

time_series_analysis_190808

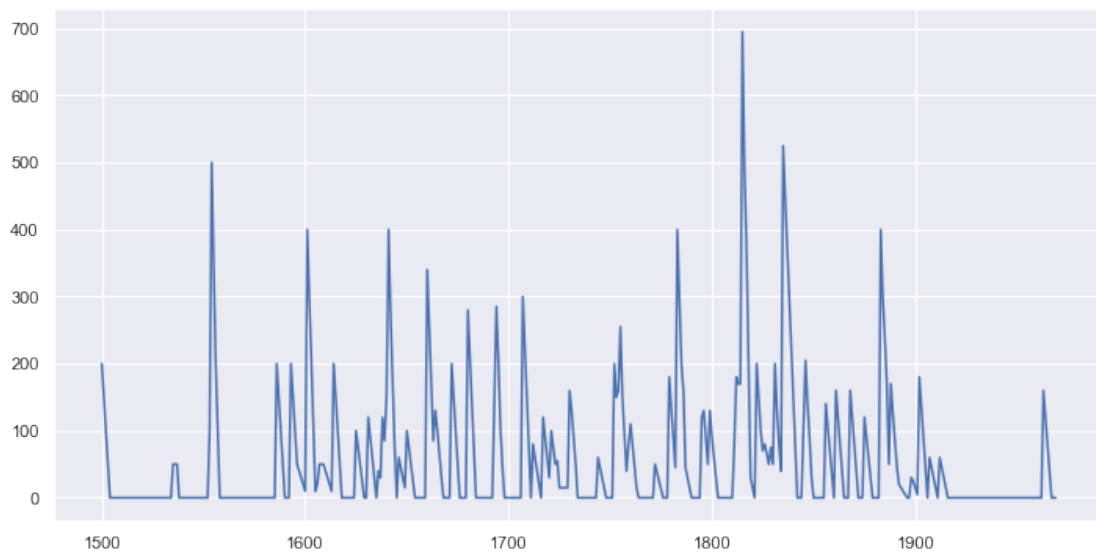
August 8, 2019

```
In [1]: import matplotlib.pyplot as plt
import pandas as pd
import seaborn
import statsmodels.api as sm
import statsmodels.tsa.api as tsa
import statsmodels.graphics.tsaplots as tsaplt
from scipy import stats
seaborn.set()

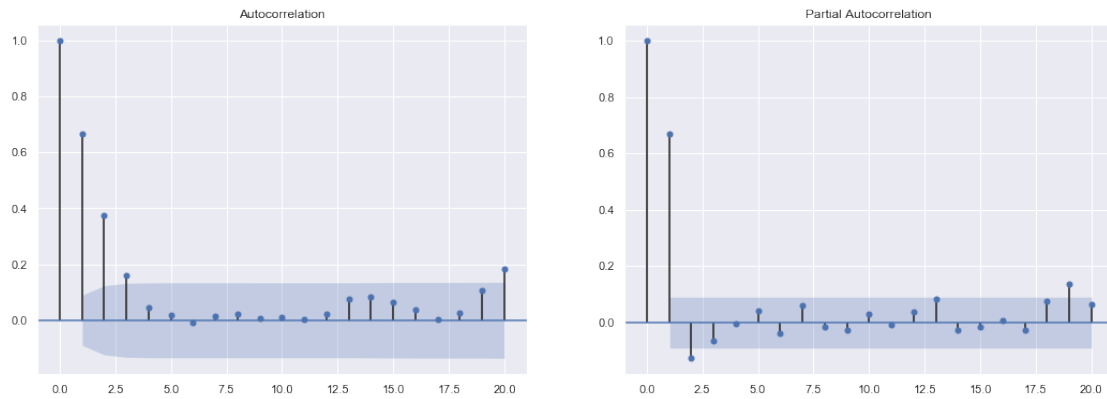
In [2]: data = pd.read_csv('C:\\Users\\poposoto\\Desktop\\model\\808\\1.csv')
data.index = range(1500, 1970)

1

In [3]: fig, ax = plt.subplots(figsize=(12, 6))
ax.plot(data);
```



```
In [4]: fig, ax = plt.subplots(1, 2, figsize=(18, 6))
        tsaplt.plot_acf(data, lags=20, ax=ax[0])
        tsaplt.plot_pacf(data, lags=20, ax=ax[1]);
```



3

```
In [5]: try:
        model1 = tsa.ARIMA(data, order=(2, 0, 0)).fit()
        print(model1.summary())
    except:
        print('error')
```

ARMA Model Results

```
=====
Dep. Variable:          x    No. Observations:          470
Model:                ARMA(2, 0)    Log Likelihood        -2662.544
Method:              css-mle    S.D. of innovations        69.783
Date:                Thu, 08 Aug 2019    AIC                5333.088
Time:                14:52:38    BIC                5349.699
Sample:              0    HQIC                5339.623
=====
```

	coef	std err	z	P> z	[0.025	0.975]
const	57.5233	8.596	6.692	0.000	40.676	74.371
ar.L1.x	0.7533	0.046	16.465	0.000	0.664	0.843
ar.L2.x	-0.1268	0.046	-2.769	0.006	-0.216	-0.037

Roots

	Real	Imaginary	Modulus	Frequency
AR.1	2.0014	+0.0000j	2.0014	0.0000
AR.2	3.9418	+0.0000j	3.9418	0.0000

```
In [6]: try:
        model2 = tsa.ARIMA(data, order=(0, 0, 3)).fit()
        print(model2.summary())
    except:
        print('error')
```

ARMA Model Results

```
=====
Dep. Variable:          x      No. Observations:          470
Model:                  ARMA(0, 3)  Log Likelihood        -2661.694
Method:                 css-mle    S.D. of innovations      69.655
Date:                  Thu, 08 Aug 2019    AIC                  5333.388
Time:                  14:52:38    BIC                  5354.152
Sample:                0      HQIC                  5341.557
=====
```

```
=====
              coef      std err          z      P>|z|      [0.025      0.975]
-----
const          57.4575         7.653        7.507      0.000      42.457      72.458
ma.L1.x         0.7438         0.045       16.352      0.000         0.655         0.833
ma.L2.x         0.4513         0.050        8.994      0.000         0.353         0.550
ma.L3.x         0.1916         0.044        4.337      0.000         0.105         0.278
=====
```

Roots

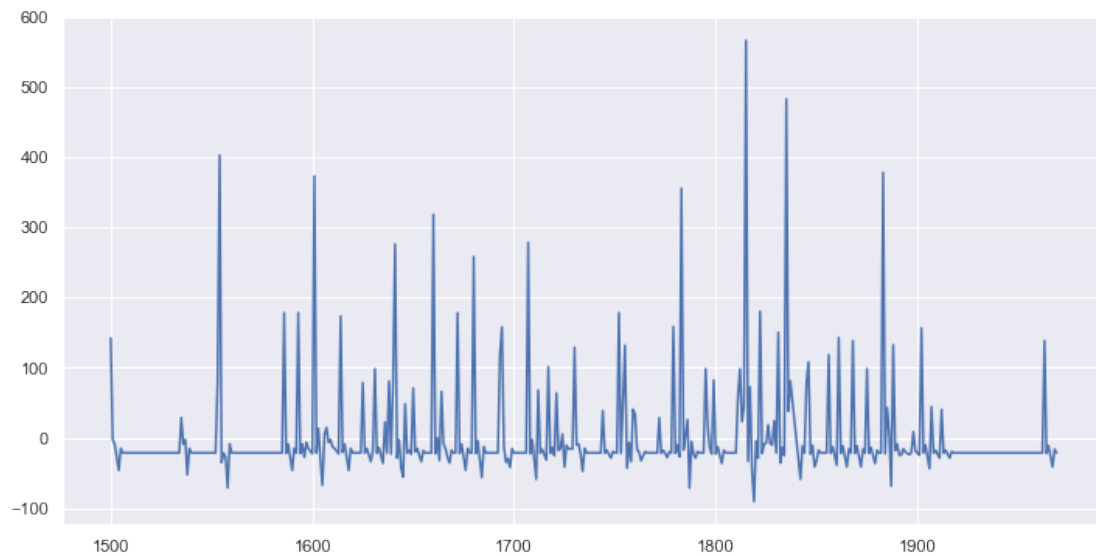
```
=====
              Real      Imaginary      Modulus      Frequency
-----
MA.1          -1.8059          -0.0000j          1.8059          -0.5000
MA.2          -0.2746          -1.6776j          1.6999          -0.2758
MA.3          -0.2746          +1.6776j          1.6999           0.2758
=====
```

```
In [7]: try:
        model3 = tsa.ARIMA(data, order=(2, 0, 3)).fit()
        print(model3.summary())
    except:
        print('error')
```

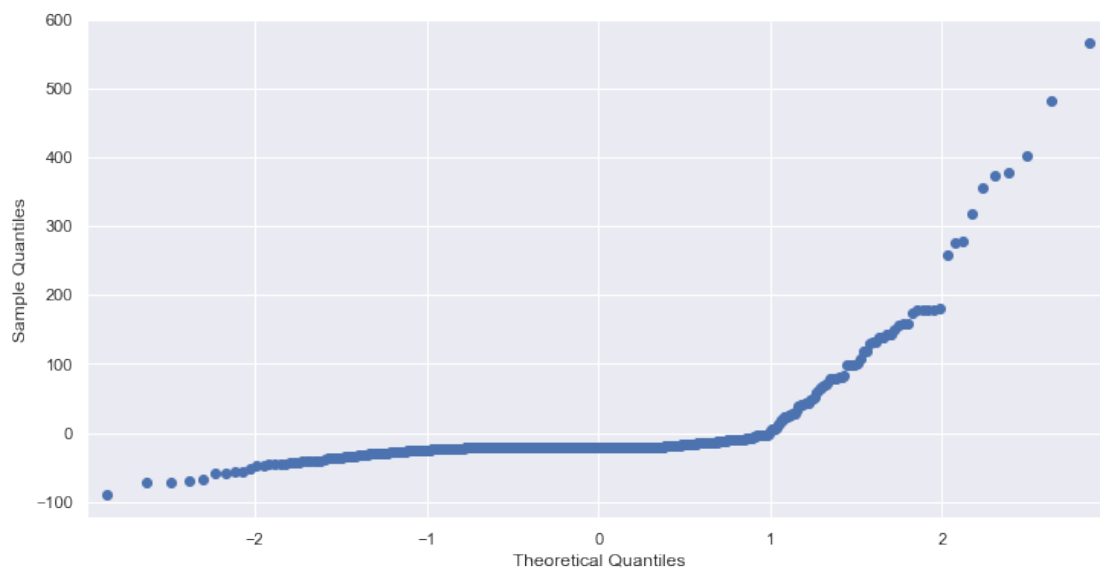
error

4

```
In [8]: fig, ax = plt.subplots(figsize=(12, 6))
        ax.plot(model1.resid);
```

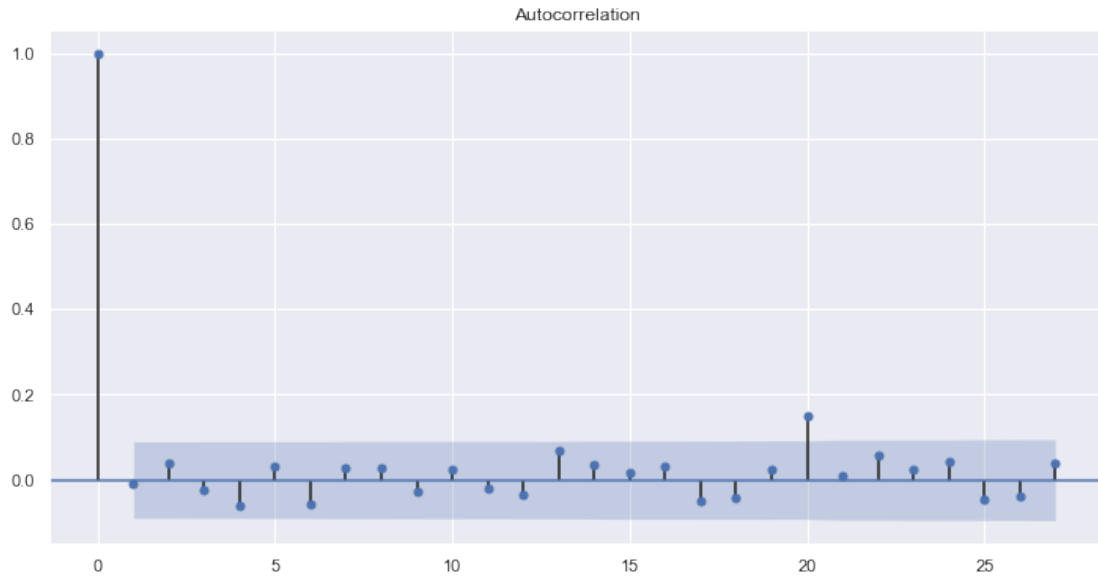


```
In [9]: fig, ax = plt.subplots(figsize=(12, 6))
        sm.qqplot(model1.resid, ax=ax);
```



```
In [10]: print(stats.shapiro(model1.resid)[1]) # p-value of the Shapiro-Wilk test for normality
7.260349022357701e-35
```

```
In [11]: fig, ax = plt.subplots(figsize=(12, 6))
        tsaplt.plot_acf(model1.resid, lags=27, ax=ax);
```



5

```
In [12]: fig, ax = plt.subplots(figsize=(12, 6))
         ax.plot((model1.resid - model1.resid.mean()) / model1.resid.std(), 'o');
```

