



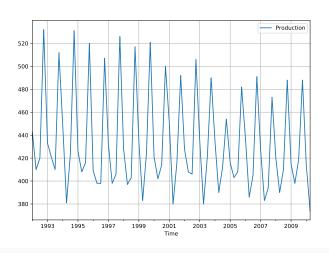


# Time Series Analysis and Forecasting

MGO962

Lab 2: Data visualization in Python

#### **Australian Beer Production Plot > 1992**



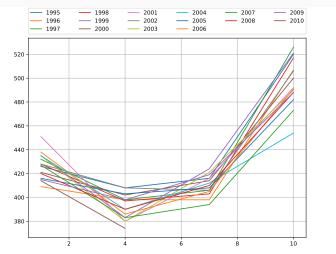
#### **Australian Beer Production**

#### Seasonal Plot

```
import pandas as pd
import matplotlib.pyplot as plt
df = pd.read_csv("data/ausbeer.csv", header=0,
                 parse_dates=True, index_col=0)
df['year'] = df.index.year
df['month'] = df.index.month
df = df.loc['1995-01-01':'2020-01-01']
years = df['year'].unique()
for year in years:
    plt.plot('month', 'Production',
             data=df.loc[df.year == year, :], label=year)
```

#### **Australian Beer Production**

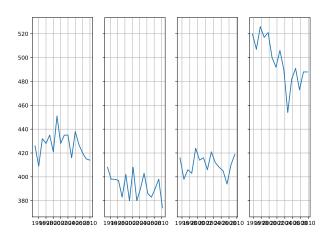
#### **Seasonal Plot**



#### **Australian Beer Production Seasonal Subplot**

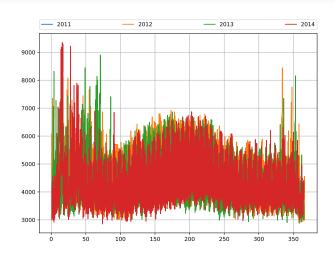
```
import pandas as pd
import matplotlib.pyplot as plt
df = pd.read_csv("data/ausbeer.csv", header=0,
                 parse_dates=True, index_col=0)
df['year'] = df.index.year
df['month'] = df.index.month
df = df.loc['1995-01-01':'2020-01-01']
months = df['month'].unique()
fig, axs = plt.subplots(1, 4, sharey=True)
for idx, month in enumerate(months):
    axs[idx].plot('Production', data=df.loc[df.month == month, :],
```

## **Australian Beer Production Seasonal Subplot**

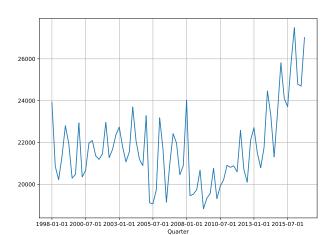


## **Electricity Production Seasonal Plot by Year**

# **Electricity Production Seasonal Plot by Year**



# **Australian Tourism Total Trips**



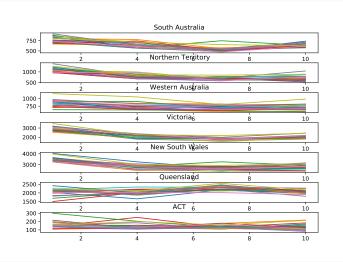
#### **Australian Tourism**

Seasonal Subplot per State by Year

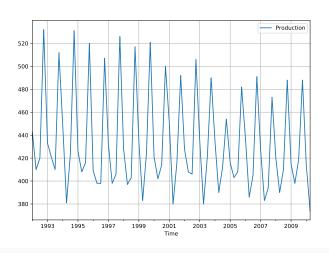
```
import pandas as pd
import matplotlib.pyplot as plt
df = pd.read_csv("data/tourism.csv", parse_dates=True,
                 index col=1).drop(columns=["Unnamed: 0"])
df.columns = [col_name.lower() for col_name in df.columns]
fig, axs = plt.subplots(7, 1)
df['quarter'] = pd.DatetimeIndex(df.index)
df['year'] = pd.DatetimeIndex(df['quarter']).year
df = df.query('purpose == "Holiday"')
for idx, state in enumerate(df['state'].unique()):
   for idy, year in enumerate(df['year'].unique()):
        dfs = df.query('state == "' + state + '"')
       dfs = dfs.loc[str(year) + '-01-01': str(year) + '-12-31']
       dfy = dfs.groupby('quarter', as_index=False)
       dfy = dfy['trips'].agg(sum)
        dfy['month'] = pd.DatetimeIndex(dfy['quarter']).month
       dfy = dfy.sort_values(by=['month'], ascending=True)
        axs[idx].plot('month', 'trips', data=dfy, label=year)
```

#### **Australian Tourism**

#### Seasonal Subplot per State by Year



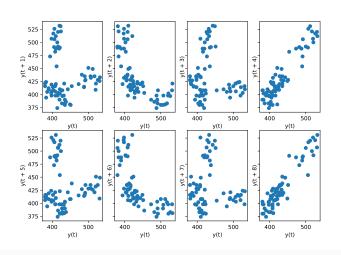
#### **Australian Beer Production Plot > 1992**



#### **Australian Beer Production Lag Plot**

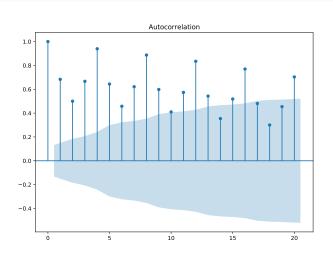
```
import pandas as pd
import matplotlib.pyplot as plt
df = pd.read_csv("data/ausbeer.csv",
                 header=0, parse dates=True, index col=0)
df = df.loc['1992-01-01':'2020-01-01']
fig, axs = plt.subplots(2, 4, sharey=True)
pd.plotting.lag_plot(df, lag=1, ax=axs[0][0])
pd.plotting.lag_plot(df, lag=2, ax=axs[0][1])
pd.plotting.lag_plot(df, lag=3, ax=axs[0][2])
pd.plotting.lag_plot(df, lag=4, ax=axs[0][3])
pd.plotting.lag_plot(df, lag=5, ax=axs[1][0])
pd.plotting.lag_plot(df, lag=6, ax=axs[1][1])
pd.plotting.lag_plot(df, lag=7, ax=axs[1][2])
pd.plotting.lag_plot(df, lag=8, ax=axs[1][3])
plt.show()
```

# **Australian Beer Production Lag Plot**



#### **Australian Beer Production ACF Plot**

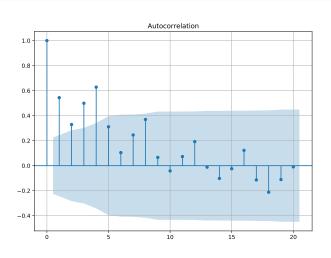
#### **Australian Beer Production ACF Plot**



#### **Australian Tourism ACF Plot**

```
import pandas as pd
import matplotlib.pyplot as plt
from statsmodels.graphics.tsaplots import plot_acf
# load the data
df = pd.read_csv("data/tourism.csv",
                 parse_dates=True).drop(columns=["Unnamed: 0"])
# Total
dft = df.groupby("Quarter")
dft = dft['Trips'].agg(sum)
plot_acf(dft, lags=20)
plt.grid()
plt.show()
```

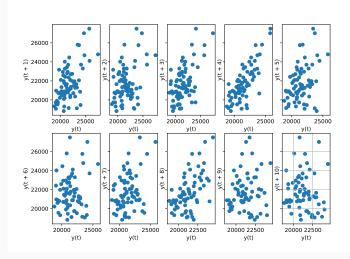
#### **Australian Tourism ACF Plot**



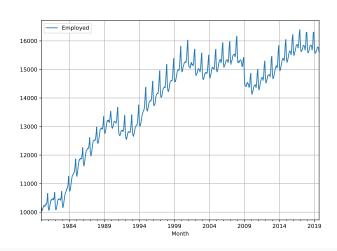
#### **Australian Tourism Lag Plot**

```
import pandas as pd
import matplotlib.pyplot as plt
from statsmodels.graphics.tsaplots import plot_acf
# load the data
df = pd.read_csv("data/tourism.csv",
                 parse_dates=True).drop(columns=["Unnamed: 0"])
# Total
dft = df.groupby("Quarter")
dft = dft['Trips'].agg(sum)
fig, axs = plt.subplots(2, 5, sharey=True)
pd.plotting.lag_plot(dft, lag=1, ax=axs[0][0])
pd.plotting.lag_plot(dft, lag=2, ax=axs[0][1])
pd.plotting.lag_plot(dft, lag=3, ax=axs[0][2])
pd.plotting.lag_plot(dft, lag=4, ax=axs[0][3])
pd.plotting.lag_plot(dft, lag=5, ax=axs[0][4])
pd.plotting.lag_plot(dft, lag=6, ax=axs[1][0])
pd.plotting.lag_plot(dft, lag=7, ax=axs[1][1])
pd.plotting.lag_plot(dft, lag=8, ax=axs[1][2])
nd nlatting log plat(dft log_0 av_ava[1][2])
```

## **Australian Tourism Lag Plot**



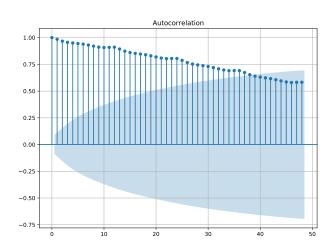
# **Us Employment Retail Plot**



#### **Us Employment ACF Plot**

```
import pandas as pd
import matplotlib.pyplot as plt
from statsmodels.graphics.tsaplots import plot_acf
# load the data
df = pd.read_csv("data/usemployment.csv",
                 header=0, parse_dates=True, index_col=0)
dfs = df.query('Title == "Retail Trade"')
dfs = dfs.loc['1980-01-01':'2020-01-01']
plot_acf(dfs['Employed'], lags=48)
plt.grid()
plt.show()
```

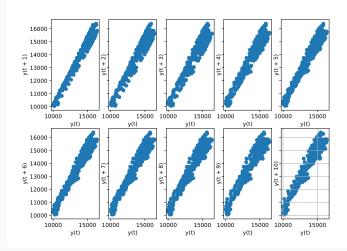
# **Us Employment ACF Plot**



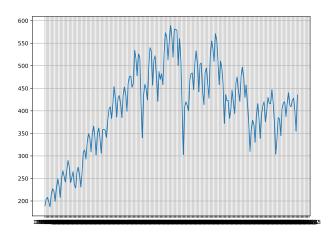
## **Us Employment Lag Plot**

```
import pandas as pd
import matplotlib.pyplot as plt
df = pd.read_csv("data/usemployment.csv", header=0, parse_dates=Tr
dfs = df.query('Title == "Retail Trade"')
dfs = dfs.loc['1980-01-01':'2020-01-01']
fig, axs = plt.subplots(2, 5, sharey=True)
pd.plotting.lag_plot(dfs['Employed'], lag=1, ax=axs[0][0])
pd.plotting.lag_plot(dfs['Employed'], lag=2, ax=axs[0][1])
pd.plotting.lag_plot(dfs['Employed'], lag=3, ax=axs[0][2])
pd.plotting.lag_plot(dfs['Employed'], lag=4, ax=axs[0][3])
pd.plotting.lag_plot(dfs['Employed'], lag=5, ax=axs[0][4])
pd.plotting.lag_plot(dfs['Employed'], lag=6, ax=axs[1][0])
pd.plotting.lag_plot(dfs['Employed'], lag=7, ax=axs[1][1])
pd.plotting.lag_plot(dfs['Employed'], lag=8, ax=axs[1][2])
pd.plotting.lag_plot(dfs['Employed'], lag=9, ax=axs[1][3])
pd.plotting.lag_plot(dfs['Employed'], lag=10, ax=axs[1][4])
                                                               24
nlt.grid()
```

# **Us Employment Lag Plot**



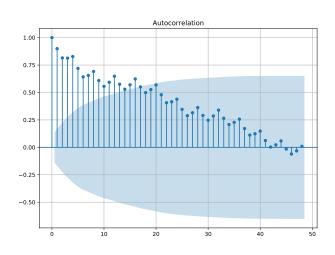
#### **Australian Production Bricks Plot**



#### **Australian Production Bricks ACF Plot**

```
import pandas as pd
import matplotlib.pyplot as plt
from statsmodels.graphics.tsaplots import plot_acf
# load the data
df = pd.read_csv("data/aus_production.csv",
                 header=0, parse_dates=['Quarter'], index_col=0)
dfs = df.loc['1956 Q1':'2005 Q2']
plot_acf(dfs['Bricks'], lags=48)
# Total
plt.grid()
plt.show()
```

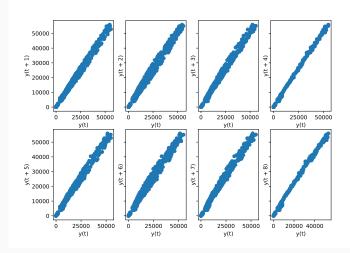
#### **Australian Production Bricks ACF Plot**



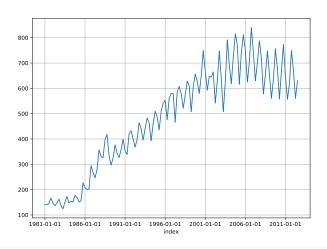
#### **Australian Production Bricks Lag Plot**

```
import pandas as pd
import matplotlib.pyplot as plt
df = pd.read_csv("data/aus_production.csv",
                 header=0, parse_dates=True, index_col=0)
dfs = df.loc['1956 Q1':'2005 Q2']
fig, axs = plt.subplots(2, 4, sharey=True)
pd.plotting.lag_plot(dfs, lag=1, ax=axs[0][0])
pd.plotting.lag_plot(dfs, lag=2, ax=axs[0][1])
pd.plotting.lag_plot(dfs, lag=3, ax=axs[0][2])
pd.plotting.lag_plot(dfs, lag=4, ax=axs[0][3])
pd.plotting.lag_plot(dfs, lag=5, ax=axs[1][0])
pd.plotting.lag_plot(dfs, lag=6, ax=axs[1][1])
pd.plotting.lag_plot(dfs, lag=7, ax=axs[1][2])
pd.plotting.lag_plot(dfs, lag=8, ax=axs[1][3])
plt.show()
```

## **Australian Production Bricks Lag Plot**



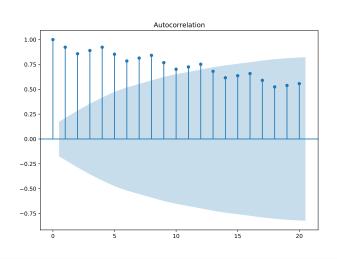
#### **Australian Arrivals Plot**



#### **Australian Arrivals ACF Plot**

```
import pandas as pd
import matplotlib.pyplot as plt
from statsmodels.graphics.tsaplots import plot_acf
# load the data
df = pd.read_csv("data/arrivals.csv", parse_dates=True)
# Total
dft = df.groupby("index")
dft = dft['value'].agg(sum)
plot_acf(dft, lags=20)
plt.show()
```

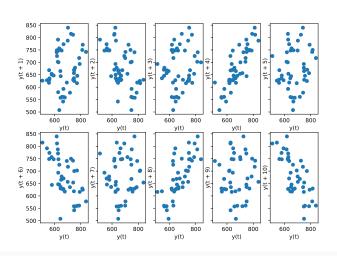
#### **Australian Arrivals ACF Plot**



## **Australian Arrivals Lag Plot**

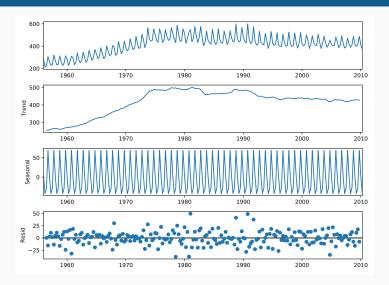
```
import pandas as pd
import matplotlib.pyplot as plt
df = pd.read_csv("data/arrivals.csv",
                 header=0, parse_dates=True, index_col=0)
dft = df.groupby("index")
dft = dft['value'].agg(sum)
dft = dft.loc['2000-01-01':'2020-01-01']
fig, axs = plt.subplots(2, 5, sharey=True)
pd.plotting.lag_plot(dft, lag=1, ax=axs[0][0])
pd.plotting.lag_plot(dft, lag=2, ax=axs[0][1])
pd.plotting.lag_plot(dft, lag=3, ax=axs[0][2])
pd.plotting.lag_plot(dft, lag=4, ax=axs[0][3])
pd.plotting.lag_plot(dft, lag=5, ax=axs[0][4])
pd.plotting.lag_plot(dft, lag=6, ax=axs[1][0])
pd.plotting.lag_plot(dft, lag=7, ax=axs[1][1])
pd.plotting.lag_plot(dft, lag=8, ax=axs[1][2])
pd.plotting.lag_plot(dft, lag=9, ax=axs[1][3])
nd nlotting lag plot(dft, lag=10, ax=axs[1][4])
```

# **Australian Arrivals Lag Plot**



## **Australian Beer STL Decomposition**

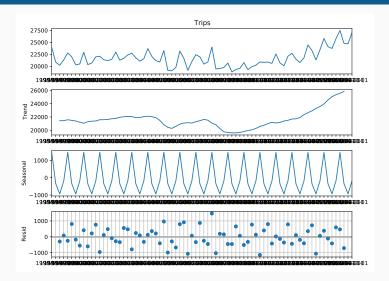
## **Australian Beer STL Decomposition**



## **Australian Tourism STL Decomposition**

```
import pandas as pd
import matplotlib.pyplot as plt
from statsmodels.tsa.seasonal import seasonal_decompose
# load the data
df = pd.read_csv("data/tourism.csv",
                 parse_dates=True).drop(columns=["Unnamed: 0"])
# Total
dft = df.groupby("Quarter")
dft = dft['Trips'].agg(sum)
decomposition = seasonal_decompose(dft, model='additive', period=4)
fig = decomposition.plot()
plt.grid()
plt.show()
```

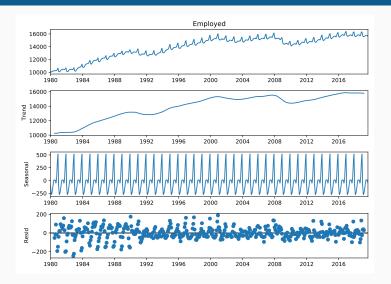
# **Australian Tourism STL Decomposition**



## **US Employment STL Decomposition**

```
import pandas as pd
import matplotlib.pyplot as plt
from statsmodels.tsa.seasonal import seasonal_decompose
# load the data
df = pd.read_csv("data/usemployment.csv",
                 header=0, parse_dates=True, index_col=0)
dfs = df.query('Title == "Retail Trade"')
dfs = dfs.loc['1980-01-01':'2020-01-01']
decomposition = seasonal_decompose(dfs['Employed'], model='additive')
fig = decomposition.plot()
plt.show()
```

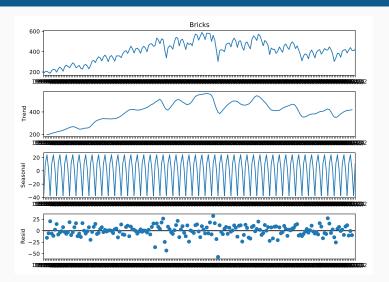
## **US Employment STL Decomposition**



#### **Australian Brick Production STL Decomposition**

```
import pandas as pd
import matplotlib.pyplot as plt
from statsmodels.tsa.seasonal import seasonal_decompose
# load the data
df = pd.read_csv("data/aus_production.csv",
                 header=0, parse_dates=True, index_col=0)
dfs = df.loc['1956 Q1':'2004 Q2']
# Total
decomposition = seasonal decompose(dfs['Bricks'],
                                   model='additive', period=4)
fig = decomposition.plot()
plt.show()
```

# **Australian Brick Production STL Decomposition**



#### **Australian Arrivals STL Decomposition**

```
import pandas as pd
import matplotlib.pyplot as plt
from statsmodels.tsa.seasonal import seasonal_decompose
# load the data
df = pd.read_csv("data/arrivals.csv", parse_dates=True)
# Total
dft = df.groupby("index")
dft = dft['value'].agg(sum)
decomposition = seasonal_decompose(dft, model='additive', period=4)
fig = decomposition.plot()
plt.show()
```

# **Australian Arrivals STL Decomposition**

