Section 1.4

October 1, 2023

Figures for Section 1.4

[1]:
```
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import numpy as np
```

[20]:
```
# preprocess data
wine = [i.strip().split() for i in open("../../data/wine.dat.rtf").readlines()]
# remove entries with '\\'
wine_cleaned = [m for m in wine if '\\' not in ' '.join(m)]

# slice the data, remove the first and last entries
wine_df = pd.DataFrame(wine_cleaned[1:-1])

# change datatype from str to int
wine_df = wine_df.astype({0:'int'})
#wine_df.head()
```

Figure 1.10

Time series plots of the red wine sales in Australia from January 1980 to October 1991 (left) and its log transformation with yearly mean estimates (right).

[21]:
```
# create time stamps
times = np.arange(np.datetime64('1980-01'),
                  np.datetime64('1991-10'))

# log-transformation
wine_df['log'] = np.log(wine_df[0])
# create a date column
wine_df['date'] = pd.date_range('1980-01', '1991-10',freq='M')
```

[21]:

	0	log	date
0	675	6.514713	1980-01-31
1	703	6.555357	1980-02-29
2	887	6.787845	1980-03-31
3	1139	7.037906	1980-04-30
4	1077	6.981935	1980-05-31

[25]:
```
# calculate the yearly average from monthly day for log-transformed data
# reset index, generate a new dataframe
wine_year = wine_df.groupby(pd.PeriodIndex(wine_df['date'], freq="Y"))['log'].
 ↪mean().reset_index()
# repeat values with freq=12
newdf = pd.DataFrame(np.repeat(wine_year.values, 12, axis=0))
# column names
newdf.columns = ['year','average']

# select the previous 141 data, assign to 'yearly_average'
wine_df['yearly_average'] = newdf['average'][:141]
wine_df.head()
```

[25]:

	0	log	date	yearly_average
0	675	6.514713	1980-01-31	6.844599
1	703	6.555357	1980-02-29	6.844599
2	887	6.787845	1980-03-31	6.844599
3	1139	7.037906	1980-04-30	6.844599
4	1077	6.981935	1980-05-31	6.844599

[5]:
```
fig, axs = plt.subplots(1, 2, figsize=(9,4),constrained_layout = True)
axs[0].plot(times, wine_df[0])
# plot log-transferred data
axs[1].plot(times, wine_df['log'])
# plot yearly average data
axs[1].plot(times, wine_df['yearly_average'])
plt.show()
```

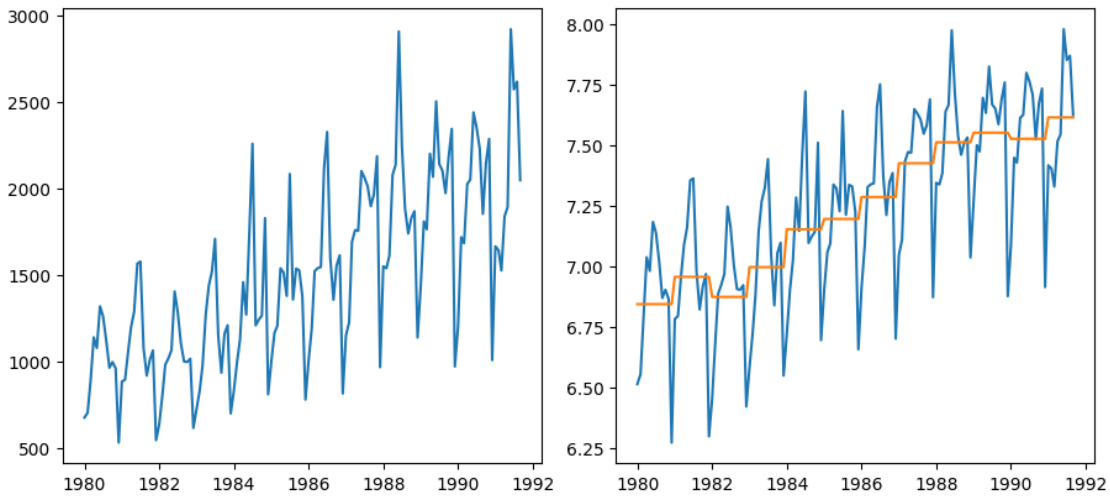


Figure 1.11

The detrended log series (left), the estimated seasonal component (center) and the corresponding

residuals series (right) of the Australian red wine sales data.

[57]:
```
# calcualted estimated seasonal components
# extract yearly average values
m = wine_df['yearly_average'].unique()
N,d = 12,12
w_log = wine_df['log']

# store estimated seasonality
# intialize as an array
s = np.zeros(d)
for k in range(d):
    j=0
    sN = 0
    while k+j*d < len(w_log):
        # relabel observations
        i = k + j*d
        sN = sN + (w_log[i]-m[j])
        j = j+1
    s[k] = 1/N * sN

# the sum of s should be 0
# np.sum(s)

# create a new column for estimated seasonal components
wine_df = wine_df.assign(est_s=s[np.arange(len(wine_df)) % N])

# calcualte residuals
wine_df['res'] = wine_df['log']-wine_df['yearly_average'] - wine_df['est_s']
```

[58]:
```
fig, axs = plt.subplots(1, 3, figsize=(12,5),constrained_layout = True)
axs[0].plot(times, wine_df['log']-wine_df['yearly_average'])
axs[1].plot(times, wine_df['est_s'])
axs[2].plot(times, wine_df['res'])
```

[58]:
```
[<matplotlib.lines.Line2D at 0x7fb958b2ef50>]
```

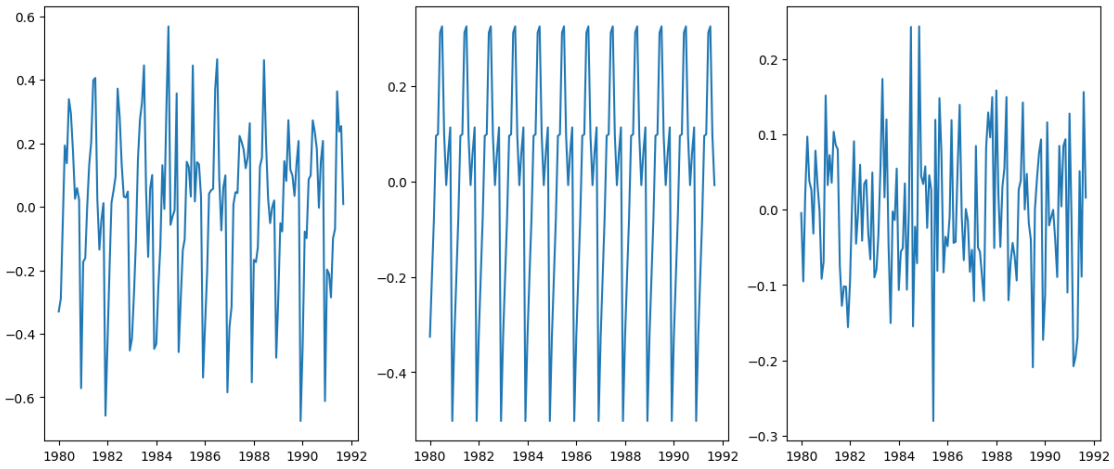


Figure 1.12

The differenced observed series $\nabla_{12} x_t$ (left), ∇x_t (middle) and $\nabla\nabla_{12} x_t = \nabla_{12}\nabla x_t$ (right) for the Australian red wine sales data.

[59]:
```
# create a lag-difference
def lagDiff(data,d):
    lagdiff = list()
    for i in range(d, len(data)):
        v = data[i] - data[i-d]
        lagdiff.append(v)

    return lagdiff
```

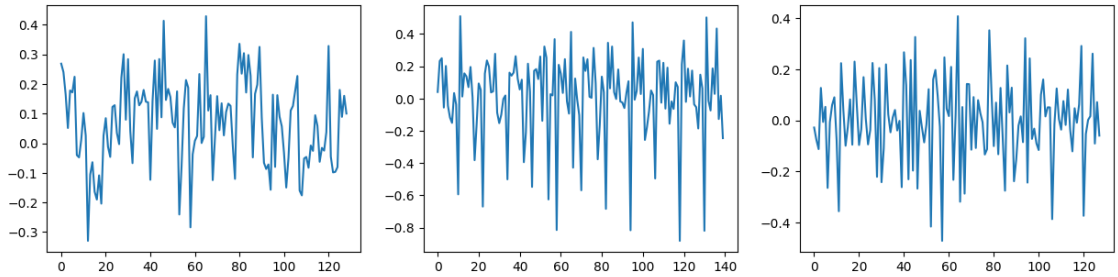
[60]:
```
fig, axs = plt.subplots(1, 3, figsize=(15,3.5))

lag12 = lagDiff(w_log, 12)
axs[0].plot(lag12)

df1 = np.diff(w_log)
axs[1].plot(df1)

df2 = np.diff(lag12)
axs[2].plot(df2)
```

[60]:
```
[<matplotlib.lines.Line2D at 0x7fb9482deed0>]
```



Reference:

1. https://matplotlib.org/stable/api/dates_api.html
2. https://stackoverflow.com/questions/65471540/get-monthly-average-in-pandas
3. https://stackoverflow.com/questions/50788508/how-can-i-replicate-rows-of-a-pandas-dataframe
4. https://stackoverflow.com/questions/47255885/how-do-i-add-a-column-to-a-dataframe-with-a-repeating-series-of-values
5. https://machinelearningmastery.com/difference-time-series-dataset-python/