/f77ekufb.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=33019', 'data', 'file=/tmp/tmpunk9xwl5/505ybwgi.json', 'init=/tmp/tmpunk9xwl5/f77ekufb.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelddy8mcwy/prophet_model-20250519093641.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:41 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:41 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling GUAM tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/dy5762hl.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/xpyg6h0w.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=48511', 'data', 'file=/tmp/tmpunk9xwl5/dy5762hl.json', 'init=/tmp/tmpunk9xwl5/xpyg6h0w.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelgm7rv3zb/prophet_model-20250519093642.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:42 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:43 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling INDIA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/z410dogh.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/1lqi9_23.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=81426', 'data', 'file=/tmp/tmpunk9xwl5/z410dogh.json', 'init=/tmp/tmpunk9xwl5/1lqi9_23.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model7wkacvvg/prophet_model-20250519093644.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:44 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:44 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling INDONESIA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/r47s6jzm.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/donuua8j.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=92894', 'data', 'file=/tmp/tmpunk9xwl5/r47s6jzm.json', 'init=/tmp/tmpunk9xwl5/donuua8j.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model627aisvx/prophet_model-20250519093645.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:45 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:46 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
```



```
b6jrip//prophet_model-20250519093651.csv', 'method=optimize', 'algorithm=lbrgs', 'iter=10000']
09:36:51 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:52 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling JAPAN tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/laffj6do.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/s8ioald7.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=38397', 'data', 'file=/tmp/tmpunk9xwl5/laffj6do.json', 'init=/tmp/tmpunk9xwl5/s8ioald7.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_vft9idys/prophet_model-20250519093653.csv', 'method=optimize', 'algorithm=lbrgs', 'iter=10000']
09:36:53 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:54 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling JORDAN tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/4ch2qdop.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/wlg6d5xb.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=17538', 'data', 'file=/tmp/tmpunk9xwl5/4ch2qdop.json', 'init=/tmp/tmpunk9xwl5/wlg6d5xb.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_jn5lge8b/prophet_model-20250519093655.csv', 'method=optimize', 'algorithm=lbrgs', 'iter=10000']
09:36:55 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:56 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling KOREA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/e0plyqhi.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/snk7395j.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=85597', 'data', 'file=/tmp/tmpunk9xwl5/e0plyqhi.json', 'init=/tmp/tmpunk9xwl5/snk7395j.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_mblugw3f/prophet_model-20250519093657.csv', 'method=optimize', 'algorithm=lbrgs', 'iter=10000']
09:36:57 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:57 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling KUWAIT tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/5inl89jb.json
```

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/c0ejewtu.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=95706', 'data', 'file=/tmp/tmpunk9xw15/5inl89jb.json', 'init=/tmp/tmpunk9xw15/c0ejewtu.json', 'output', 'file=/tmp/tmpunk9xw15/prophet_model_f7msts7d/prophet_model-20250519093658.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:58 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:36:58 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling LAOS tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/yp15rjff7.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/zny82cds.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=85576', 'data', 'file=/tmp/tmpunk9xw15/yp15rjff7.json', 'init=/tmp/tmpunk9xw15/zny82cds.json', 'output', 'file=/tmp/tmpunk9xw15/prophet_model_odragt1p/prophet_model-20250519093659.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:36:59 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:00 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/42l7ilcc.json
```

Modeling LUXEMBOURG tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/xgy43y4_.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=85139', 'data', 'file=/tmp/tmpunk9xw15/42l7ilcc.json', 'init=/tmp/tmpunk9xw15/xgy43y4_.json', 'output', 'file=/tmp/tmpunk9xw15/prophet_model_6e6mr2l/prophet_model-20250519093701.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:01 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:01 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling MALAYSIA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/n8pjk7cm.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/xw7v5083.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=85022', 'data', 'file=/tmp/tmpunk9xw15/n8pjk7cm.json', 'init=/tmp/tmpunk9xw15/xw7v5083.json', 'output', 'file=/tmp/tmpunk9xw15/prophet_model_sqxl09in/prophet_model-20250519093702.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:02 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:03 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
```

```
erride this.  
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to over  
ride this.  
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/k47jxbln.json
```

Modeling MEXICO tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/15tokxs7.json  
DEBUG:cmdstanpy:idx 0  
DEBUG:cmdstanpy:running CmdStan, num_threads: None  
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_mode  
l/prophet_model.bin', 'random', 'seed=19024', 'data', 'file=/tmp/tmpunk9xwl5/k47jxbln.jso  
n', 'init=/tmp/tmpunk9xwl5/15tokxs7.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model  
vdgxf36e/prophet_model-20250519093704.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=1  
0000']  
09:37:04 - cmdstanpy - INFO - Chain [1] start processing  
INFO:cmdstanpy:Chain [1] start processing  
09:37:04 - cmdstanpy - INFO - Chain [1] done processing  
INFO:cmdstanpy:Chain [1] done processing  
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to ov  
erride this.  
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to over  
ride this.
```

Modeling MYANMAR tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/es6dgnsa.json  
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/xphpo4fq.json  
DEBUG:cmdstanpy:idx 0  
DEBUG:cmdstanpy:running CmdStan, num_threads: None  
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_mode  
l/prophet_model.bin', 'random', 'seed=5306', 'data', 'file=/tmp/tmpunk9xwl5/es6dgnsa.json  
, 'init=/tmp/tmpunk9xwl5/xphpo4fq.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modela  
9vo6dgd/prophet_model-20250519093705.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10  
000']  
09:37:05 - cmdstanpy - INFO - Chain [1] start processing  
INFO:cmdstanpy:Chain [1] start processing  
09:37:06 - cmdstanpy - INFO - Chain [1] done processing  
INFO:cmdstanpy:Chain [1] done processing  
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to ov  
erride this.  
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to over  
ride this.
```

Modeling NEPAL tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/rspah42m.json  
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/vwgvuuio.json  
DEBUG:cmdstanpy:idx 0  
DEBUG:cmdstanpy:running CmdStan, num_threads: None  
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_mode  
l/prophet_model.bin', 'random', 'seed=10670', 'data', 'file=/tmp/tmpunk9xwl5/rspah42m.jso  
n', 'init=/tmp/tmpunk9xwl5/vwgvuuio.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model  
sle5728q/prophet_model-20250519093708.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=1  
0000']  
09:37:08 - cmdstanpy - INFO - Chain [1] start processing  
INFO:cmdstanpy:Chain [1] start processing  
09:37:08 - cmdstanpy - INFO - Chain [1] done processing  
INFO:cmdstanpy:Chain [1] done processing  
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to ov  
erride this.  
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to over  
ride this.  
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/efp3hksu.json
```

Modeling NETHERLANDS tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/iulhgvnv.json  
DEBUG:cmdstanpy:idx 0  
DEBUG:cmdstanpy:running CmdStan, num_threads: None  
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_mode  
l/prophet_model.bin', 'random', 'seed=73281', 'data', 'file=/tmp/tmpunk9xwl5/efp3hksu.jso  
n', 'init=/tmp/tmpunk9xwl5/iulhgvnv.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model  
70oklcre/prophet_model-20250519093709.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=1
```

```
0000']
09:37:09 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:10 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling NEW ZEALAND tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/ekwpkaro.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/0wt4ns_e.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=25625', 'data', 'file=/tmp/tmpunk9xw15/ekwpkaro.json', 'init=/tmp/tmpunk9xw15/0wt4ns_e.json', 'output', 'file=/tmp/tmpunk9xw15/prophet_model_xwq0nwxc/prophet_model-20250519093711.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:11 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:11 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling NIGERIA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/mc0obbd.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/jw09_521.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=60752', 'data', 'file=/tmp/tmpunk9xw15/mc0obbd.json', 'init=/tmp/tmpunk9xw15/jw09_521.json', 'output', 'file=/tmp/tmpunk9xw15/prophet_model_4cclbx27/prophet_model-20250519093712.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:12 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:13 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling NORWAY tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/ex8lmsjg.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/bw7kjtnk.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=8882', 'data', 'file=/tmp/tmpunk9xw15/ex8lmsjg.json', 'init=/tmp/tmpunk9xw15/bw7kjtnk.json', 'output', 'file=/tmp/tmpunk9xw15/prophet_model9rn4bynm/prophet_model-20250519093714.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:14 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:14 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling Others tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xw15/_j0ezxf0.json
```



```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/00ky0tax.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=53045', 'data', 'file=/tmp/tmpunk9xwl5/_j0ezxf0.json', 'init=/tmp/tmpunk9xwl5/00ky0tax.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_dkhley7k/prophet_model-20250519093715.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:15 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:16 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling PAKISTAN tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/dxhh4iyp.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/2xgetiul.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=63003', 'data', 'file=/tmp/tmpunk9xwl5/dxhh4iyp.json', 'init=/tmp/tmpunk9xwl5/2xgetiul.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_rwb9nvn3/prophet_model-20250519093717.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:17 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:17 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/8o13lnez.json
```

Modeling PAPUA NEW GUINEA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/xtdf01tb.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=69633', 'data', 'file=/tmp/tmpunk9xwl5/8o13lnez.json', 'init=/tmp/tmpunk9xwl5/xtdf01tb.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_m995rmv5/prophet_model-20250519093719.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:19 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:19 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling PERU tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/7txnoo9f.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/wwd950s6.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=38335', 'data', 'file=/tmp/tmpunk9xwl5/7txnoo9f.json', 'init=/tmp/tmpunk9xwl5/wwd950s6.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_up6li40f/prophet_model-20250519093720.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:21 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:21 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
```

erride this.

INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.

Modeling POLAND tourist arrivals...

DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/0vlmfee6.json

DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/up6r2m0y.json

DEBUG:cmdstanpy:idx 0

DEBUG:cmdstanpy:running CmdStan, num_threads: None

DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=51431', 'data', 'file=/tmp/tmpunk9xwl5/0vlmfee6.json', 'init=/tmp/tmpunk9xwl5/up6r2m0y.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model4icjvk8k/prophet_model-20250519093722.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']

09:37:22 - cmdstanpy - INFO - Chain [1] start processing

INFO:cmdstanpy:Chain [1] start processing

09:37:23 - cmdstanpy - INFO - Chain [1] done processing

INFO:cmdstanpy:Chain [1] done processing

INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.

INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.

Modeling PORTUGAL tourist arrivals...

DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/_488xjro.json

DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/kc9hqt4n.json

DEBUG:cmdstanpy:idx 0

DEBUG:cmdstanpy:running CmdStan, num_threads: None

DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=96160', 'data', 'file=/tmp/tmpunk9xwl5/_488xjro.json', 'init=/tmp/tmpunk9xwl5/kc9hqt4n.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelcagbp0e/prophet_model-20250519093724.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']

09:37:24 - cmdstanpy - INFO - Chain [1] start processing

INFO:cmdstanpy:Chain [1] start processing

09:37:25 - cmdstanpy - INFO - Chain [1] done processing

INFO:cmdstanpy:Chain [1] done processing

INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.

INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.

Modeling RUSSIA tourist arrivals...

DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/aduhyq4s.json

DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/3c2ifzmg.json

DEBUG:cmdstanpy:idx 0

DEBUG:cmdstanpy:running CmdStan, num_threads: None

DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=49877', 'data', 'file=/tmp/tmpunk9xwl5/aduhyq4s.json', 'init=/tmp/tmpunk9xwl5/3c2ifzmg.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelp3arjppjg/prophet_model-20250519093726.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']

09:37:26 - cmdstanpy - INFO - Chain [1] start processing

INFO:cmdstanpy:Chain [1] start processing

09:37:26 - cmdstanpy - INFO - Chain [1] done processing

INFO:cmdstanpy:Chain [1] done processing

INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.

INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.

Modeling SAUDI ARABIA tourist arrivals...

DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/y45m7839.json

DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/fb23ojig.json

DEBUG:cmdstanpy:idx 0

DEBUG:cmdstanpy:running CmdStan, num_threads: None

DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=18366', 'data', 'file=/tmp/tmpunk9xwl5/y45m7839.json', 'init=/tmp/tmpunk9xwl5/fb23ojig.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelq_cmtlkq/prophet_model-20250519093727.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']

```
0000']
09:37:27 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:28 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling SINGAPORE tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/tw9lufqt.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/muxkprjo.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=40017', 'data', 'file=/tmp/tmpunk9xwl5/tw9lufqt.json', 'init=/tmp/tmpunk9xwl5/muxkprjo.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelmy0xmc7e/prophet_model-20250519093729.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:29 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:29 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/wjavw8bz.json
```

Modeling SOUTH AFRICA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/rjeb_l2g.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=74055', 'data', 'file=/tmp/tmpunk9xwl5/wjavw8bz.json', 'init=/tmp/tmpunk9xwl5/rjeb_l2g.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model5gmd293j/prophet_model-20250519093730.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:30 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:31 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling SPAIN tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/vjvf4zzn.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/kpgv2ucb.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=42547', 'data', 'file=/tmp/tmpunk9xwl5/vjvf4zzn.json', 'init=/tmp/tmpunk9xwl5/kpgv2ucb.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelzr96gnjz/prophet_model-20250519093732.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:32 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:33 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling SRI LANKA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/o6ej0p7c.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/p6cpwaak.json
```



```
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=27701', 'data', 'file=/tmp/tmpunk9xwl5/o6ej0p7c.json', 'init=/tmp/tmpunk9xwl5/p6cpwaak.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_i7w4imtn/prophet_model-20250519093734.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:34 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:34 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling SWEDEN tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/pvf_krgg.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/be43_j9q.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=13951', 'data', 'file=/tmp/tmpunk9xwl5/pvf_krgg.json', 'init=/tmp/tmpunk9xwl5/be43_j9q.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_rupy3jjd/prophet_model-20250519093736.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:36 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:36 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/qgqmn1rr.json
```

Modeling SWITZERLAND tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/bnjti4hm.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=16665', 'data', 'file=/tmp/tmpunk9xwl5/qgqmn1rr.json', 'init=/tmp/tmpunk9xwl5/bnjti4hm.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_ahp97azn/prophet_model-20250519093737.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:37 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:38 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling TAIWAN tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/tnh7r4y7.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/a4rs2w46.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=19216', 'data', 'file=/tmp/tmpunk9xwl5/tnh7r4y7.json', 'init=/tmp/tmpunk9xwl5/a4rs2w46.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model_ccik2ftn/prophet_model-20250519093739.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:39 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:39 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
```

```
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/vb5uiazd.json
```

Modeling THAILAND tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/d_vv5kxq.json
```

```
DEBUG:cmdstanpy:idx 0
```

```
DEBUG:cmdstanpy:running CmdStan, num_threads: None
```

```
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=81304', 'data', 'file=/tmp/tmpunk9xwl5/vb5uiazd.json', 'init=/tmp/tmpunk9xwl5/d_vv5kxq.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model3rx7u2z5/prophet_model-20250519093740.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
```

```
09:37:40 - cmdstanpy - INFO - Chain [1] start processing
```

```
INFO:cmdstanpy:Chain [1] start processing
```

```
09:37:41 - cmdstanpy - INFO - Chain [1] done processing
```

```
INFO:cmdstanpy:Chain [1] done processing
```

```
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
```

```
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/43v_0742.json
```

Modeling UNITED ARAB EMIRATES tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/g97fbyct.json
```

```
DEBUG:cmdstanpy:idx 0
```

```
DEBUG:cmdstanpy:running CmdStan, num_threads: None
```

```
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=55181', 'data', 'file=/tmp/tmpunk9xwl5/43v_0742.json', 'init=/tmp/tmpunk9xwl5/g97fbyct.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_model16ig3zi8/prophet_model-20250519093742.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
```

```
09:37:42 - cmdstanpy - INFO - Chain [1] start processing
```

```
INFO:cmdstanpy:Chain [1] start processing
```

```
09:37:42 - cmdstanpy - INFO - Chain [1] done processing
```

```
INFO:cmdstanpy:Chain [1] done processing
```

```
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
```

```
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling UNITED KINGDOM tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/piqrphl4.json
```

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/6hc8wovu.json
```

```
DEBUG:cmdstanpy:idx 0
```

```
DEBUG:cmdstanpy:running CmdStan, num_threads: None
```

```
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=65394', 'data', 'file=/tmp/tmpunk9xwl5/piqrphl4.json', 'init=/tmp/tmpunk9xwl5/6hc8wovu.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelrnmj0anu/prophet_model-20250519093743.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
```

```
09:37:43 - cmdstanpy - INFO - Chain [1] start processing
```

```
INFO:cmdstanpy:Chain [1] start processing
```

```
09:37:43 - cmdstanpy - INFO - Chain [1] done processing
```

```
INFO:cmdstanpy:Chain [1] done processing
```

```
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
```

```
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/z552116r.json
```

Modeling USA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/joeo70pi.json
```

```
DEBUG:cmdstanpy:idx 0
```

```
DEBUG:cmdstanpy:running CmdStan, num_threads: None
```

```
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=77192', 'data', 'file=/tmp/tmpunk9xwl5/z552116r.json', 'init=/tmp/tmpunk9xwl5/joeo70pi.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelu5pwfbu2/prophet_model-20250519093744.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
```

```
0000 ]
09:37:44 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:45 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling VENEZUELA tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/655rbtpt.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/tletd6pi.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=62398', 'data', 'file=/tmp/tmpunk9xwl5/655rbtpt.json', 'init=/tmp/tmpunk9xwl5/tletd6pi.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelme8r7ne0/prophet_model-20250519093746.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:46 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:47 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
INFO:prophet:Disabling weekly seasonality. Run prophet with weekly_seasonality=True to override this.
INFO:prophet:Disabling daily seasonality. Run prophet with daily_seasonality=True to override this.
```

Modeling VIETNAM tourist arrivals...

```
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/75fdrky4.json
DEBUG:cmdstanpy:input tempfile: /tmp/tmpunk9xwl5/iafxlj3y.json
DEBUG:cmdstanpy:idx 0
DEBUG:cmdstanpy:running CmdStan, num_threads: None
DEBUG:cmdstanpy:CmdStan args: ['/usr/local/lib/python3.11/dist-packages/prophet/stan_model/prophet_model.bin', 'random', 'seed=56222', 'data', 'file=/tmp/tmpunk9xwl5/75fdrky4.json', 'init=/tmp/tmpunk9xwl5/iafxlj3y.json', 'output', 'file=/tmp/tmpunk9xwl5/prophet_modelrpwa0k5o/prophet_model-20250519093748.csv', 'method=optimize', 'algorithm=lbfgs', 'iter=10000']
09:37:48 - cmdstanpy - INFO - Chain [1] start processing
INFO:cmdstanpy:Chain [1] start processing
09:37:50 - cmdstanpy - INFO - Chain [1] done processing
INFO:cmdstanpy:Chain [1] done processing
```

Compare forecasts

In []:

```
last_date = max([forecast['ds'].max() for forecast in country_forecasts.values()])

forecast_totals = {}
for country, forecast in country_forecasts.items():
    future_forecast = forecast[forecast['ds'] > (last_date - pd.Timedelta(days=months_to_predict*30))]
    forecast_totals[country] = future_forecast['yhat'].sum()

forecast_df = pd.DataFrame(
    {'Total Forecasted Arrivals': forecast_totals}
).sort_values('Total Forecasted Arrivals', ascending=False)
forecast_df
```

Out[]:

Total Forecasted Arrivals	
KOREA	6429236.5497027198
USA	4599657.8814374721
CHINA	1556804.3524883299

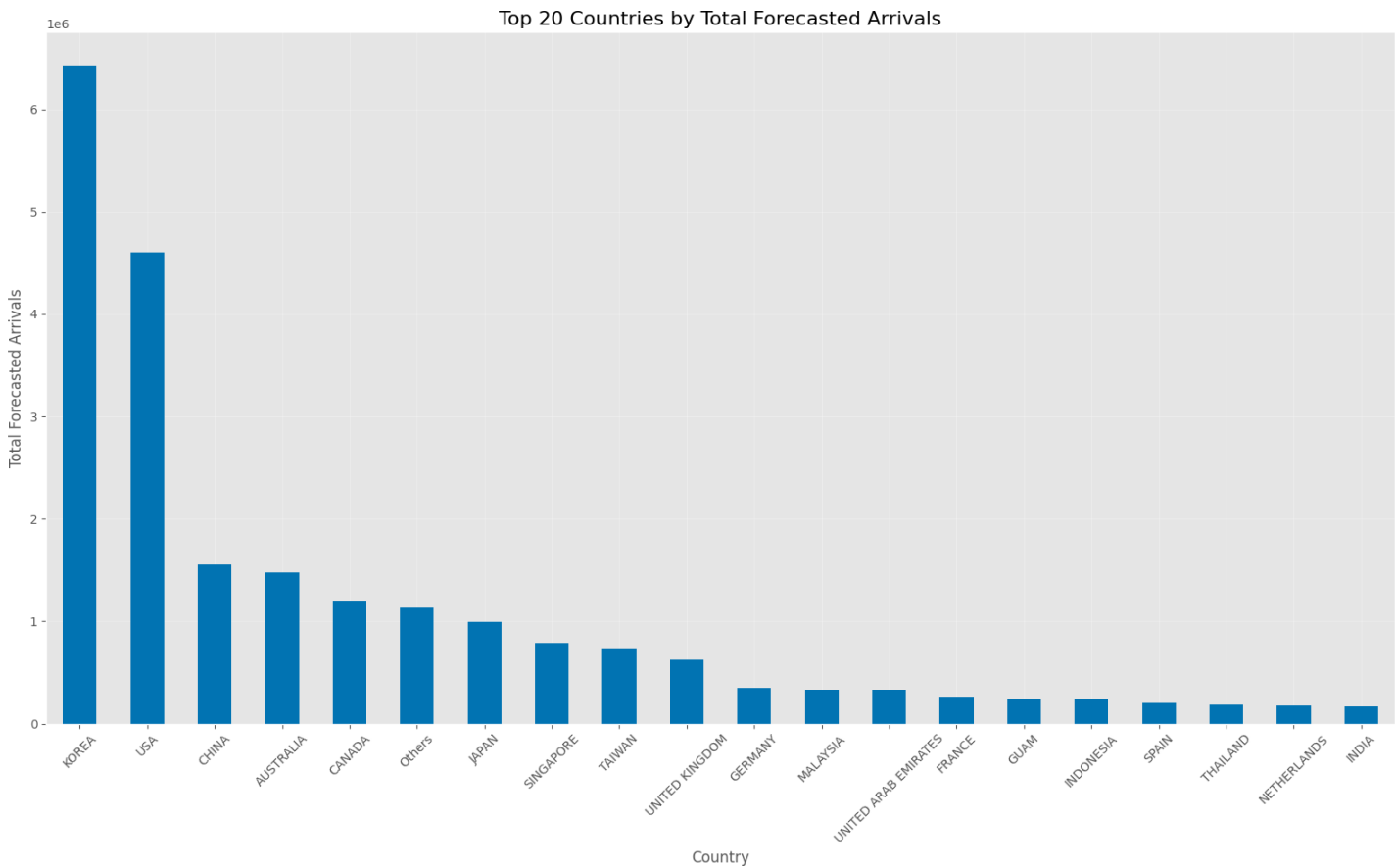
AUSTRALIA	Total	756923.563201028
CANADA		1198065.0618112839
Others		1130820.7526055875
JAPAN		991689.3458624858
SINGAPORE		789801.4408618143
TAIWAN		739440.6423494936
UNITED KINGDOM		627849.9821772992
GERMANY		349180.2828313585
MALAYSIA		328067.0111746844
UNITED ARAB EMIRATES		327891.4711485712
FRANCE		259923.8265465413
GUAM		246974.2925709430
INDONESIA		239673.5948953746
SPAIN		205825.7618496258
THAILAND		182387.2277126144
NETHERLANDS		181194.2125027147
INDIA		165449.7425099512
ITALY		164391.1813874570
SWITZERLAND		138458.6740711306
POLAND		115484.7610548342
NEW ZEALAND		107629.1223743102
NORWAY		93480.9256390962
ISRAEL		87956.3971539322
AUSTRIA		82256.4699975108
RUSSIA		71609.0426058577
BELGIUM		71557.6990603095
IRELAND		64302.3488742307
SWEDEN		59593.1884997445
DENMARK		59447.9404145526
PAPUA NEW GUINEA		44211.1774661618
BAHRAIN		41250.9902601642
KUWAIT		38988.7593868969
BANGLADESH		28074.9452602761
BRUNEI		21630.4280522546
NIGERIA		20671.5119373302
SAUDI ARABIA		19863.2662757666
GREECE		17249.1778803646
PAKISTAN		16710.6809113393
MEXICO		15371.3633410005
FINLAND		14811.0107763713
PORTUGAL		13974.8851584007
NEPAL		12910.5197485235
CAMBODIA		12584.7802227809
ARGENTINA		10294.6098232029
VIETNAM		9633.9733150339

SOUTH AFRICA	Total Forecasted Arrivals
BRAZIL	7912.1960846467
LUXEMBOURG	7067.7057725286
MYANMAR	5438.8382550391
COLOMBIA	4253.0681800427
LAOS	4044.2504106912
IRAN	3902.0532892831
EGYPT	3810.4668054313
PERU	3194.8280660571
SRI LANKA	3171.1626454736
VENEZUELA	-222.2284730448
JORDAN	-279.9530915016

```
In [ ]:
top10_countries = forecast_df.head(10).index.tolist()
```

Visualize the top 20 countries

```
In [ ]:
plt.figure(figsize=(16, 10))
forecast_df.head(20)['Total Forecasted Arrivals'].plot(kind='bar')
plt.title('Top 20 Countries by Total Forecasted Arrivals', fontsize=16)
plt.xlabel('Country', fontsize=12)
plt.ylabel('Total Forecasted Arrivals', fontsize=12)
plt.xticks(rotation=45)
plt.grid(True, alpha=0.3)
plt.tight_layout()
plt.savefig('country_forecast_totals.png')
plt.show()
```



Visualize top 10 country forecasts

In []:

```
def create_better_plot(forecast, df, title, future_periods=0):
    plt.figure(figsize=(16, 8))

    # Plot actual data
    plt.plot(df['ds'], df['y'], 'o', color='#1f77b4', alpha=0.6, markersize=4, label='Observed')

    # Plot forecast
    plt.plot(forecast['ds'], forecast['yhat'], '-', color='#ff7f0e', linewidth=2, label='Forecast')

    # Plot confidence interval
    plt.fill_between(
        forecast['ds'],
        forecast['yhat_lower'],
        forecast['yhat_upper'],
        color='#ff7f0e',
        alpha=0.2,
        label='95% Confidence Interval'
    )

    if future_periods > 0:
        forecast_start = df['ds'].iloc[-1]
        plt.axvline(x=forecast_start, color='red', linestyle='--', alpha=0.7, label='Forecast Start')

    plt.title(title, fontsize=18, pad=20)
    plt.xlabel('Date', fontsize=14)
    plt.ylabel('Tourist Arrivals', fontsize=14)
    plt.legend(fontsize=12)
    plt.grid(True, alpha=0.3)

    plt.gca().xaxis.set_major_formatter(plt.matplotlib.dates.DateFormatter('%Y'))
    plt.gca().xaxis.set_major_locator(plt.matplotlib.dates.YearLocator())

    plt.tight_layout()
    return plt
```

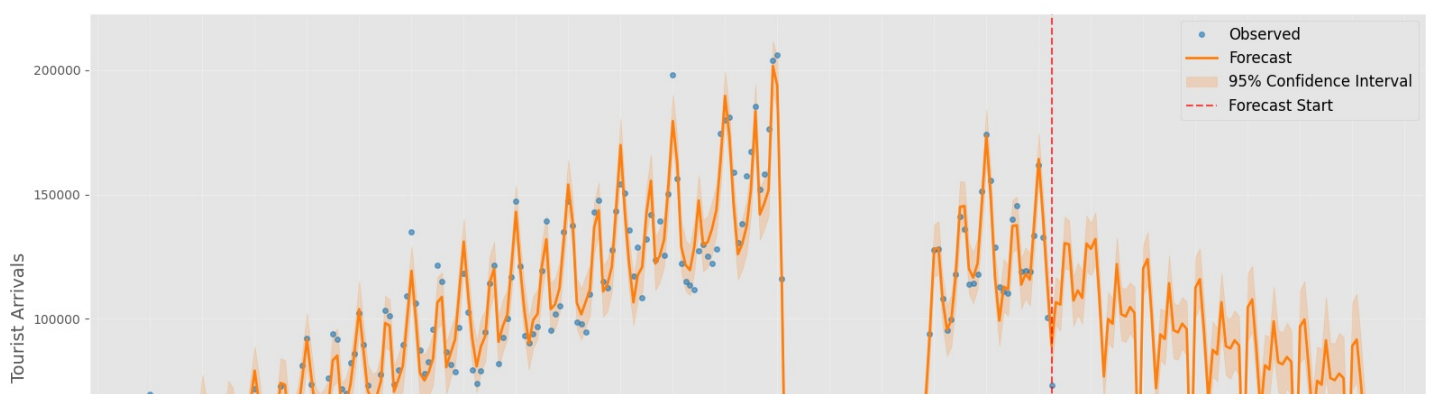
In []:

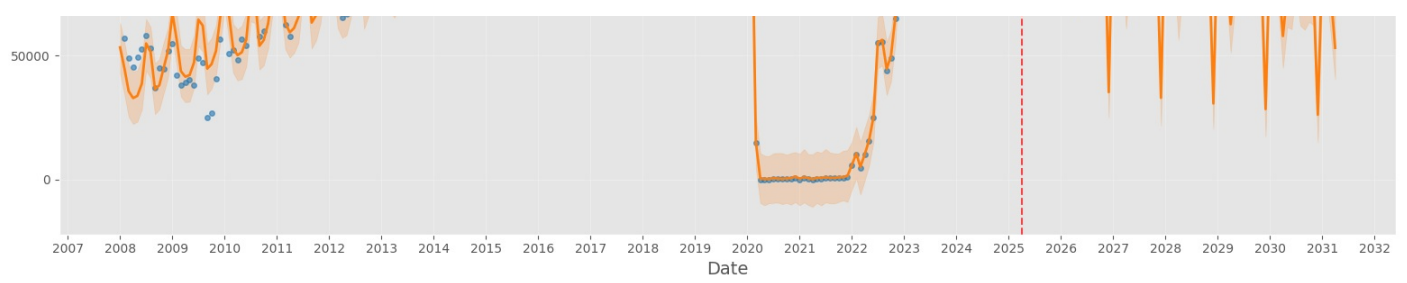
```
for country in top10_countries:
    forecast = country_forecasts[country]
    prophet_df = prepare_prophet_data(df_fixed, country)

    create_better_plot(
        forecast,
        prophet_df,
        f'Tourist Arrivals Forecast for {country}',
        future_periods=1
    ).show()

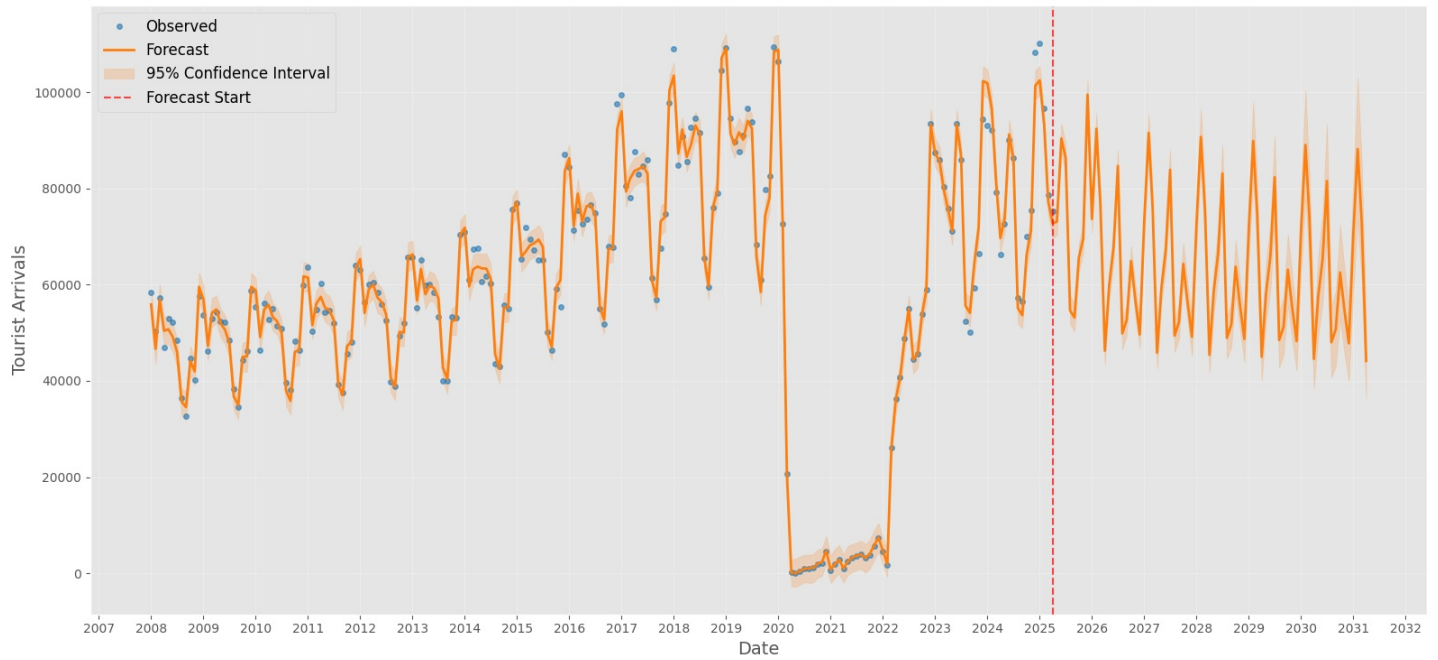
print()
```

Tourist Arrivals Forecast for KOREA





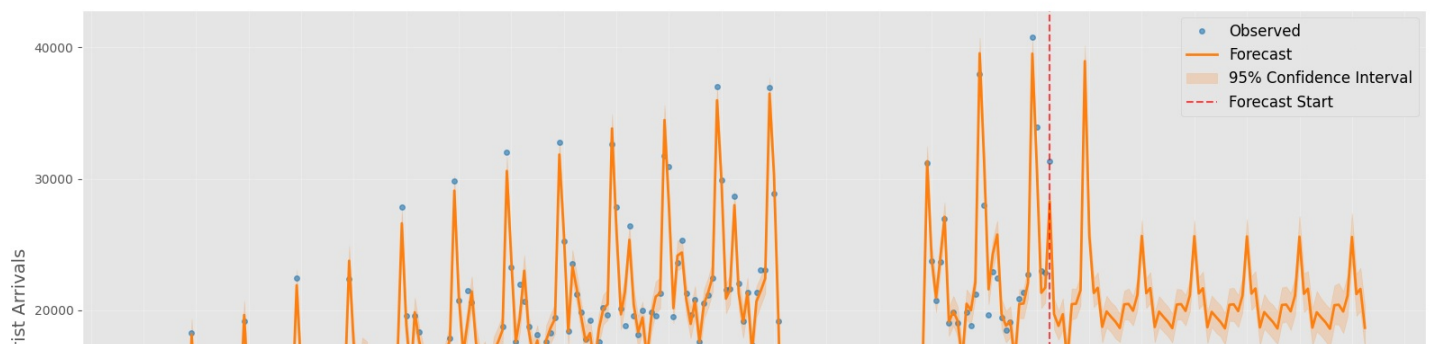
Tourist Arrivals Forecast for USA

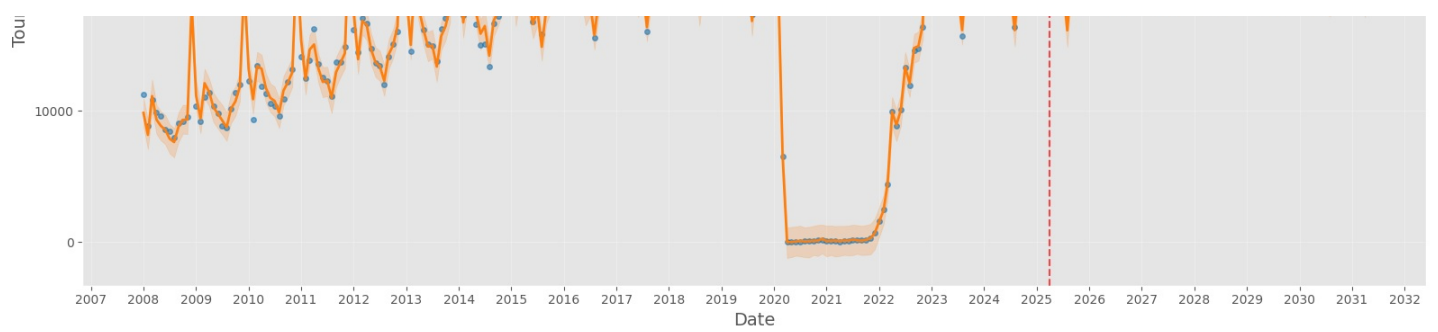


Tourist Arrivals Forecast for CHINA

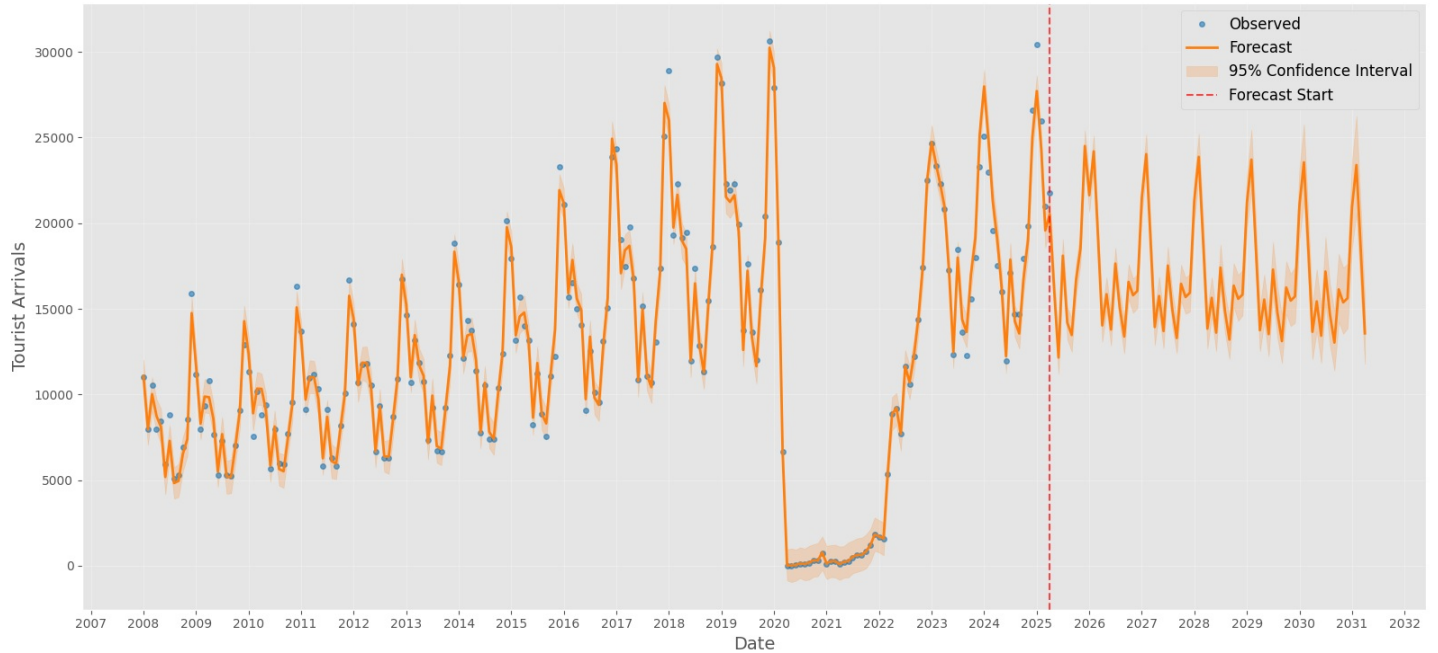


Tourist Arrivals Forecast for AUSTRALIA

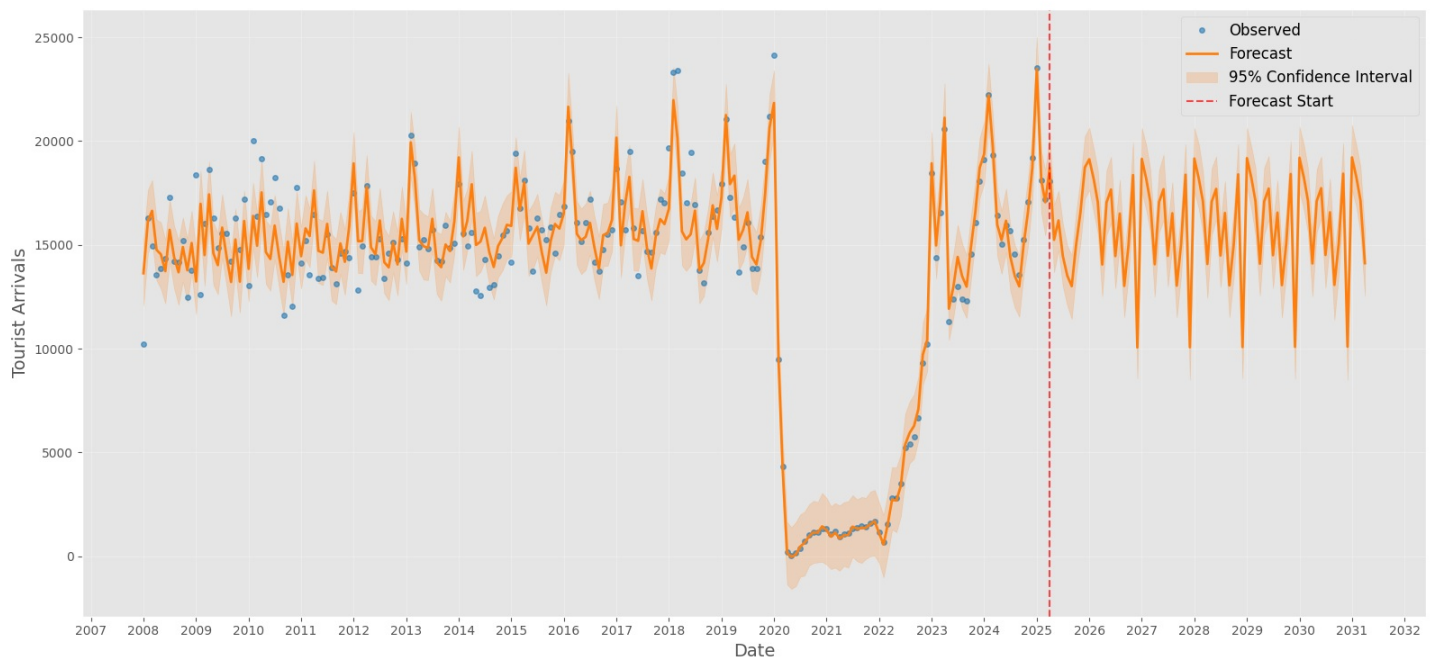




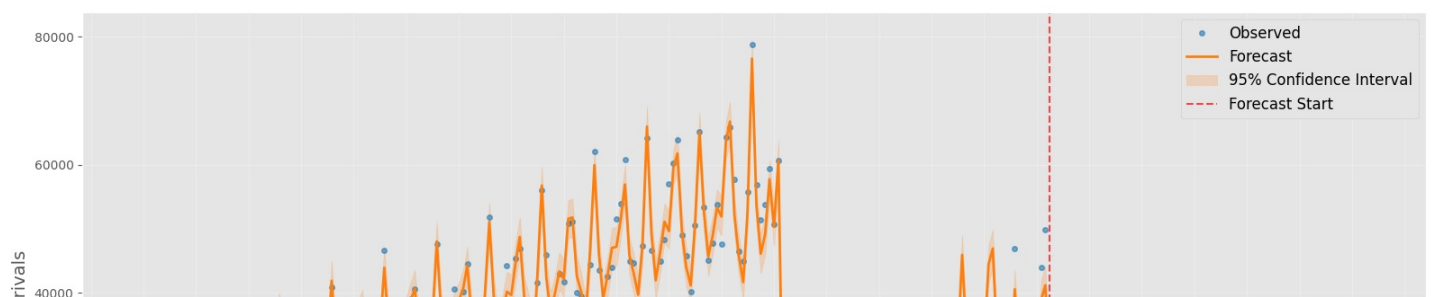
Tourist Arrivals Forecast for CANADA

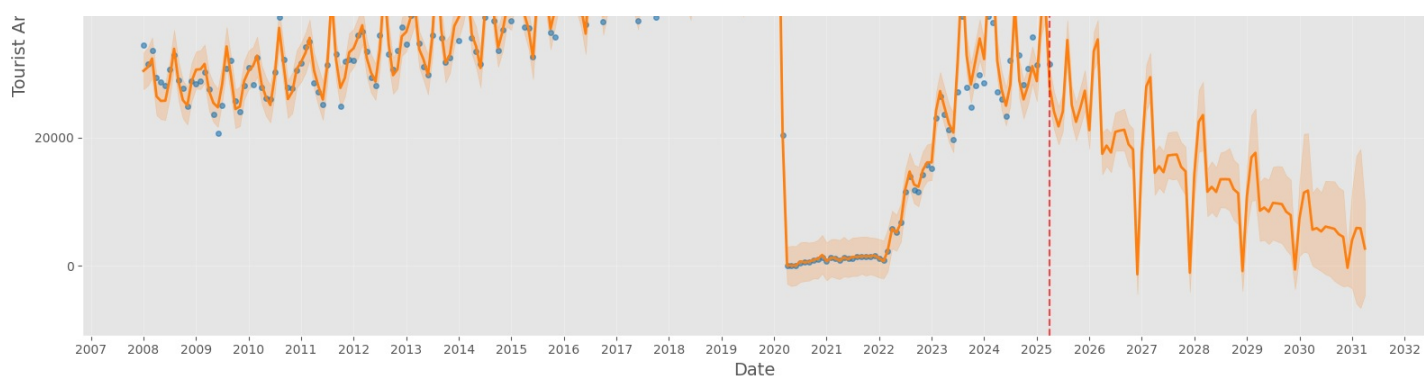


Tourist Arrivals Forecast for Others

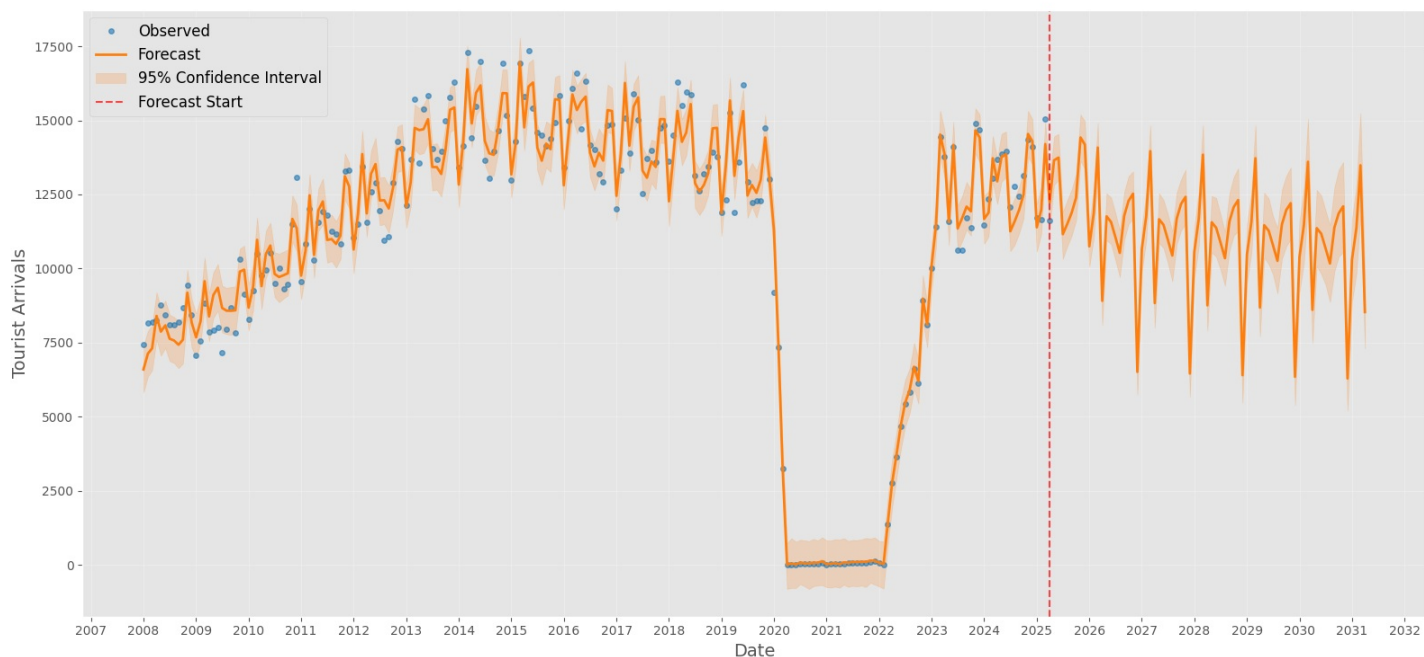


Tourist Arrivals Forecast for JAPAN





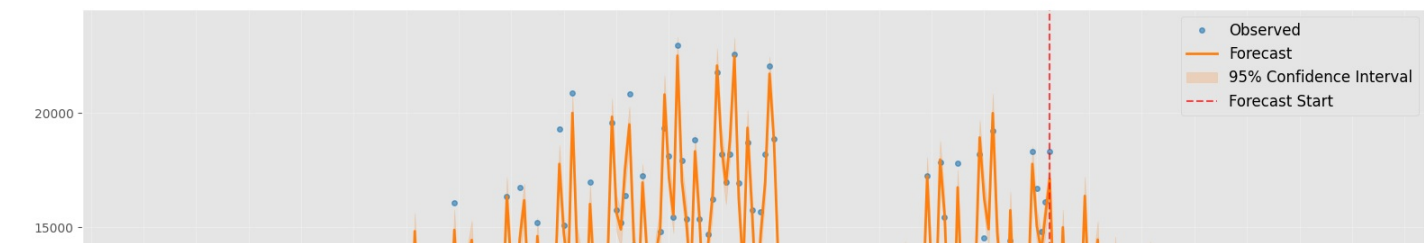
Tourist Arrivals Forecast for SINGAPORE

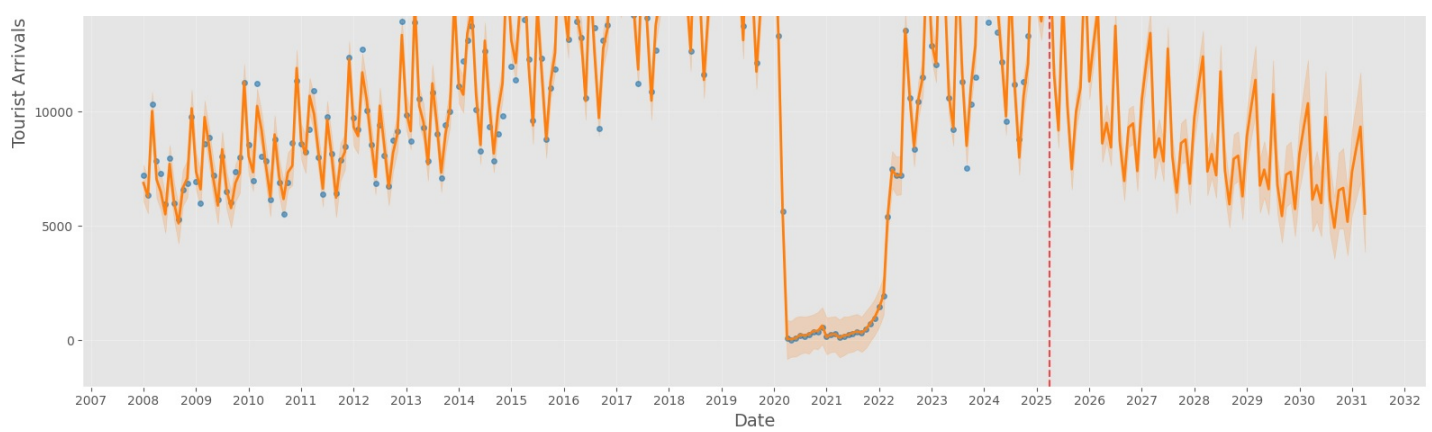


Tourist Arrivals Forecast for TAIWAN



Tourist Arrivals Forecast for UNITED KINGDOM





Evaluation

Regression report

In []:

```
def regression_report(y_true, y_pred, normalize=True):
    y_true = np.array(y_true)
    y_pred = np.array(y_pred)

    # Metrics
    mse = mean_squared_error(y_true, y_pred)
    rmse = np.sqrt(mse)
    mae = mean_absolute_error(y_true, y_pred)
    mape = mean_absolute_percentage_error(y_true, y_pred) * 100

    # Normalization factor
    norm_factor = np.ptp(y_true) if normalize else 1.0 # ptp = max - min

    report = pd.DataFrame({
        'Metric': ['MAE', 'MSE', 'RMSE', 'MAPE'],
        'Value': [mae / norm_factor,
                  mse / (norm_factor ** 2),
                  rmse / norm_factor,
                  mape]
    })

    return report
```

In []:

```
country_metrics = {}

for country in all_countries:
    model = country_models[country]
    forecast = country_forecasts[country]
    data = prepare_prophet_data(df_fixed, country)
    df_cv = regression_report(data['y'], forecast['yhat'][:-months_to_predict])

    country_metrics[country] = df_cv
```

In []:

```
model_comparison = {}

for country, metrics in country_metrics.items():
    model_comparison[country] = metrics.loc[metrics['Metric'] == 'MAPE', 'Value'].values[0]

comparison_df = pd.DataFrame(model_comparison.items(), columns=['Country', 'MAPE'])
comparison_df = comparison_df.set_index('Country')
top_20_countries = comparison_df.sort_values('MAPE', ascending=True).head(20)
top_20_countries
```

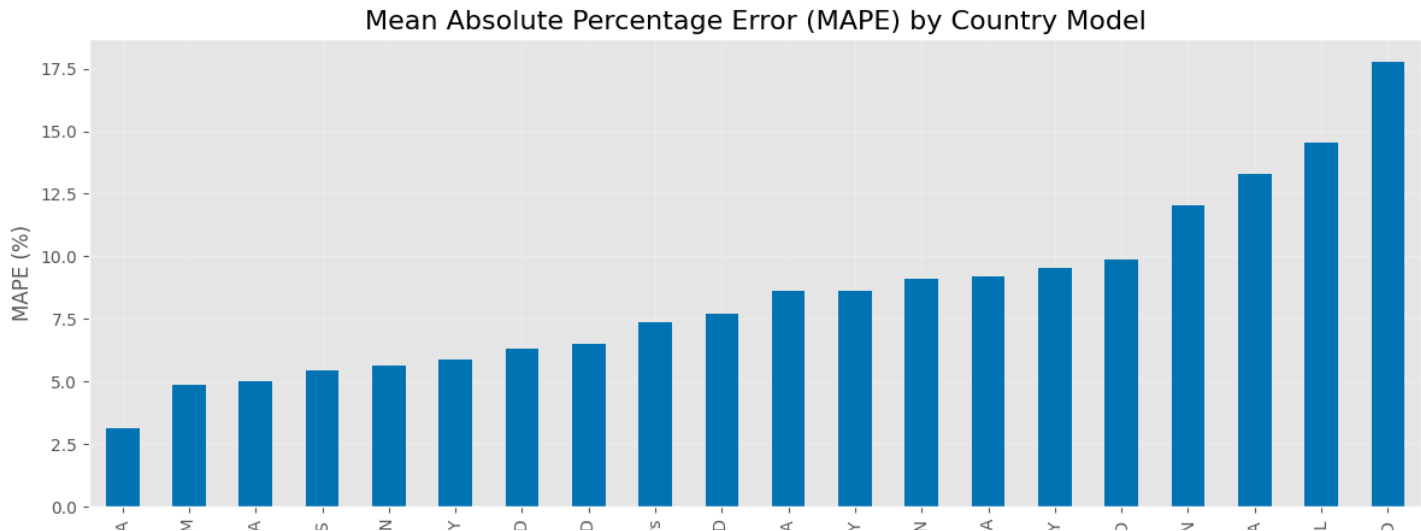
Out[]:

MAPE	
Country	
USA	3.1137469172
UNITED KINGDOM	4.8823332673
CANADA	5.0028082676
NETHERLANDS	5.4396488740
JAPAN	5.6380063392
GERMANY	5.8771139415
SWITZERLAND	6.3073856921
NEW ZEALAND	6.5216265400
Others	7.3716546573
THAILAND	7.7203101453
AUSTRALIA	8.6279426227
NORWAY	8.6376662874
SPAIN	9.0908690274
SOUTH AFRICA	9.1979822151
ITALY	9.5529584034
IRELAND	9.8525945281
BAHRAIN	12.0356144681
RUSSIA	13.3004063113
BRAZIL	14.5246163745
POLAND	17.7809927217

Bar chart

In []:

```
plt.figure(figsize=(12, 6))
(top_20_countries['MAPE']).sort_values().plot(kind='bar')
plt.title('Mean Absolute Percentage Error (MAPE) by Country Model', fontsize=16)
plt.xlabel('Country', fontsize=12)
plt.ylabel('MAPE (%)', fontsize=12)
plt.grid(True, alpha=0.3)
plt.tight_layout()
plt.savefig('model_comparison_mape.png')
plt.show()
```



US,
UNITED KINGDOM,
CANADA,
NETHERLANDS,
JAPAN,
GERMANY,
SWITZERLAND,
NEW ZEALAND,
Other,
THAILAND,
AUSTRALIA,
NORWAY,
SPAIN,
SOUTH AFRICA,
ITALY,
IRELAND,
BAHRAIN,
RUSSIA,
BRAZIL,
POLAND

Country