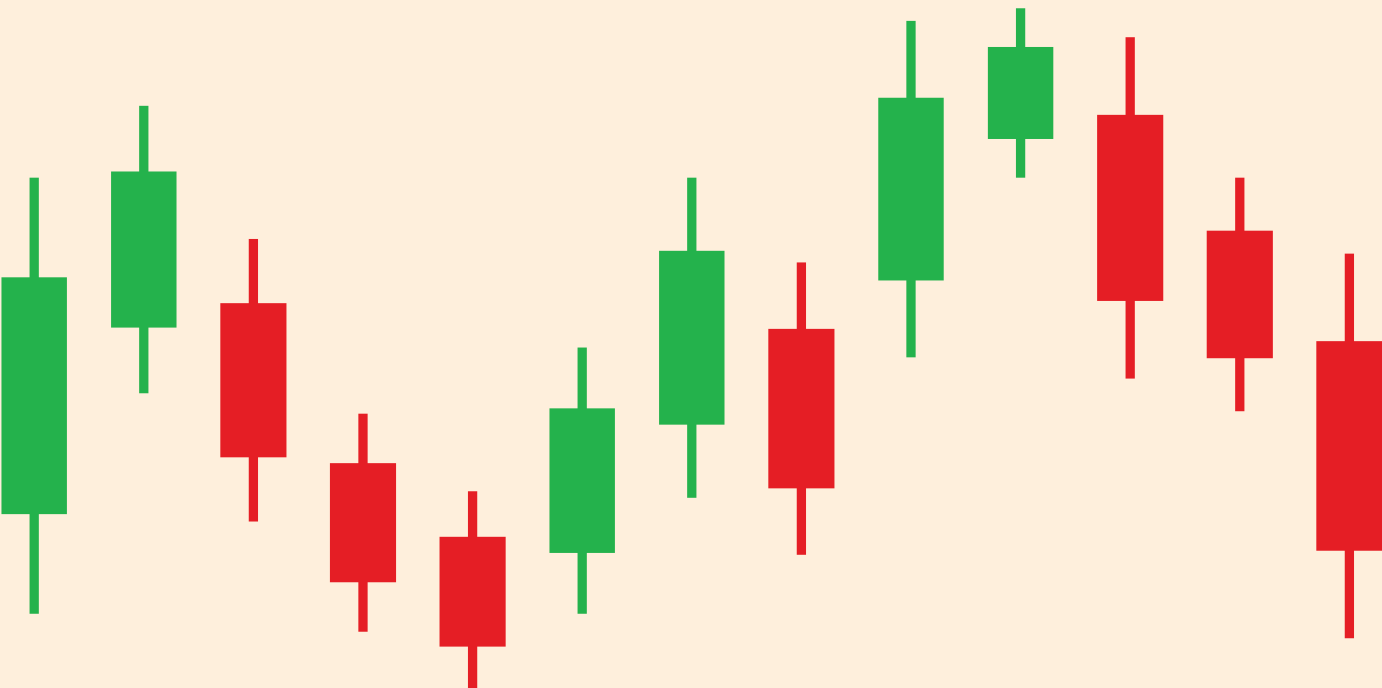




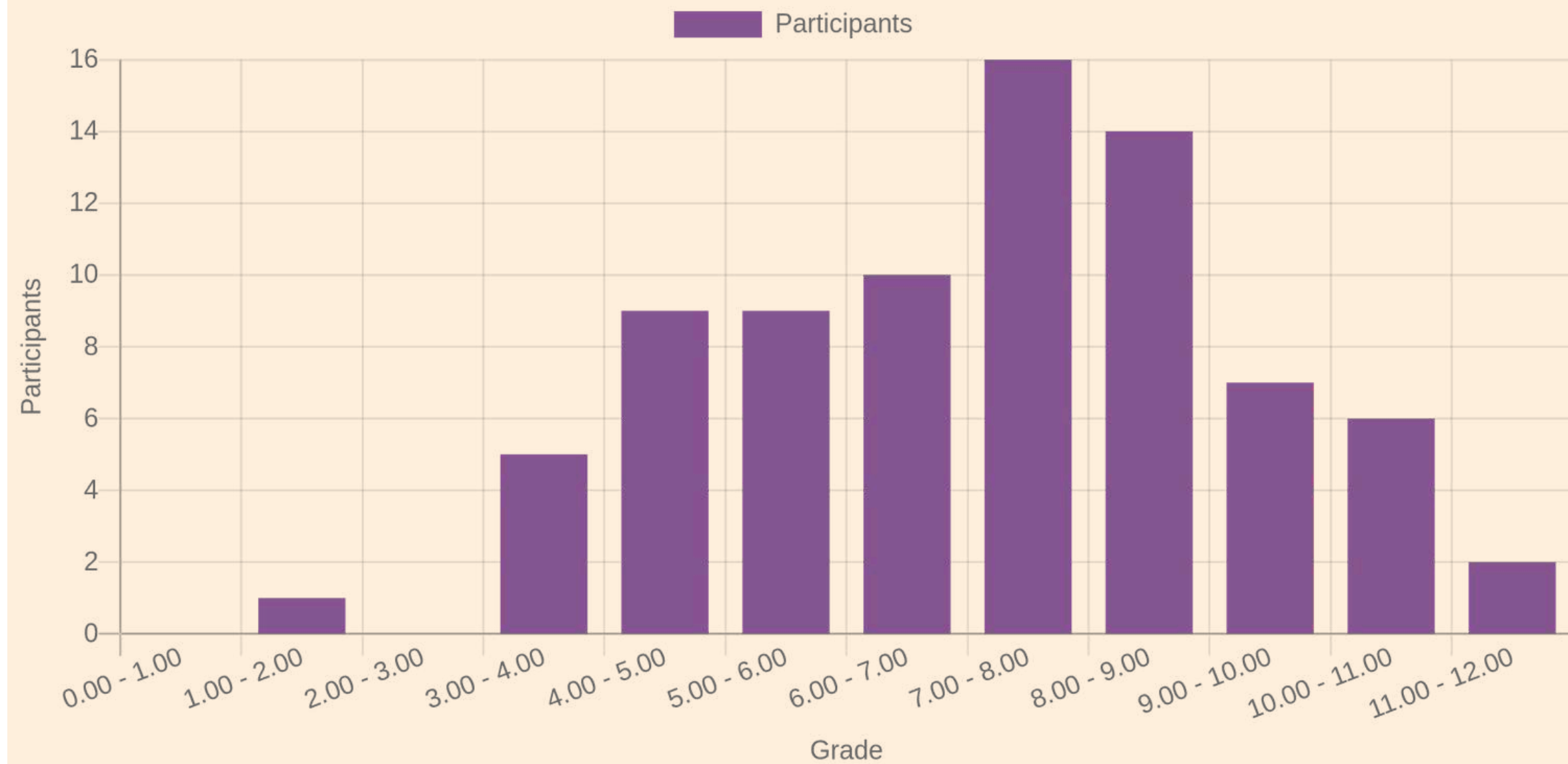
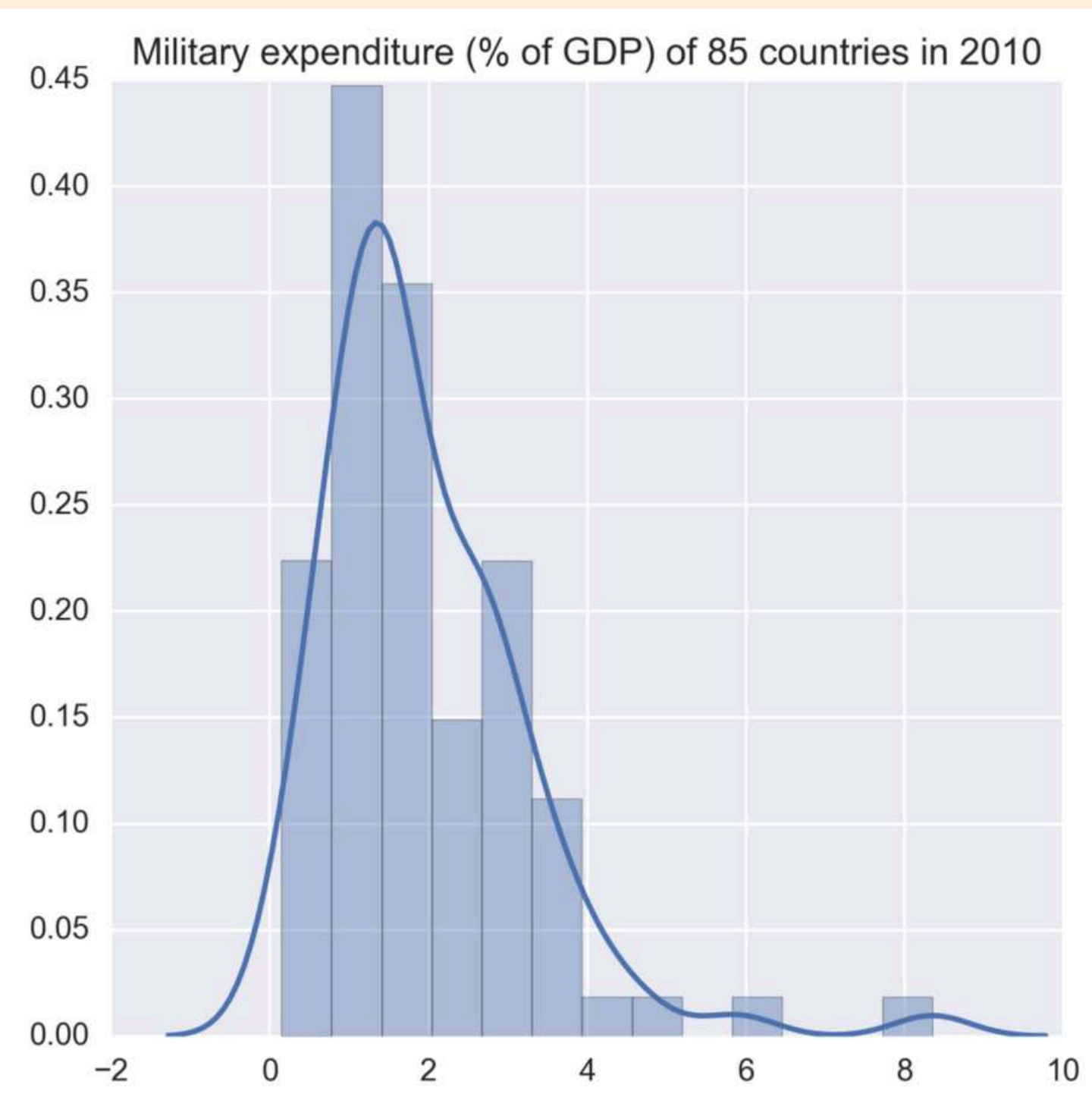
॥ त्वं ज्ञानमयो विज्ञानमयोऽसि ॥

# Time Series Visualization

## Trend Visualization

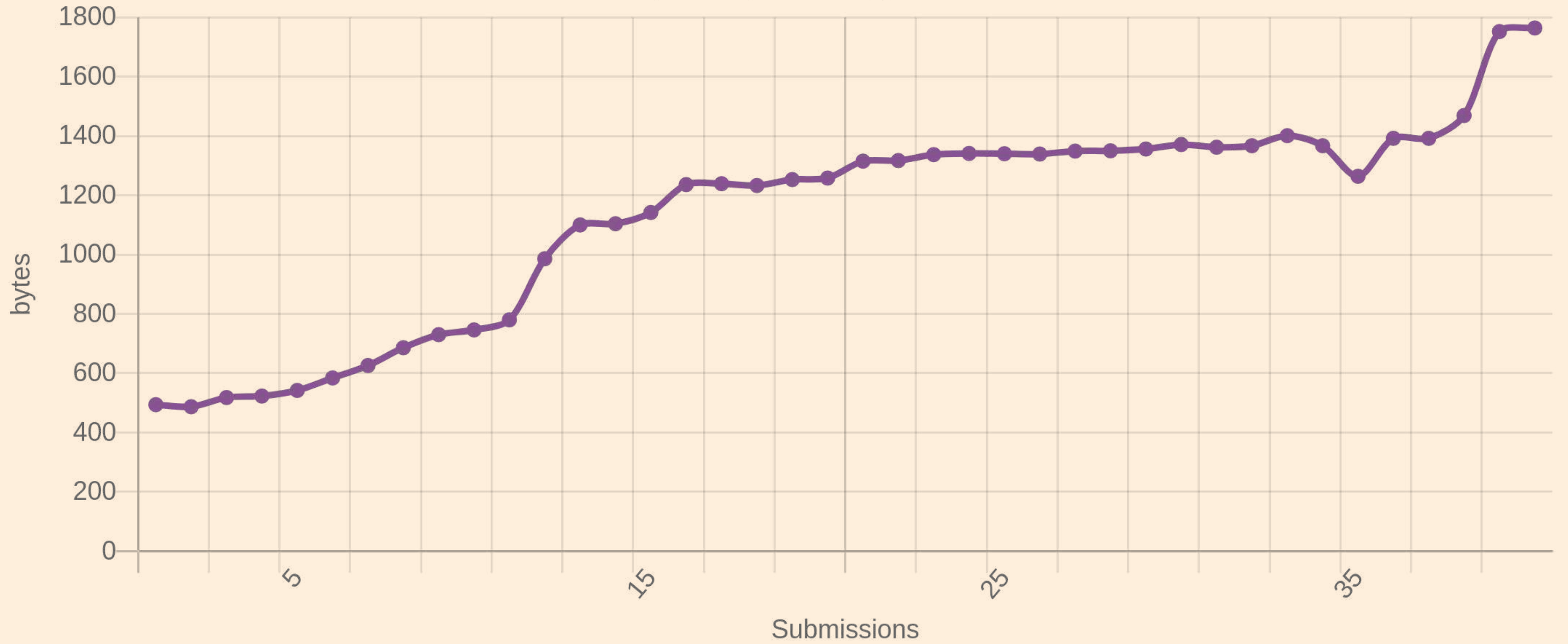


S. Kundu  
Ph.D.

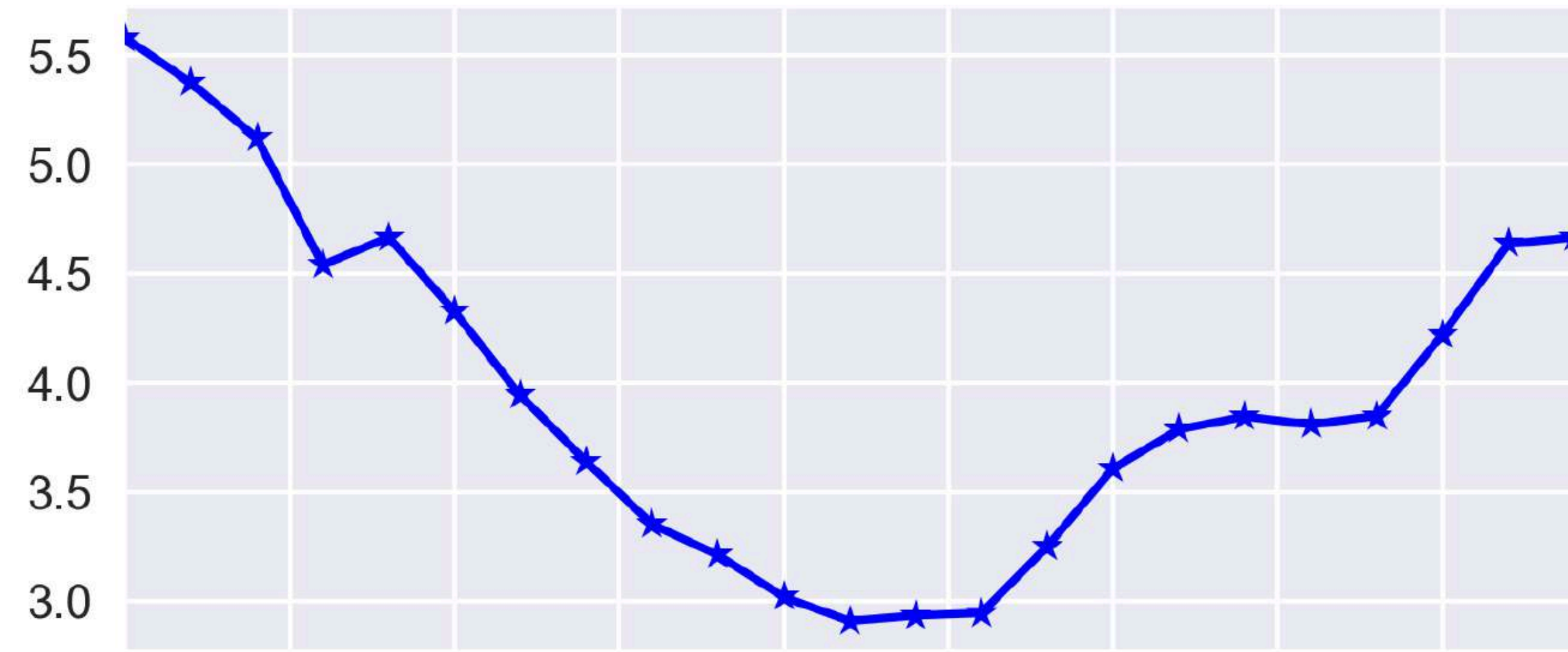


## Programming Assignment 1

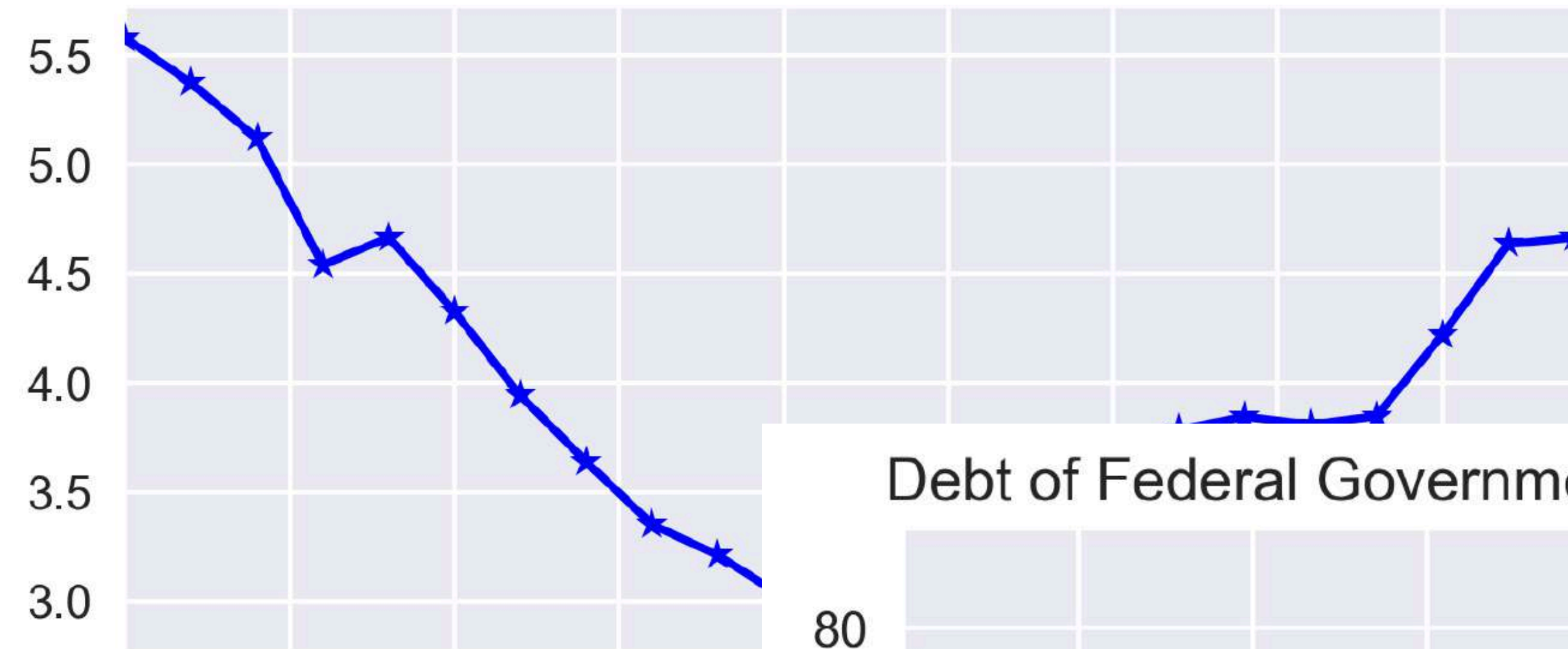
functions.py



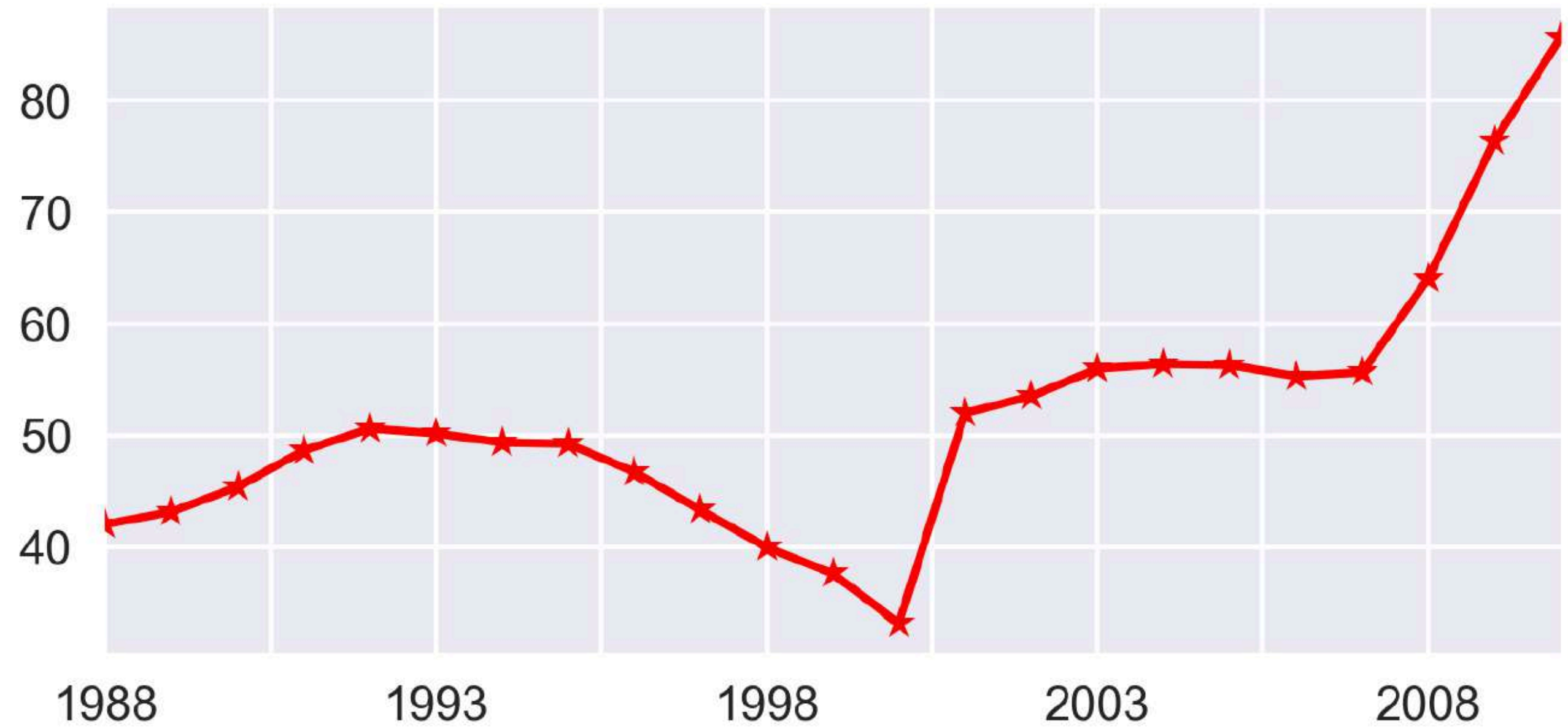
Federal Military Expenditure during 1988-2010 (% of GDP)



Federal Military Expenditure during 1988-2010 (% of GDP)

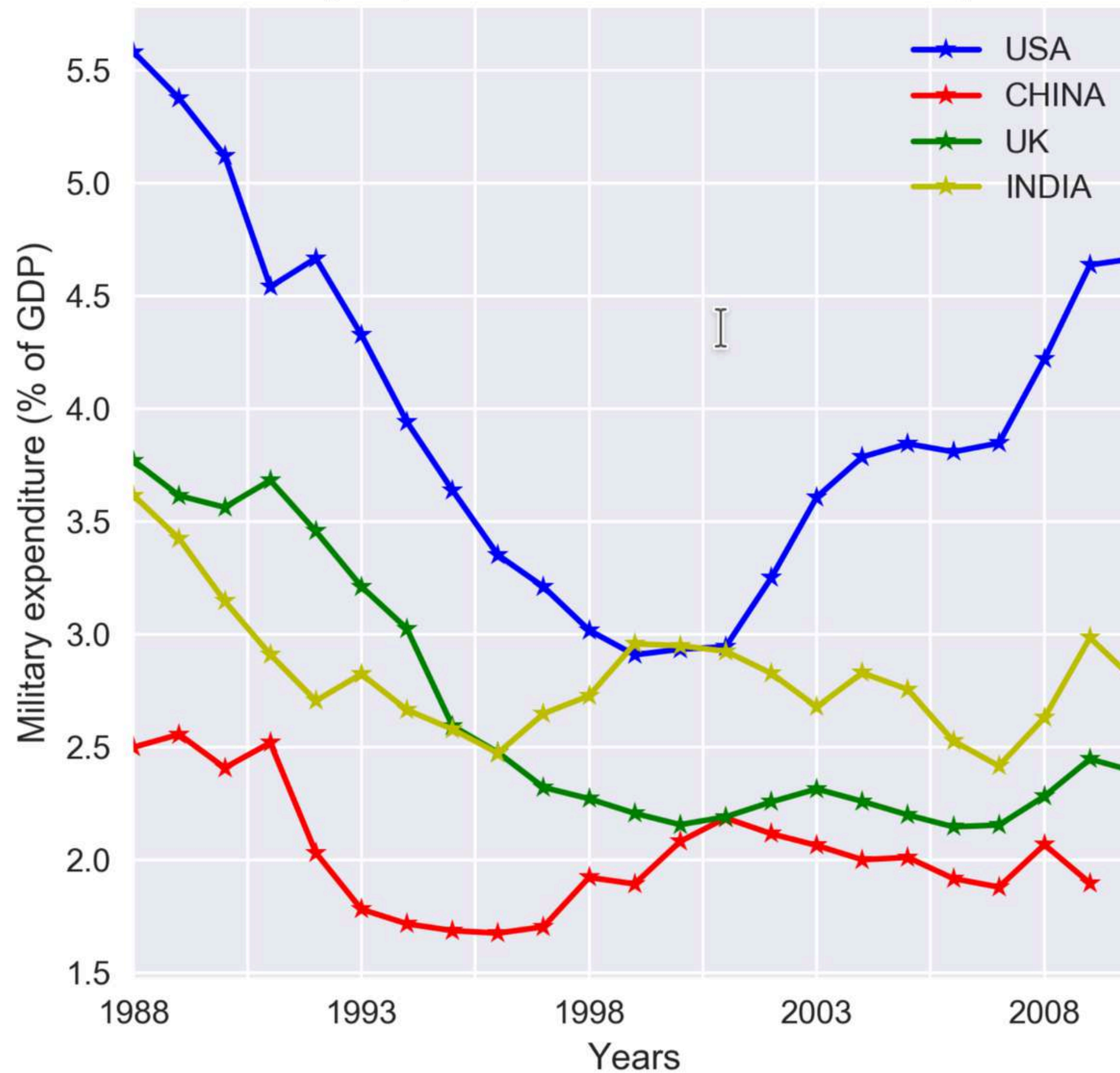


Debt of Federal Government during 1988-2010 (% of GDP)



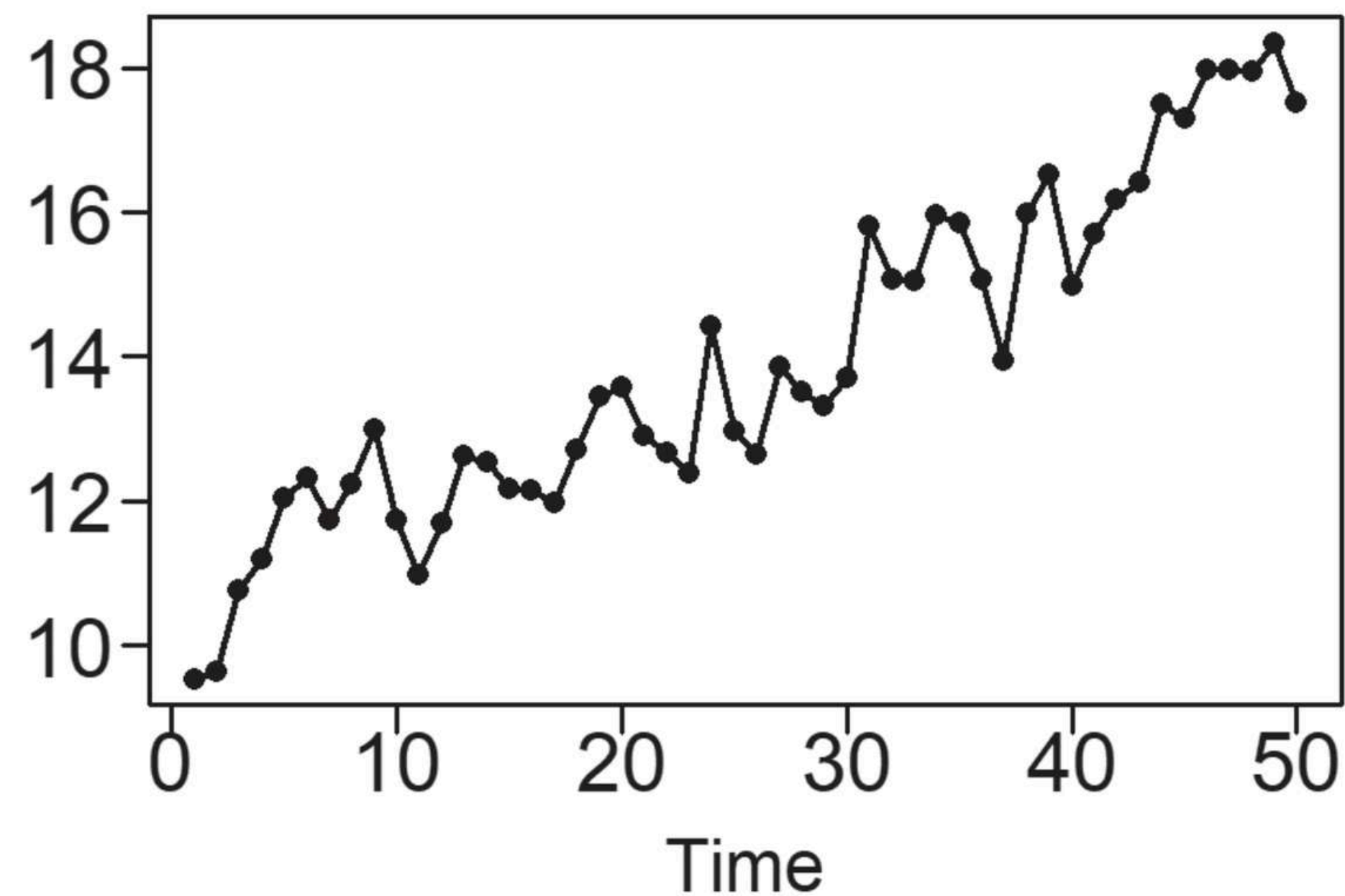


Military expenditure of 5 countries over 10 years

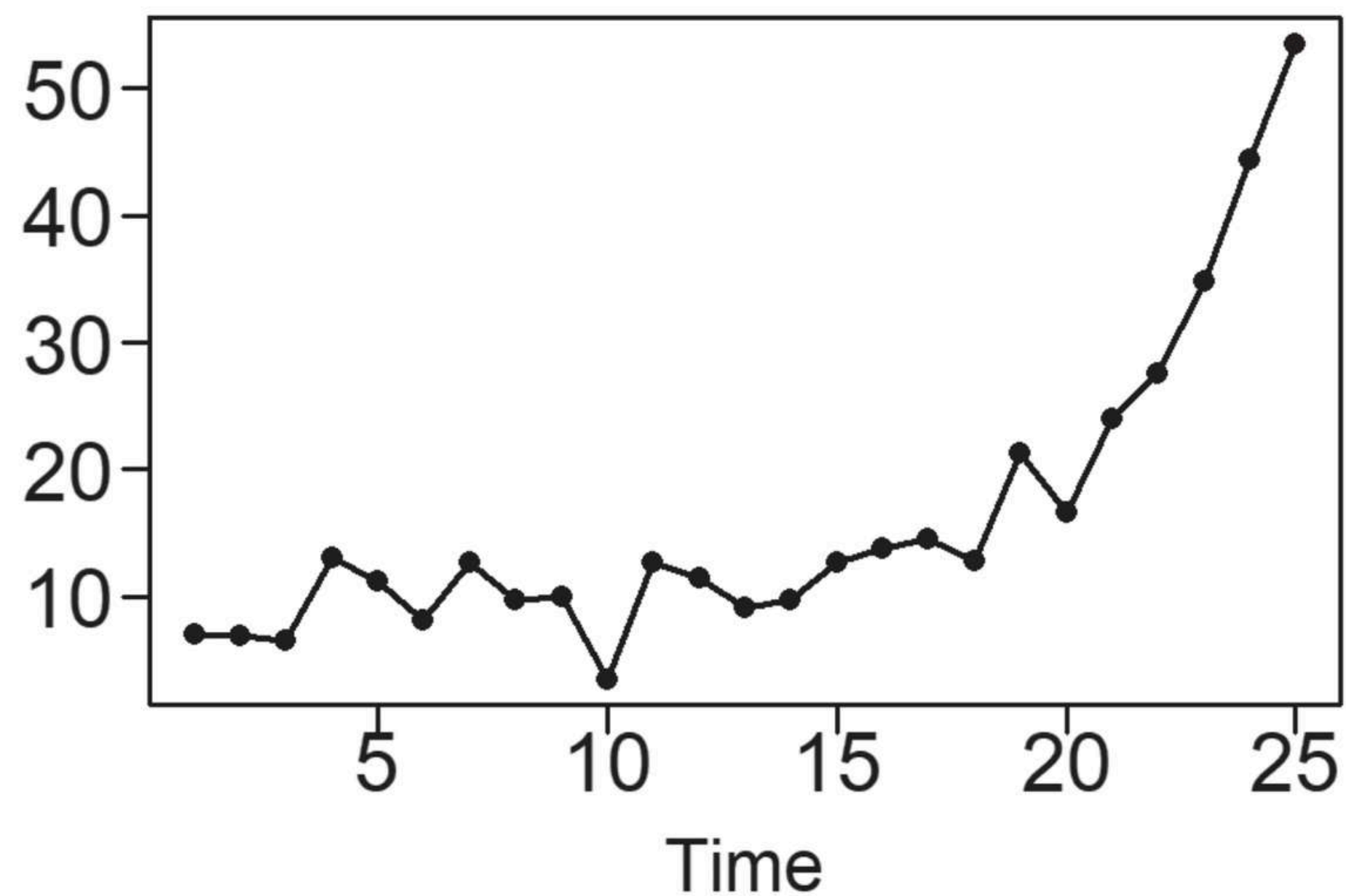


***#2474***



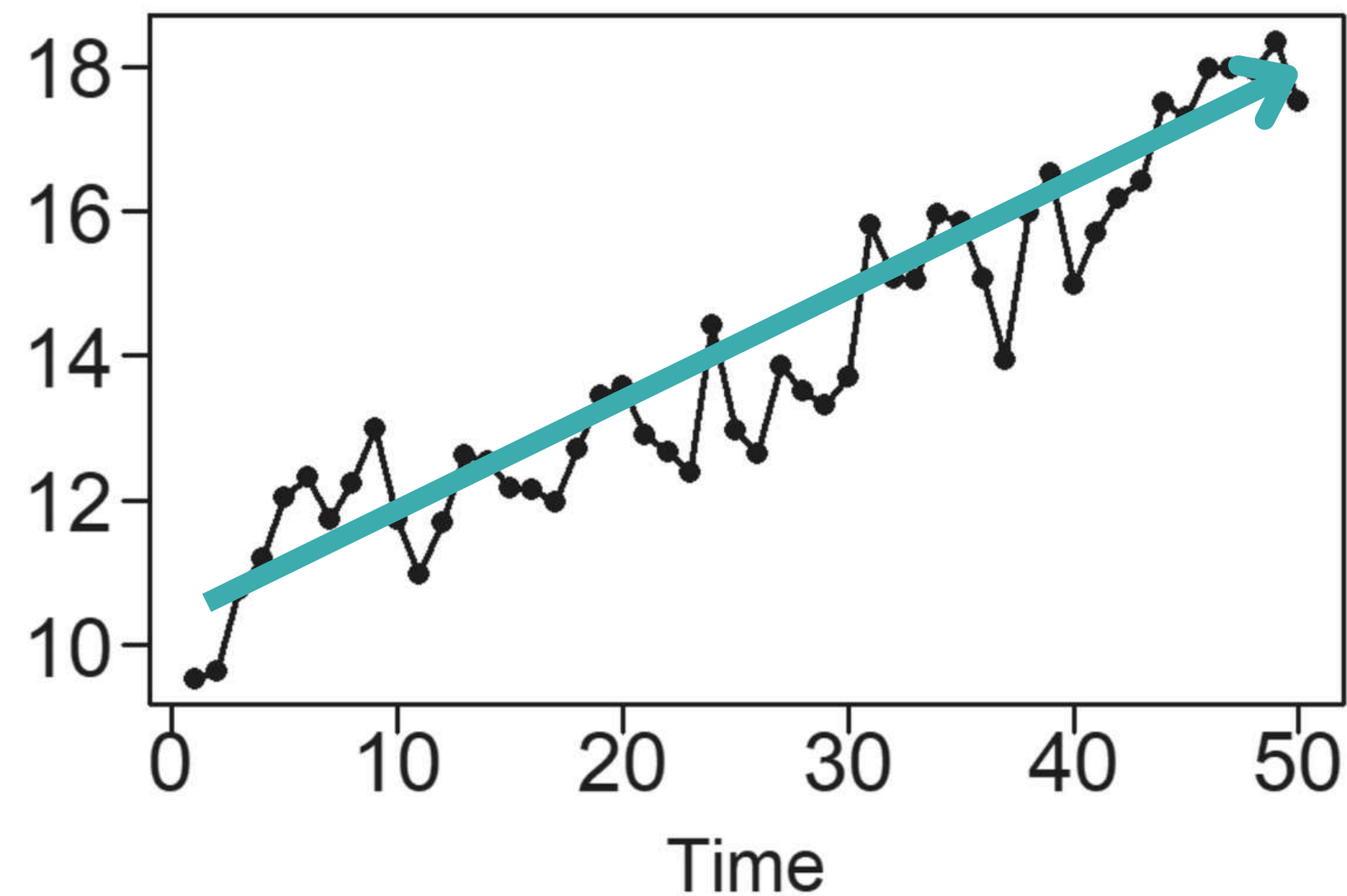


(a) Linear Trend

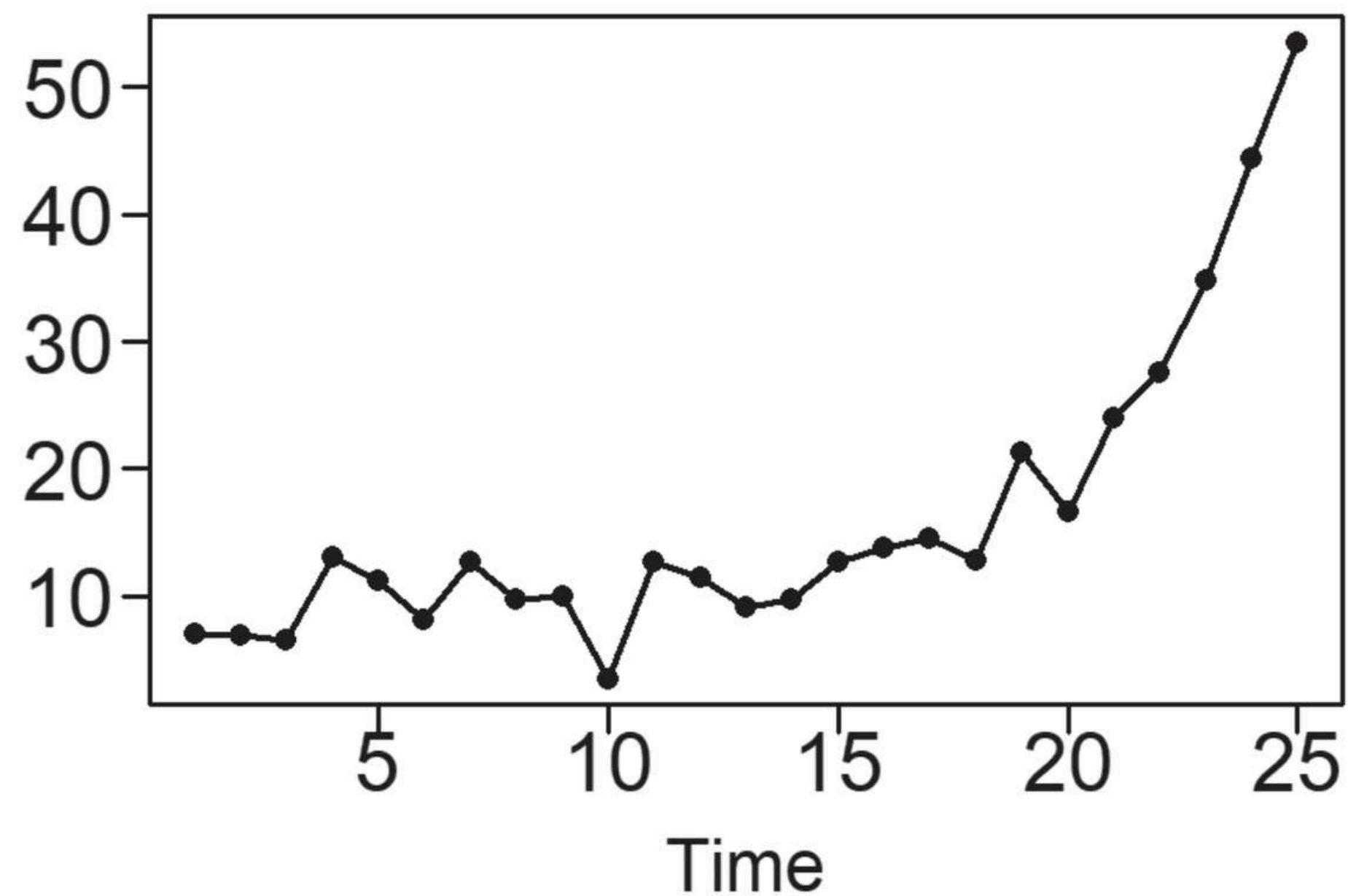


(b) Exponential Trend

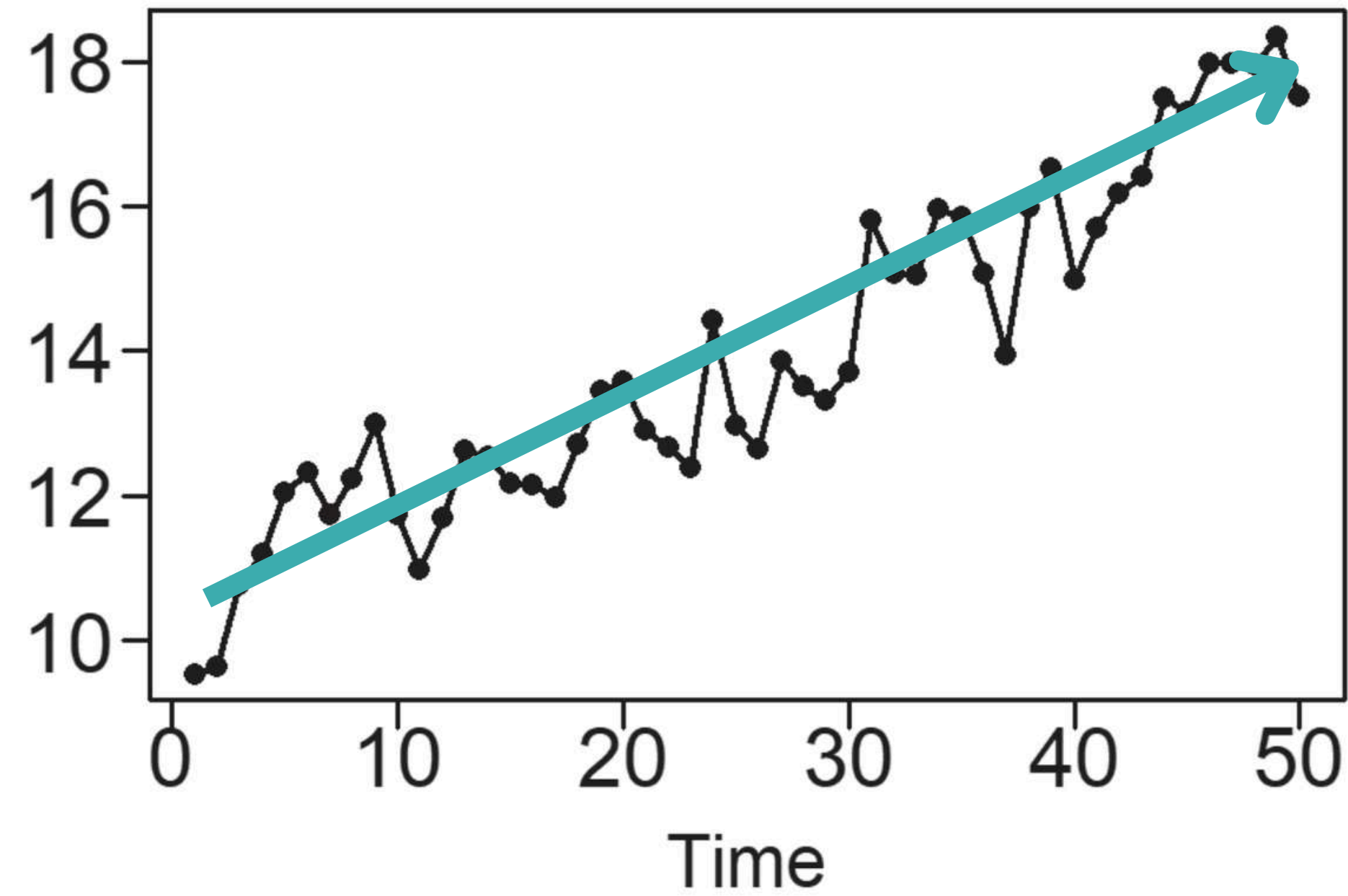




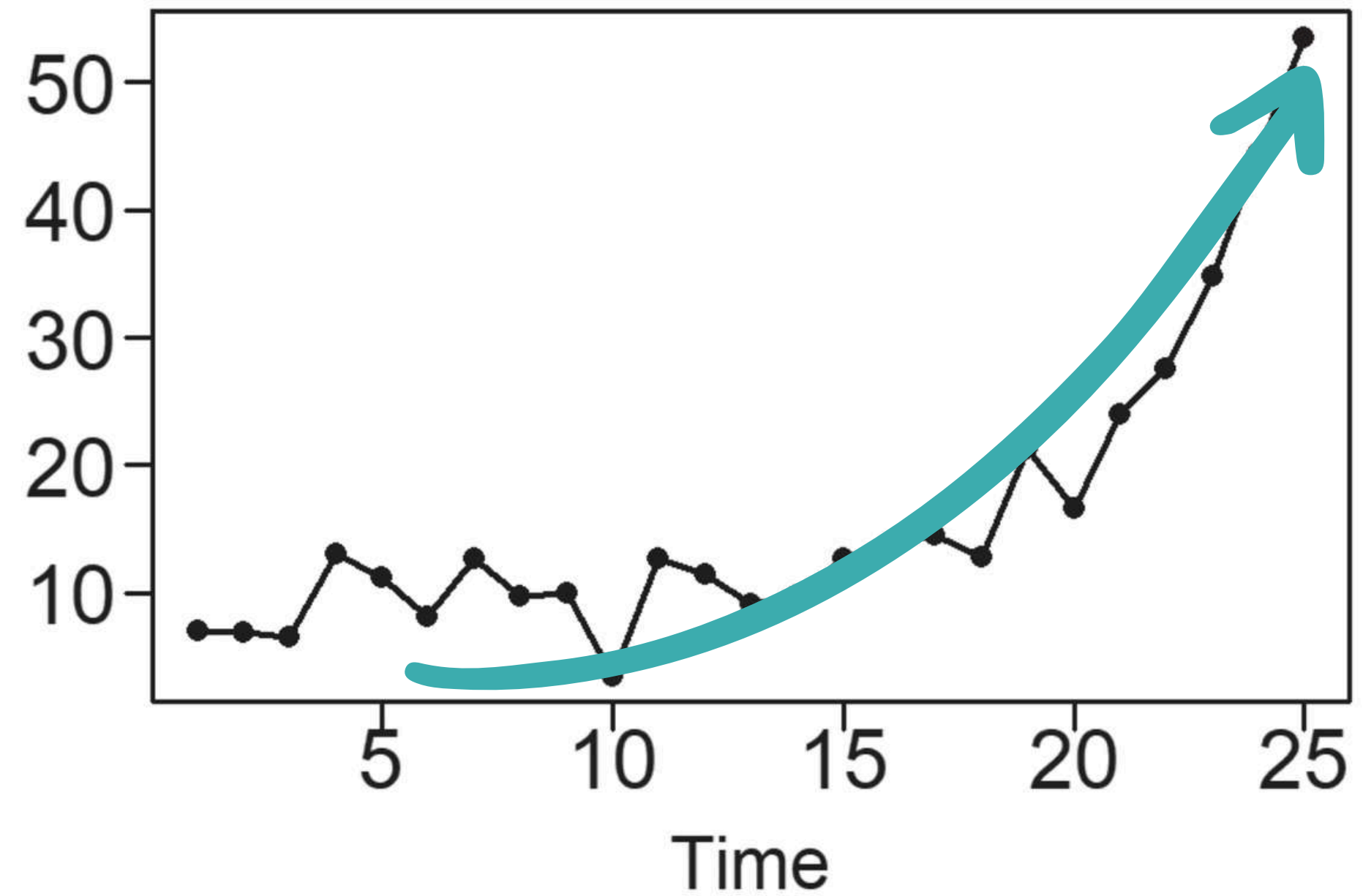
(a) Linear Trend



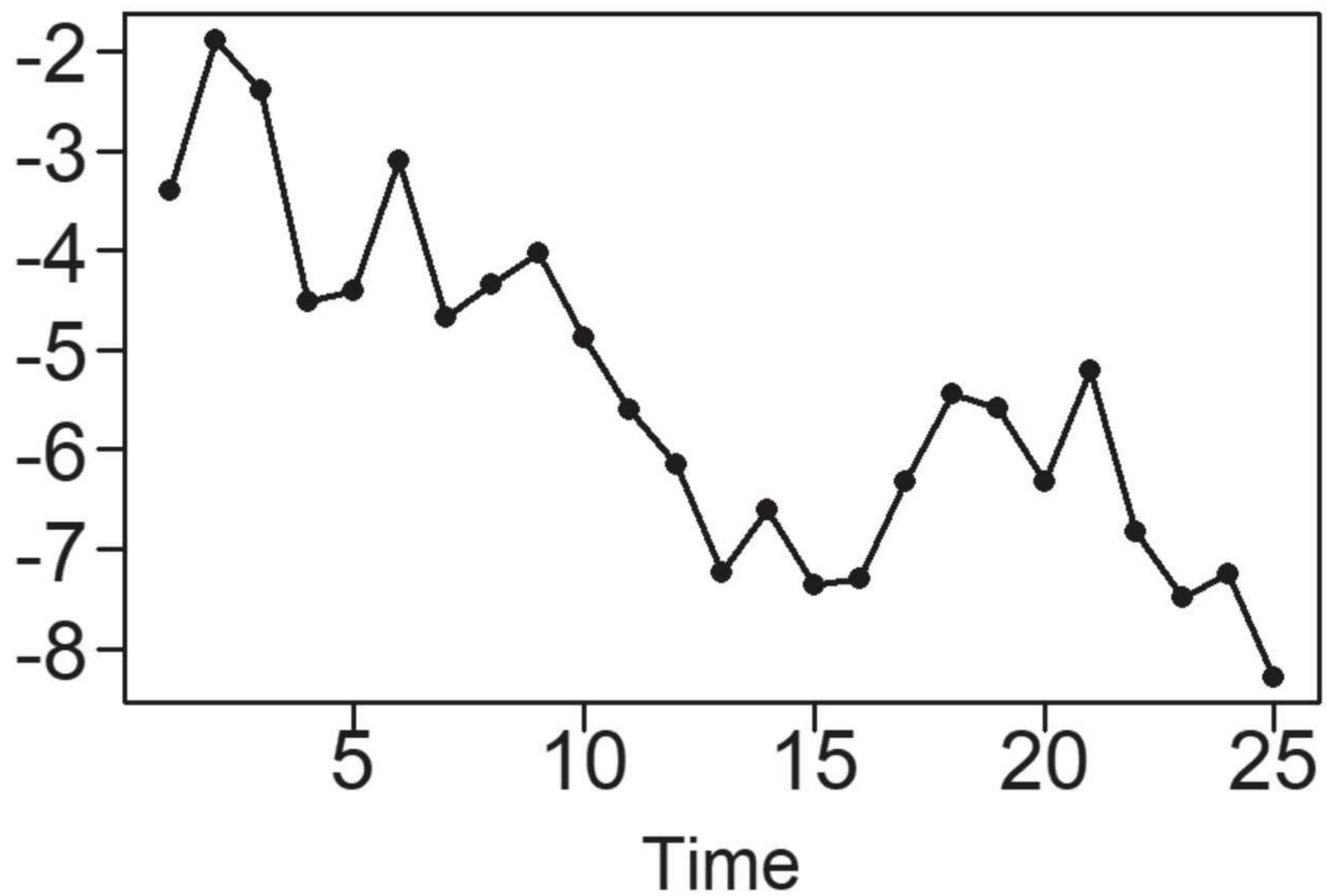
(b) Exponential Trend



(a) Linear Trend

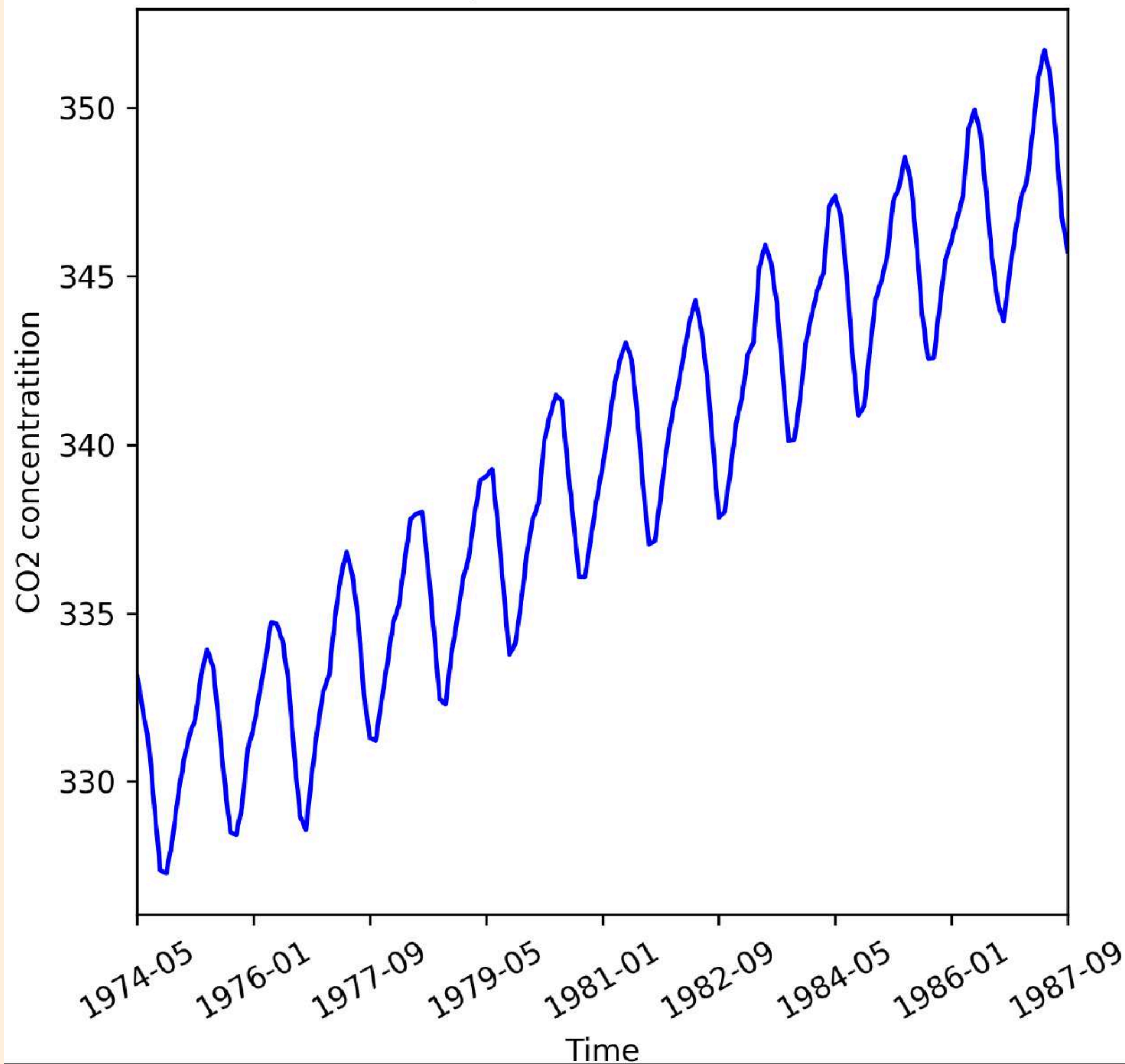


(b) Exponential Trend



(c) Downward Trend

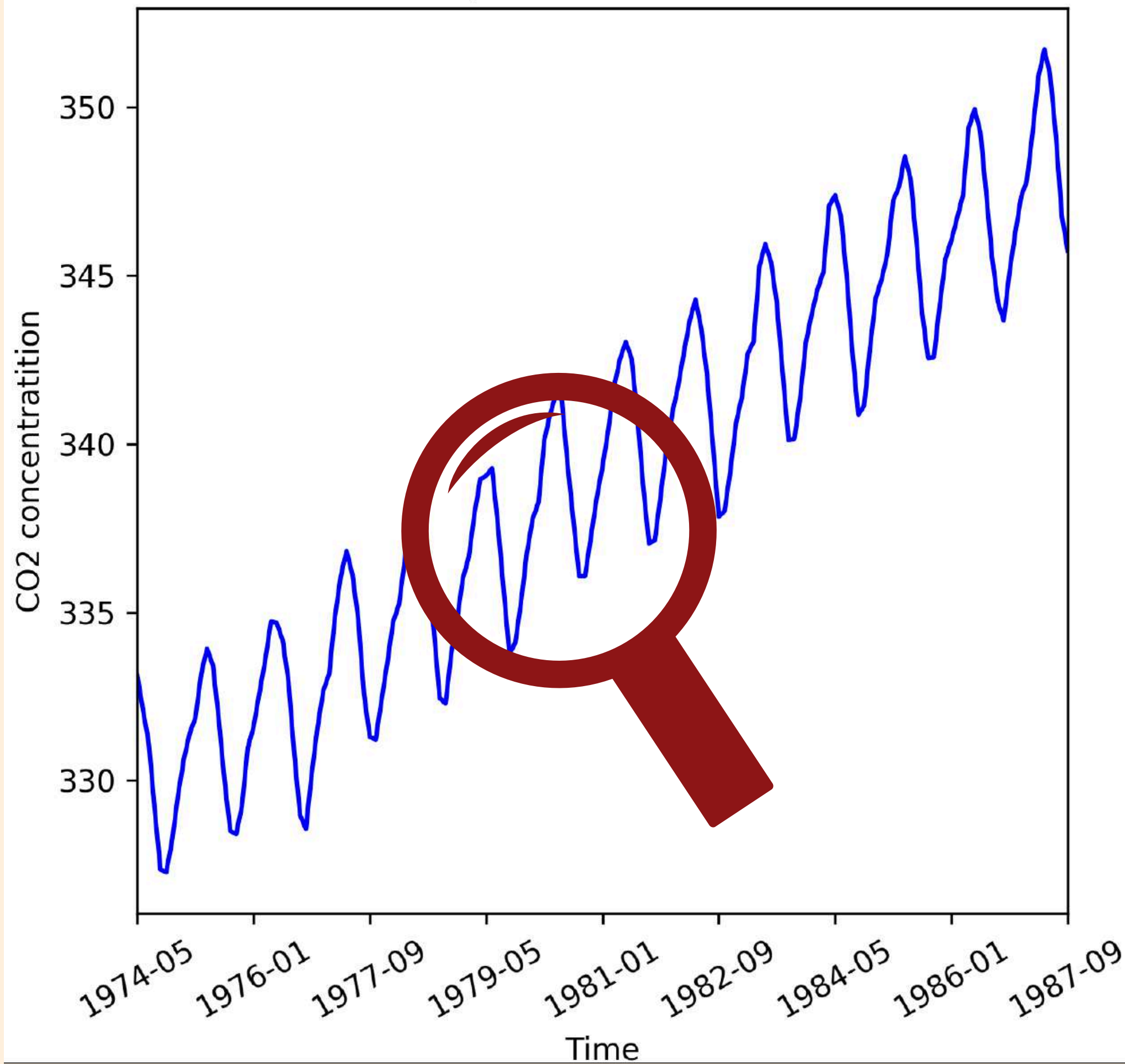
Monthly CO2 concentrations



***#2474***

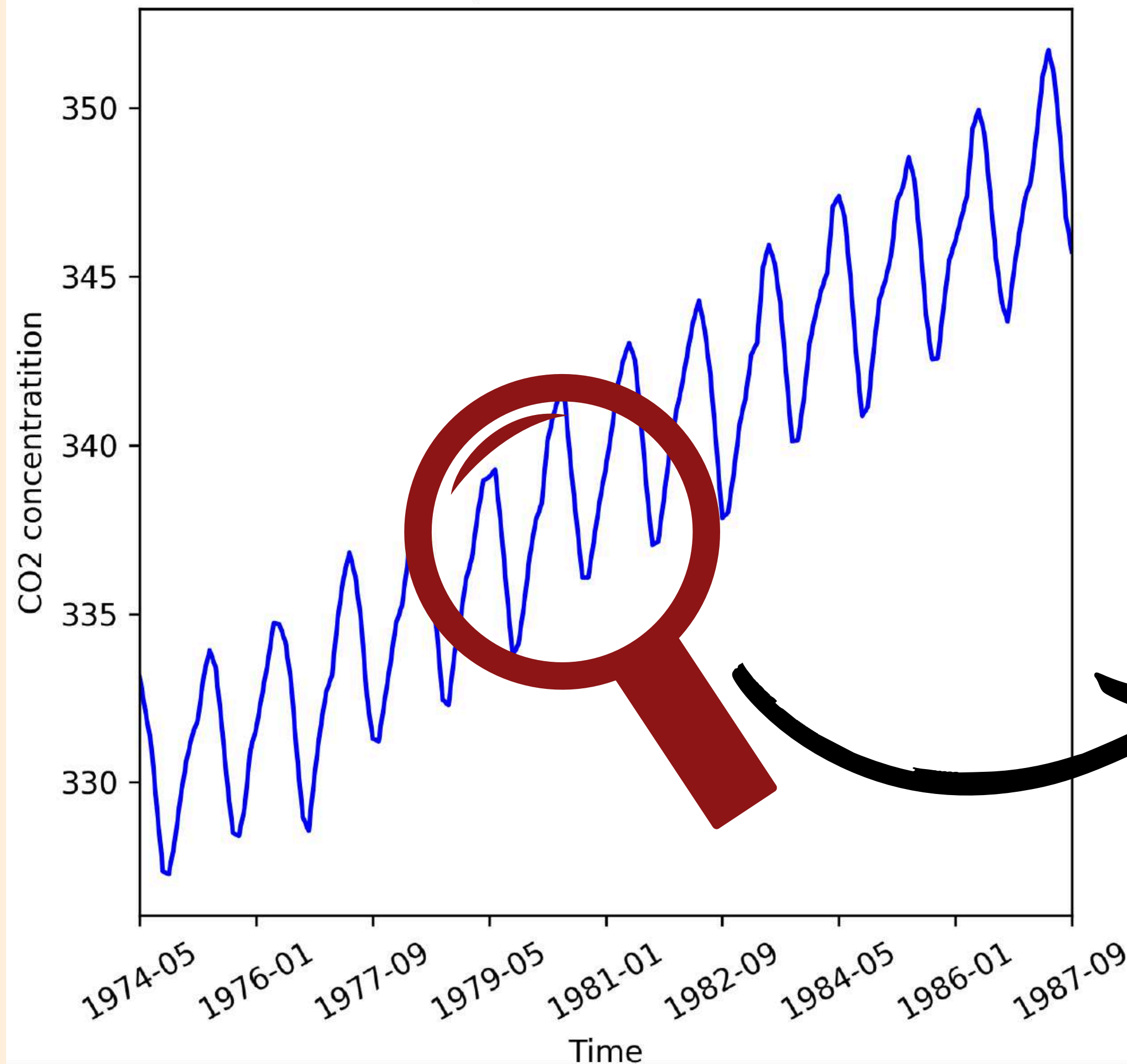


Monthly CO2 concentrations

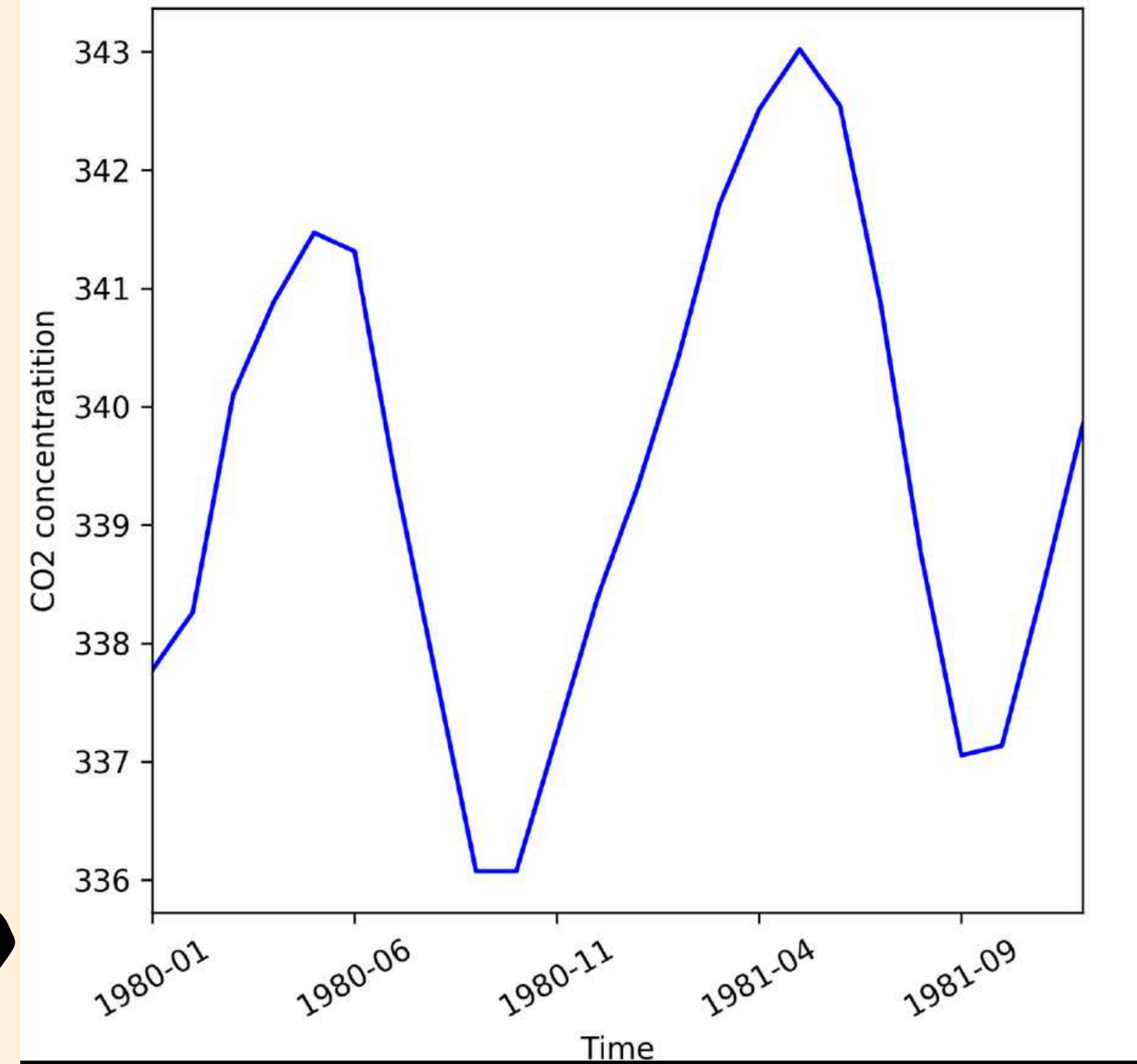




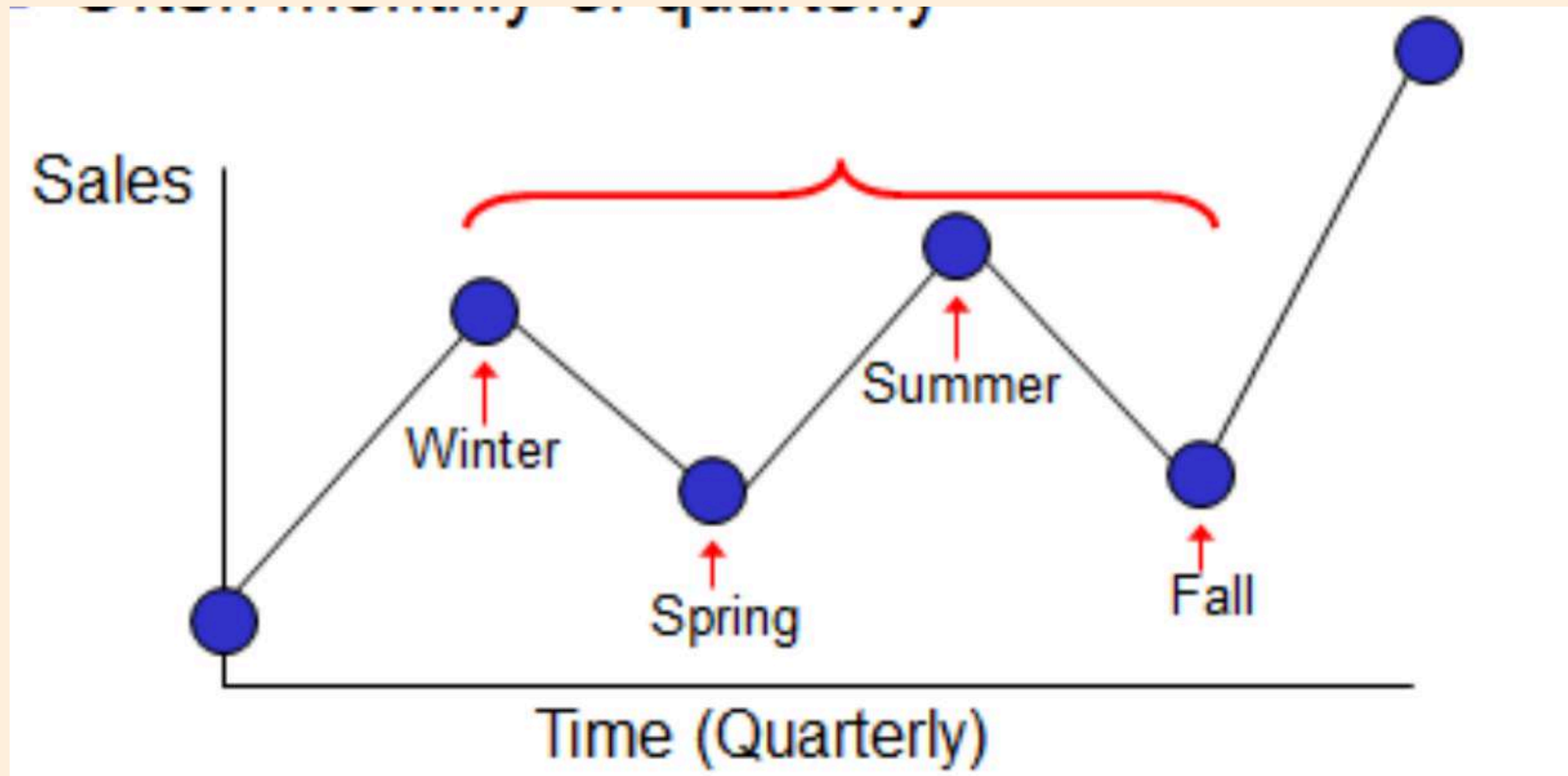
Monthly CO2 concentrations

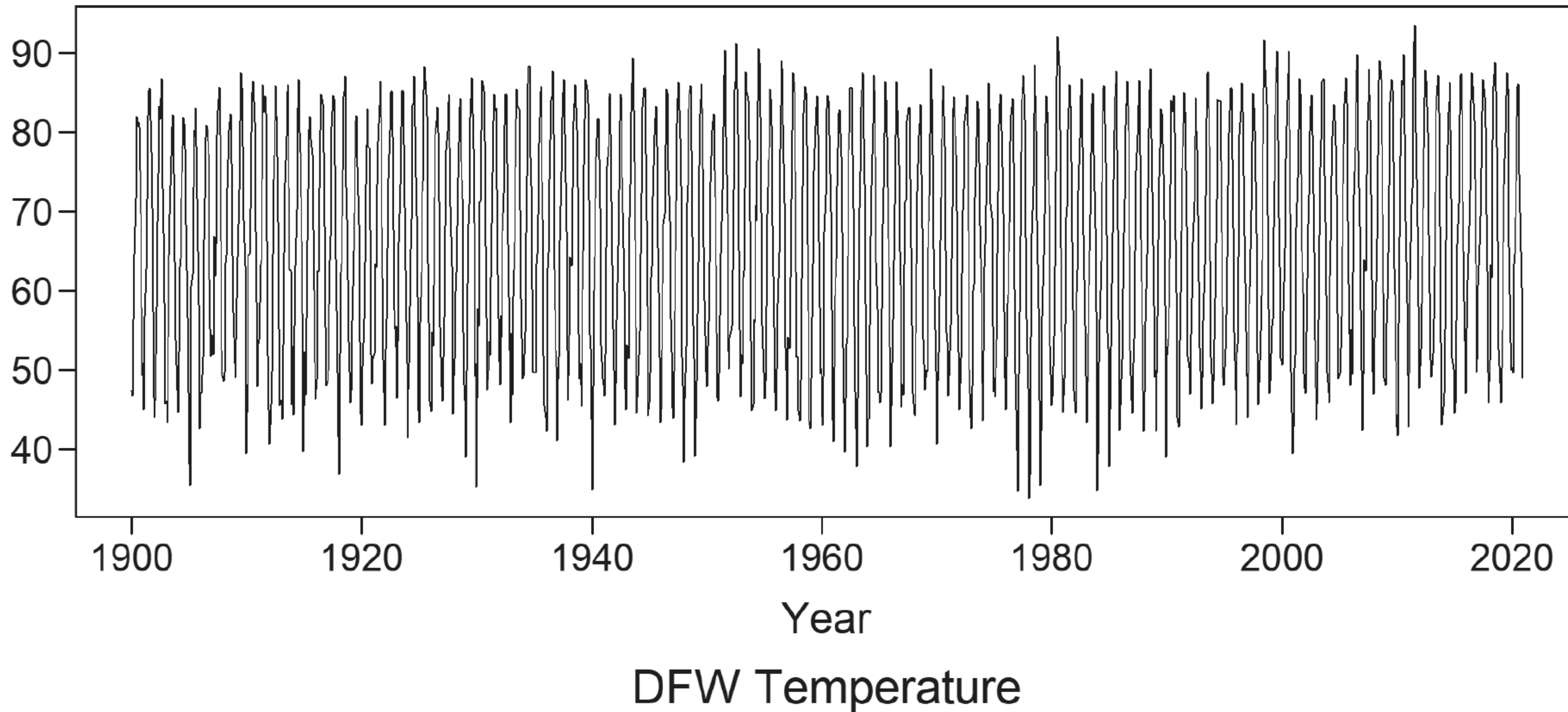


Monthly CO2 concentrations

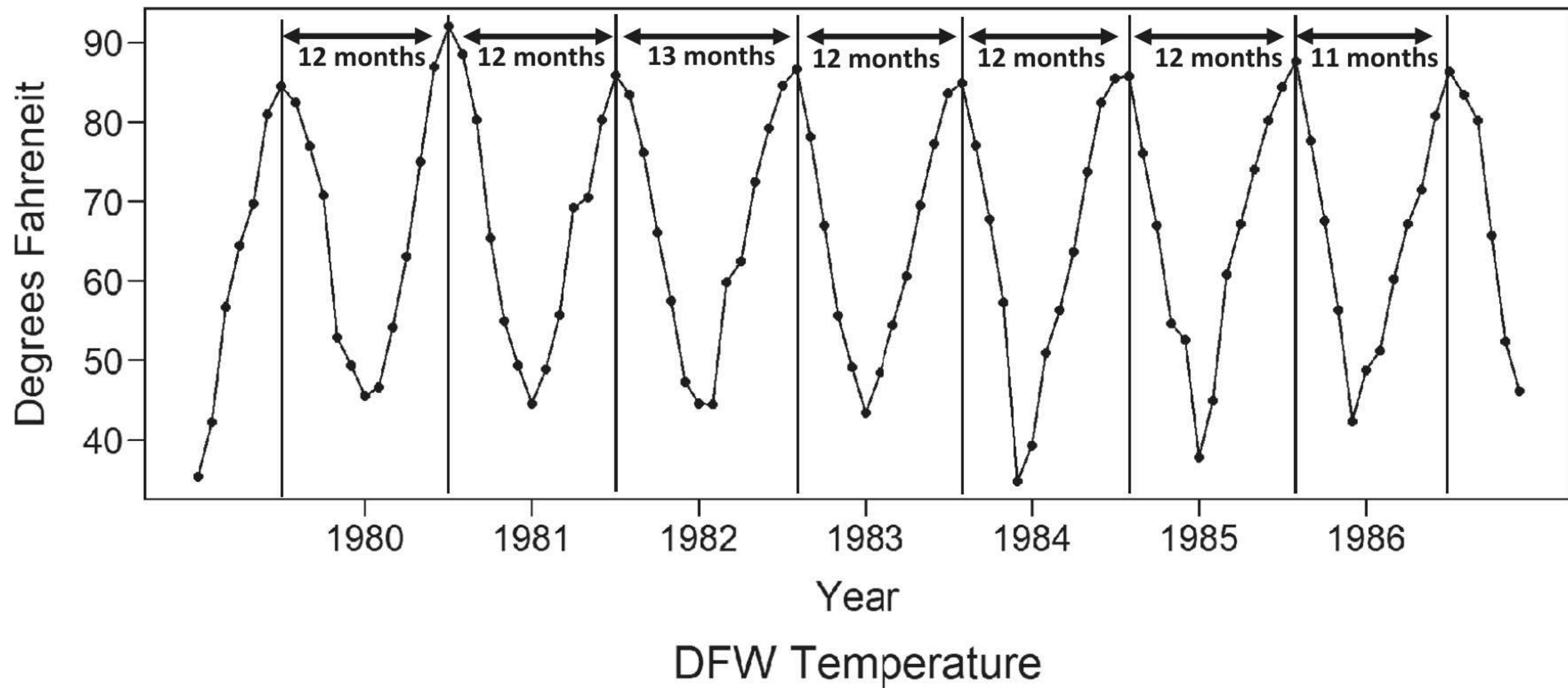


# Seasonality

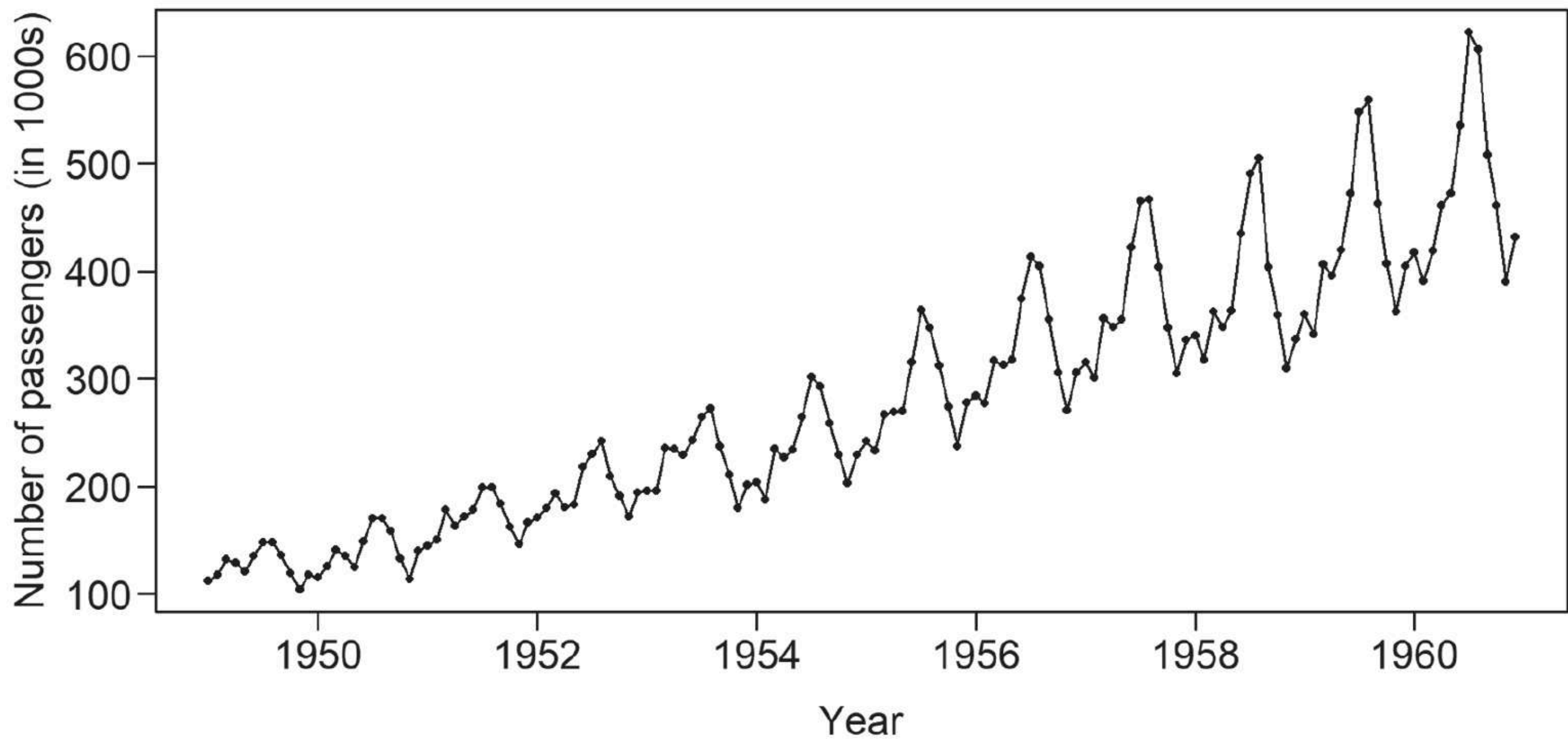




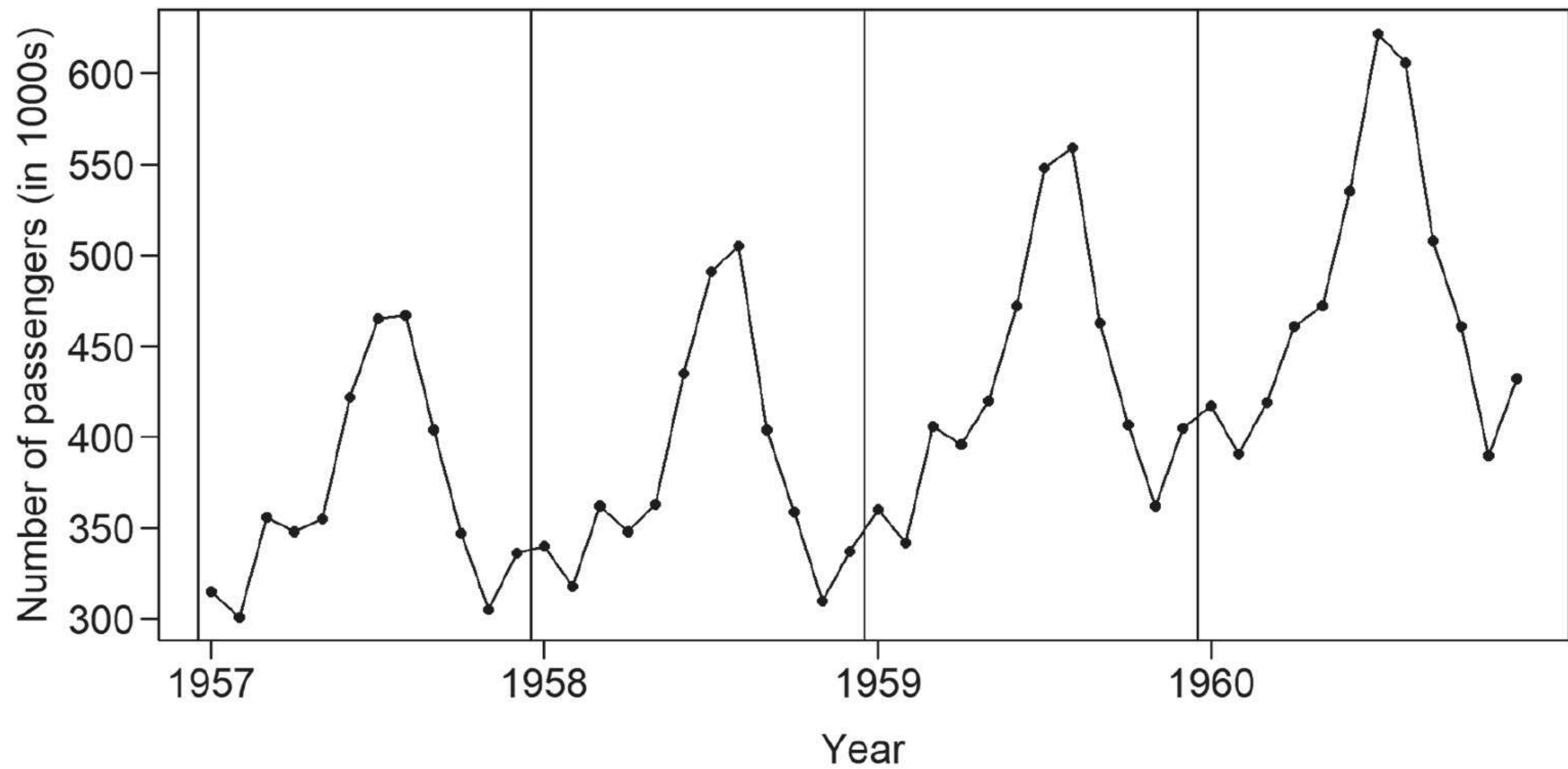
**average monthly temperature for Dallas-Ft. Worth (DFW)**



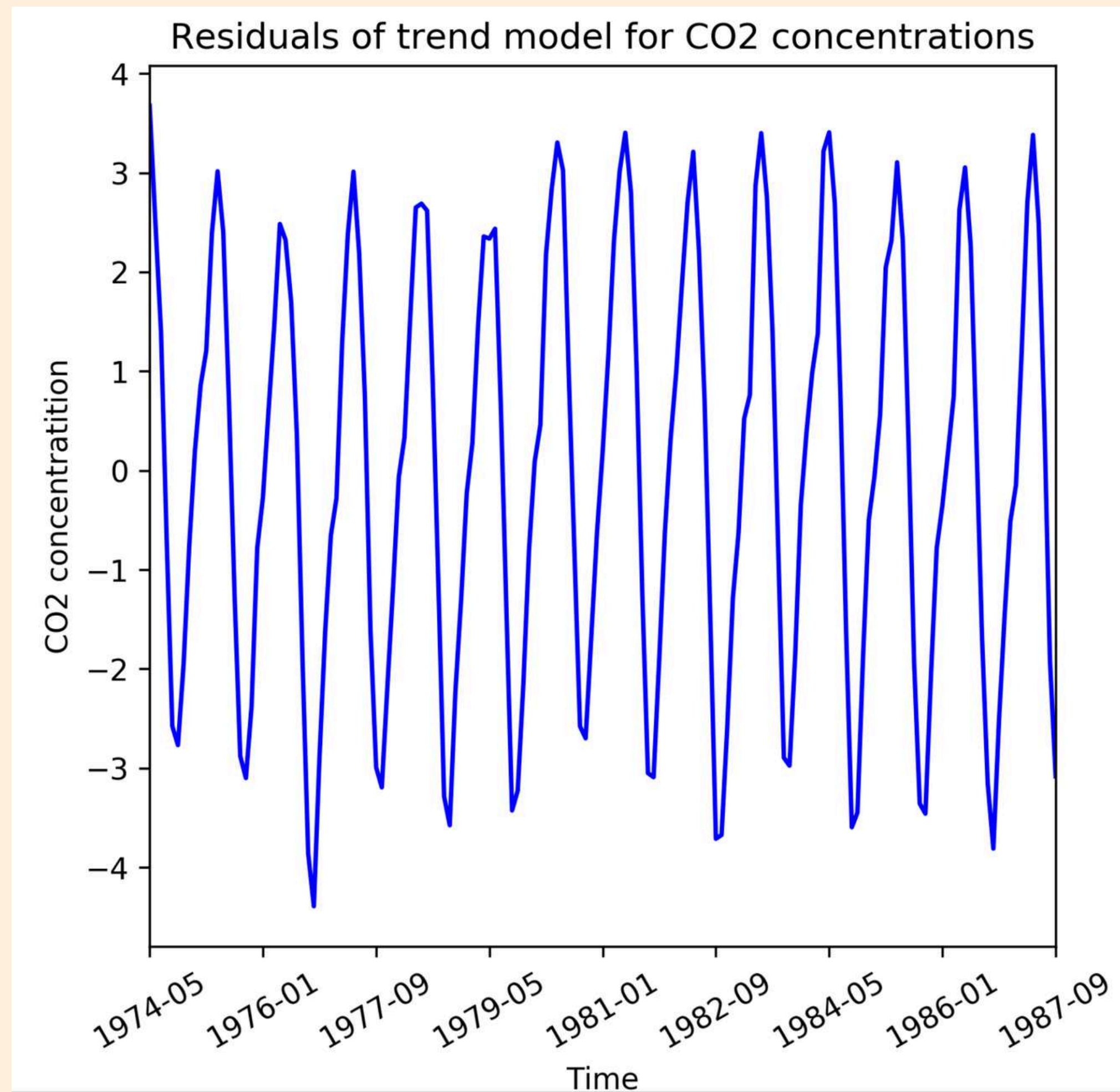


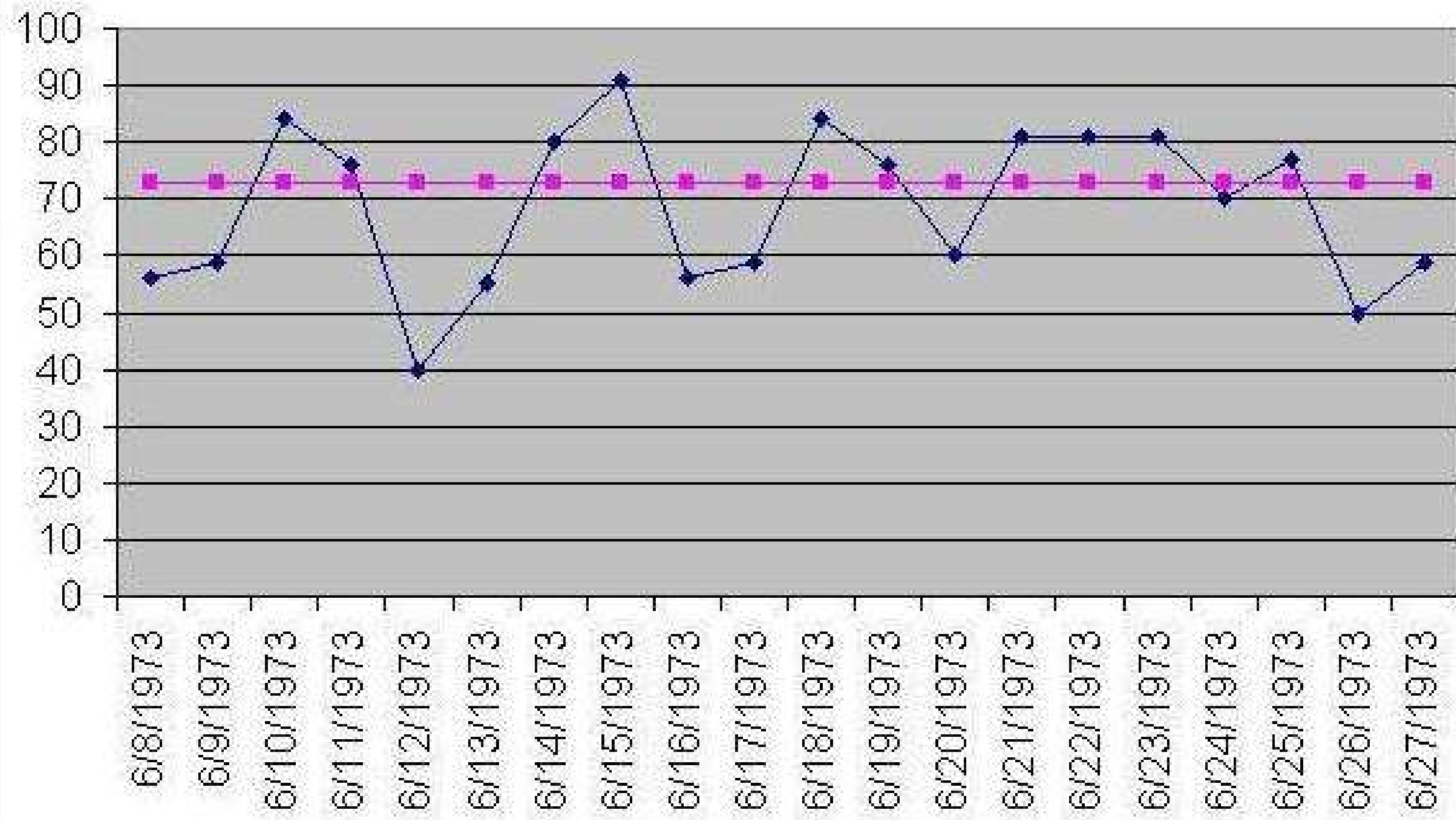


AirPassengers Data

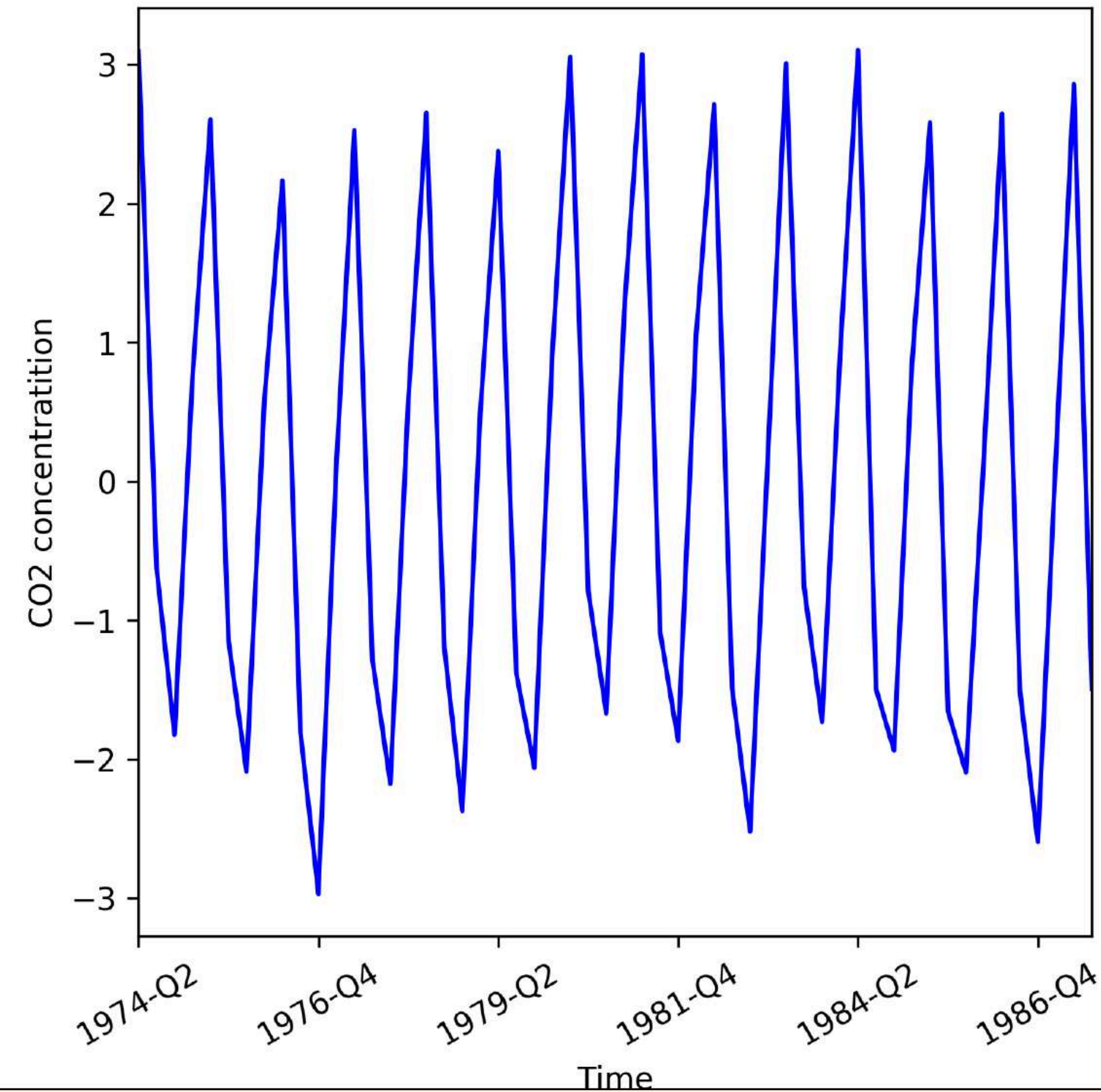




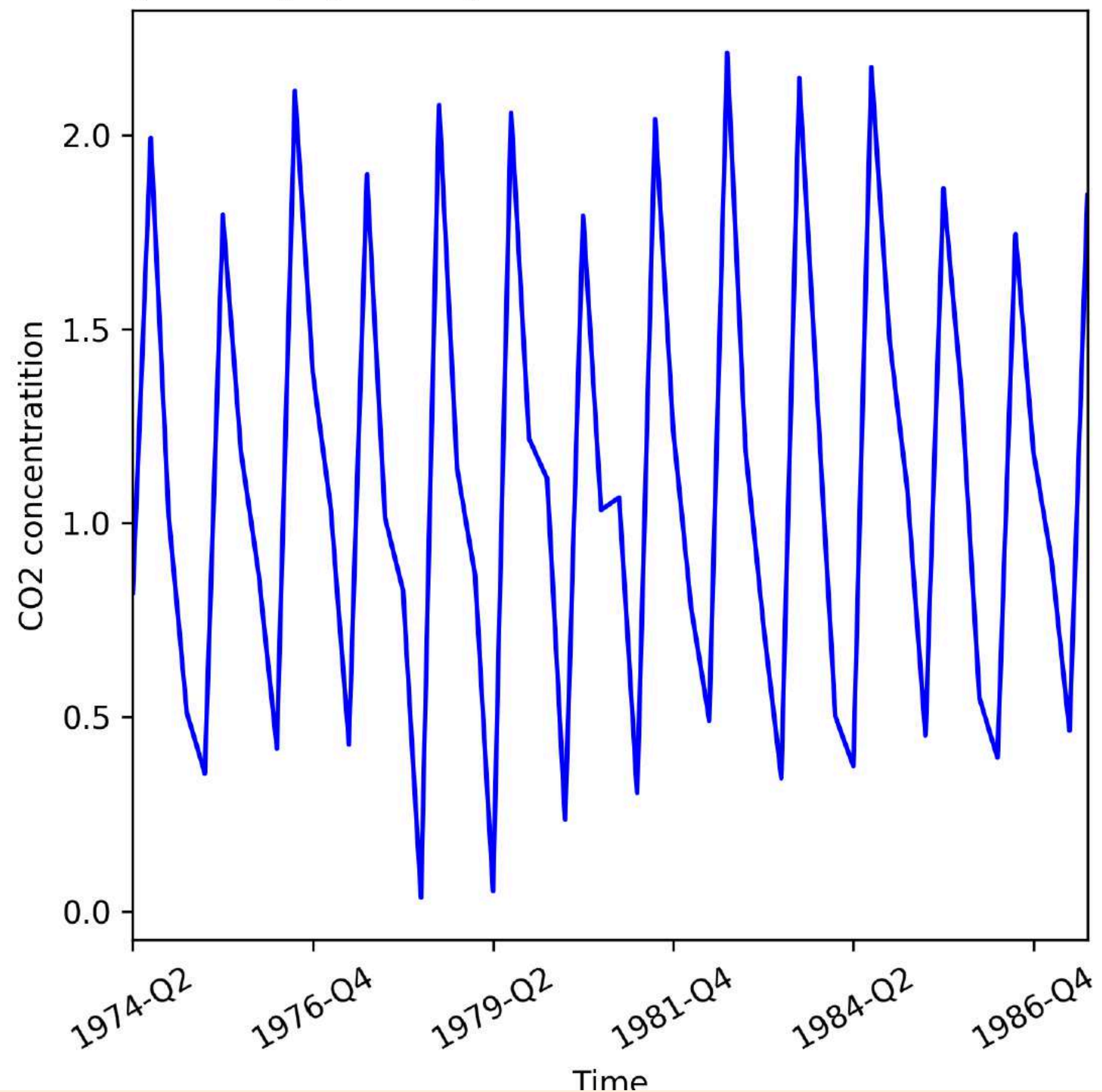




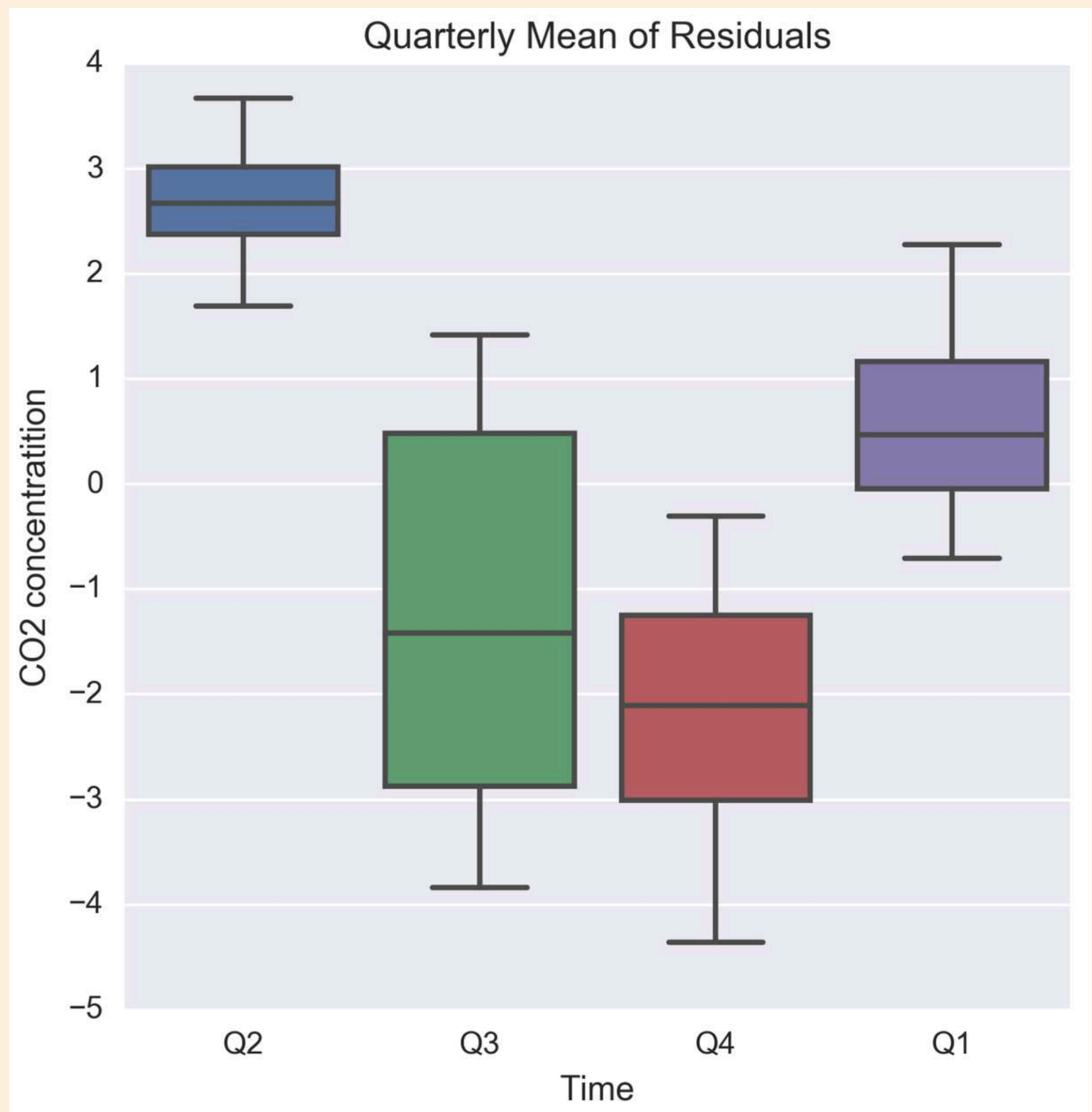
Quarterly Mean of Residuals



Quarterly Quarterly Standard Deviation of Residuals







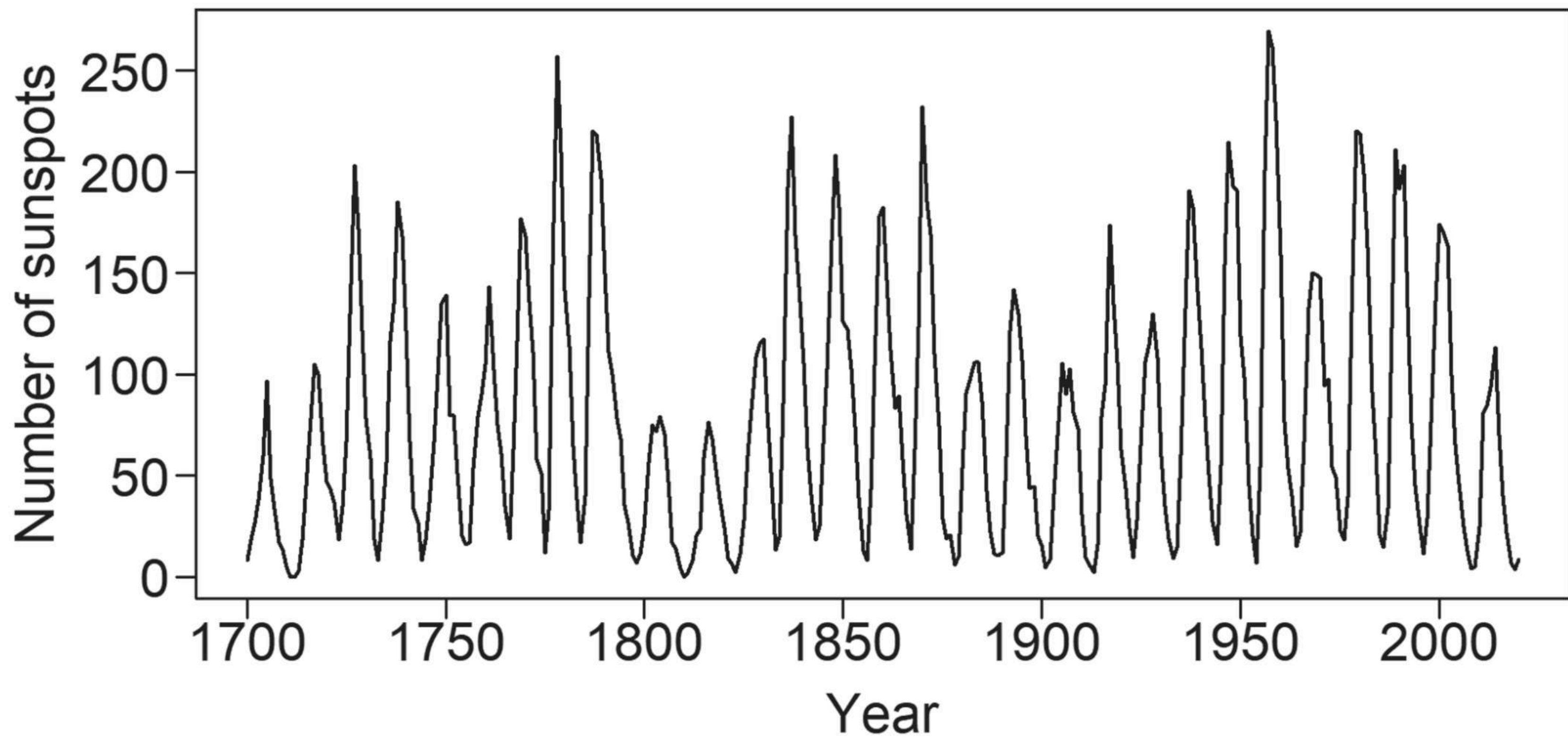
# Cyclical Data

**Generalization of Seasonal Data**

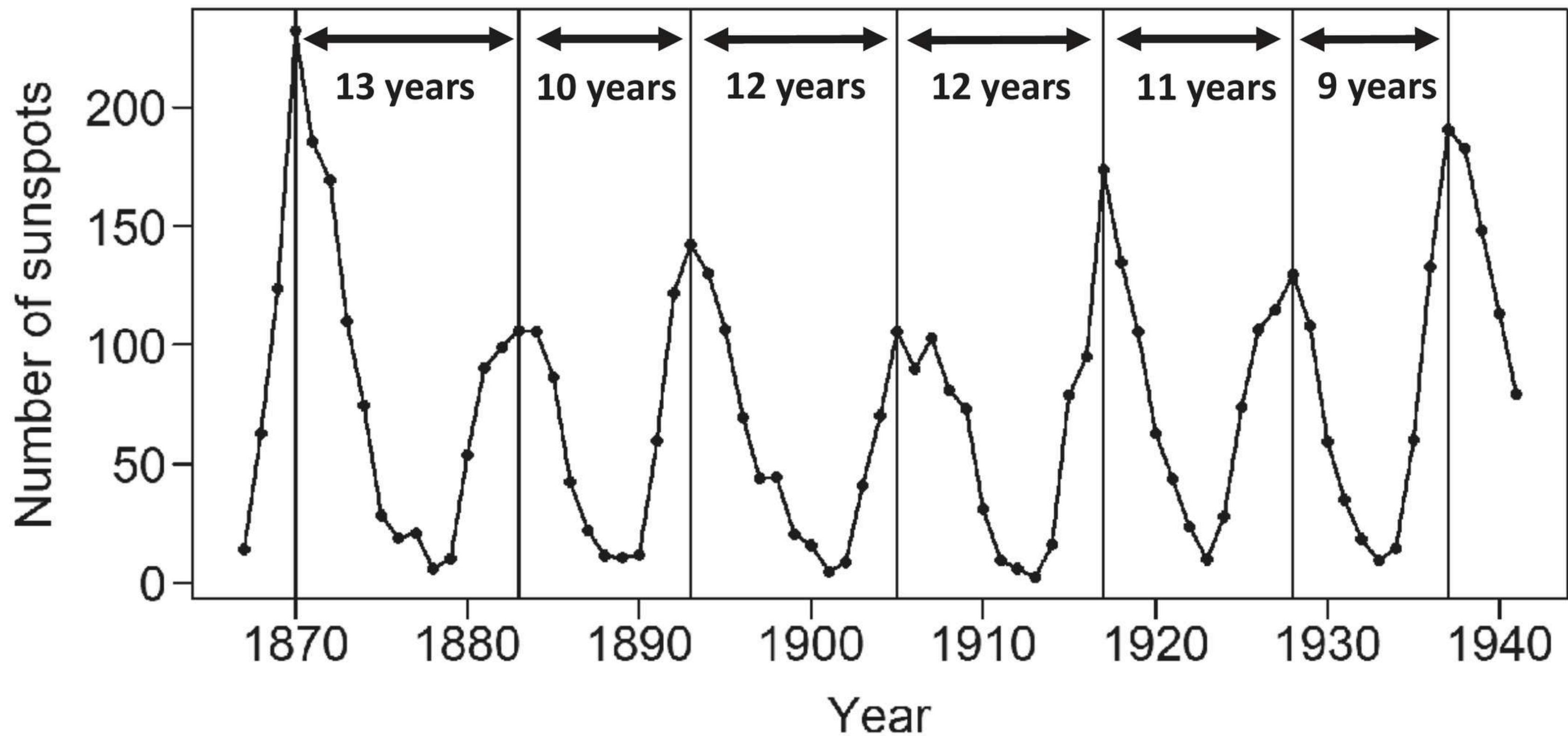
***#3537***





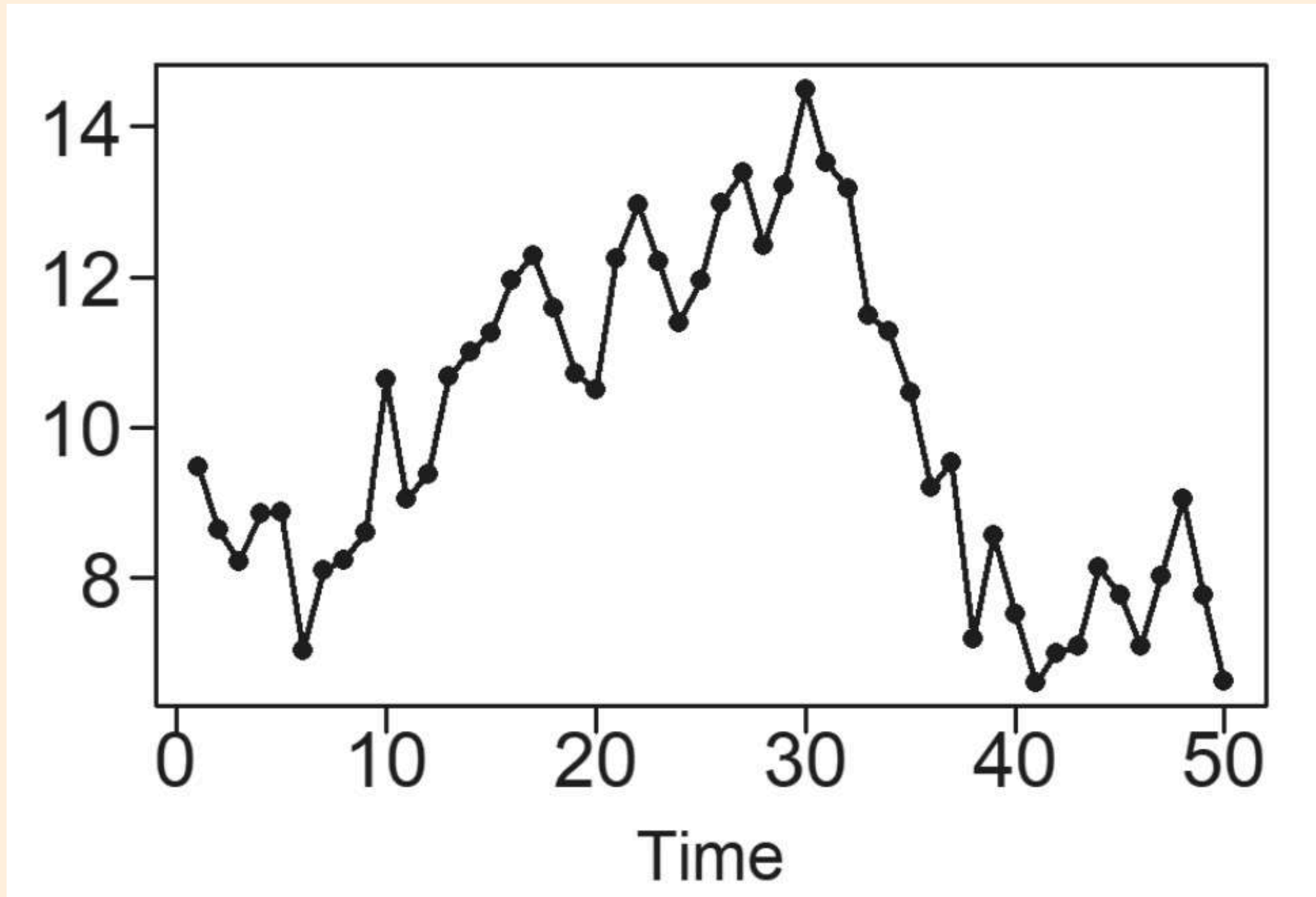


Sunspot2.0 Data



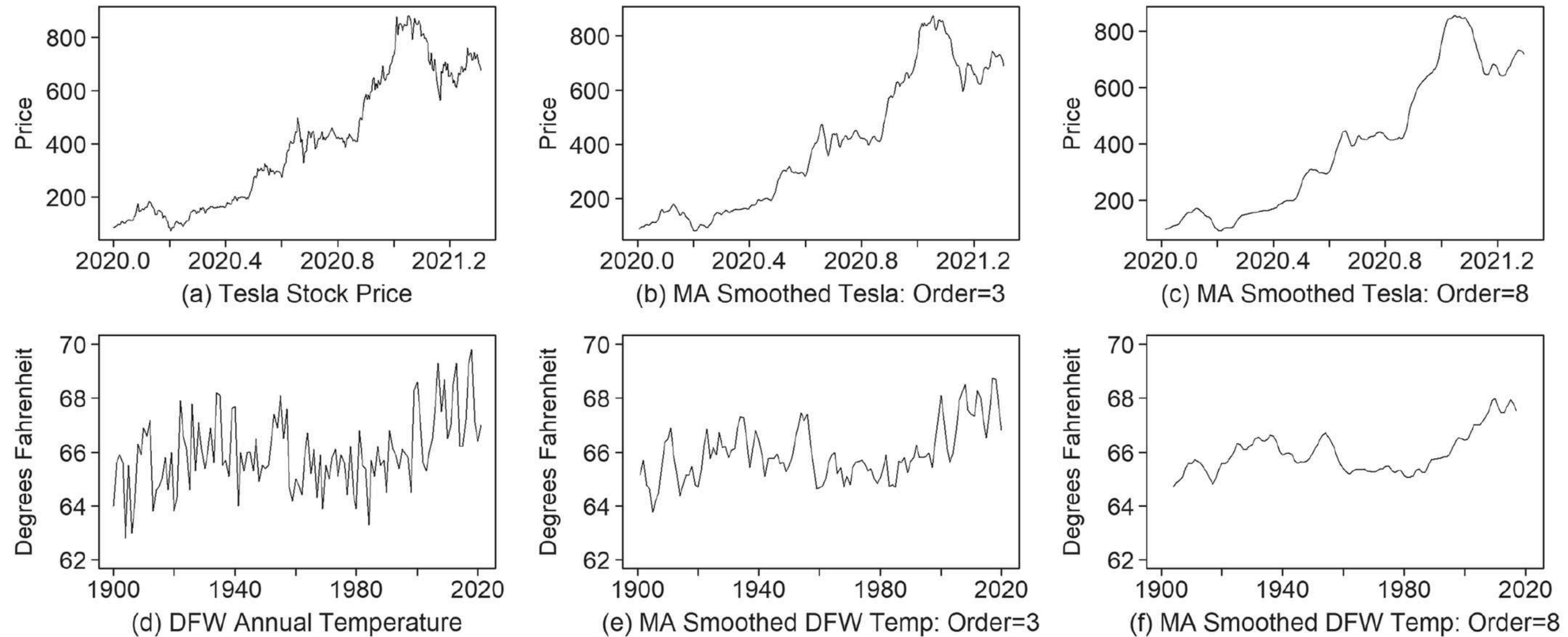
Sunspot2.0 Snippet

# Random Variations



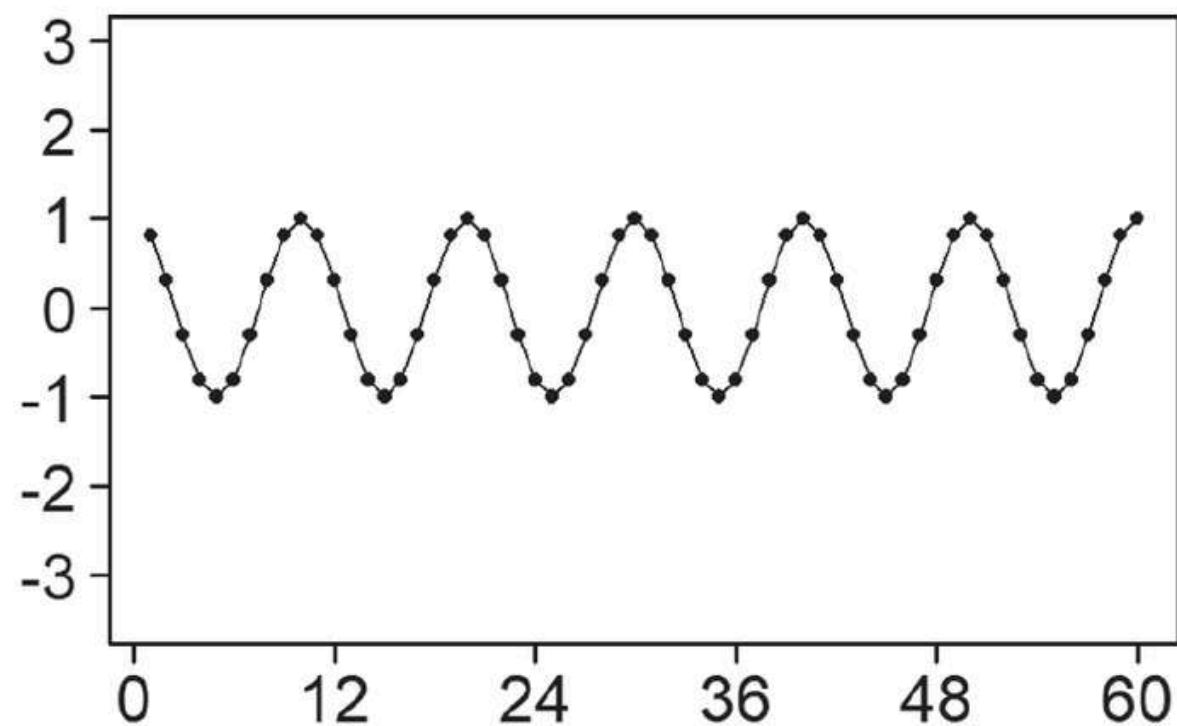
# Smoothing



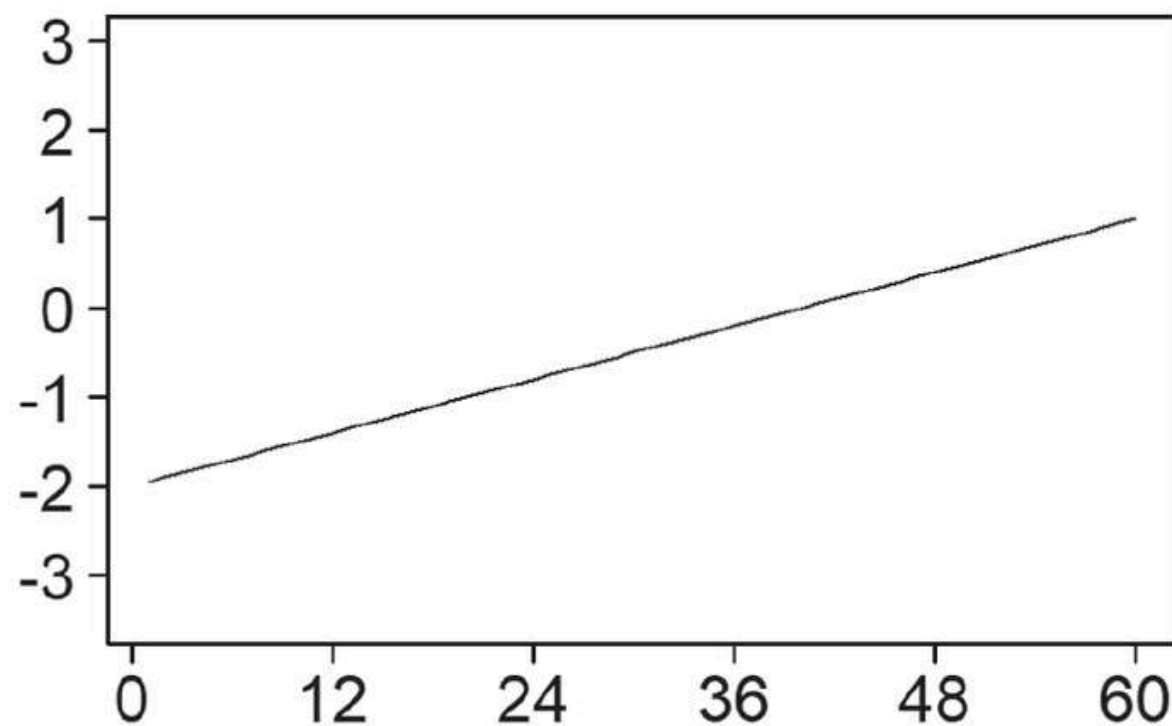


**FIGURE 2.1** (a) Tesla stock prices, (b) and (c) data in (a) after applying 3<sup>rd</sup>- and 8<sup>th</sup>-order moving average smoothers, respectively. (d) DFW annual temperature data, (e) and (f) data in (d) after applying 3<sup>rd</sup>- and 8<sup>th</sup>-order moving average smoothers, respectively.

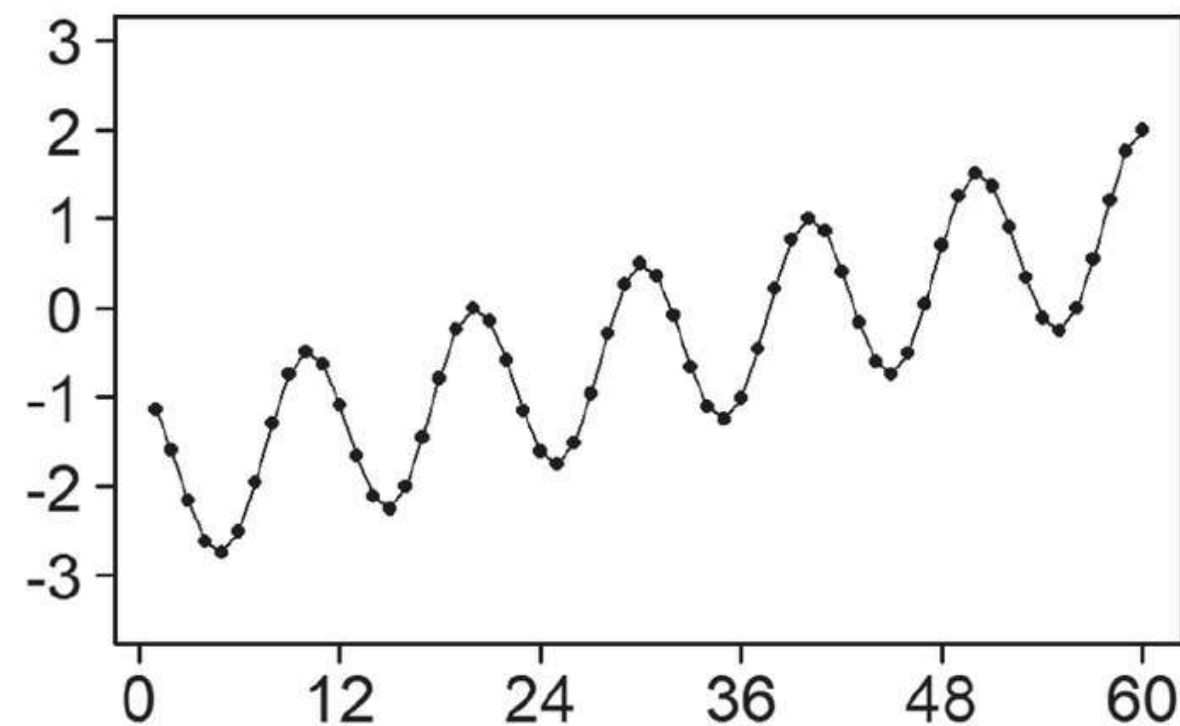




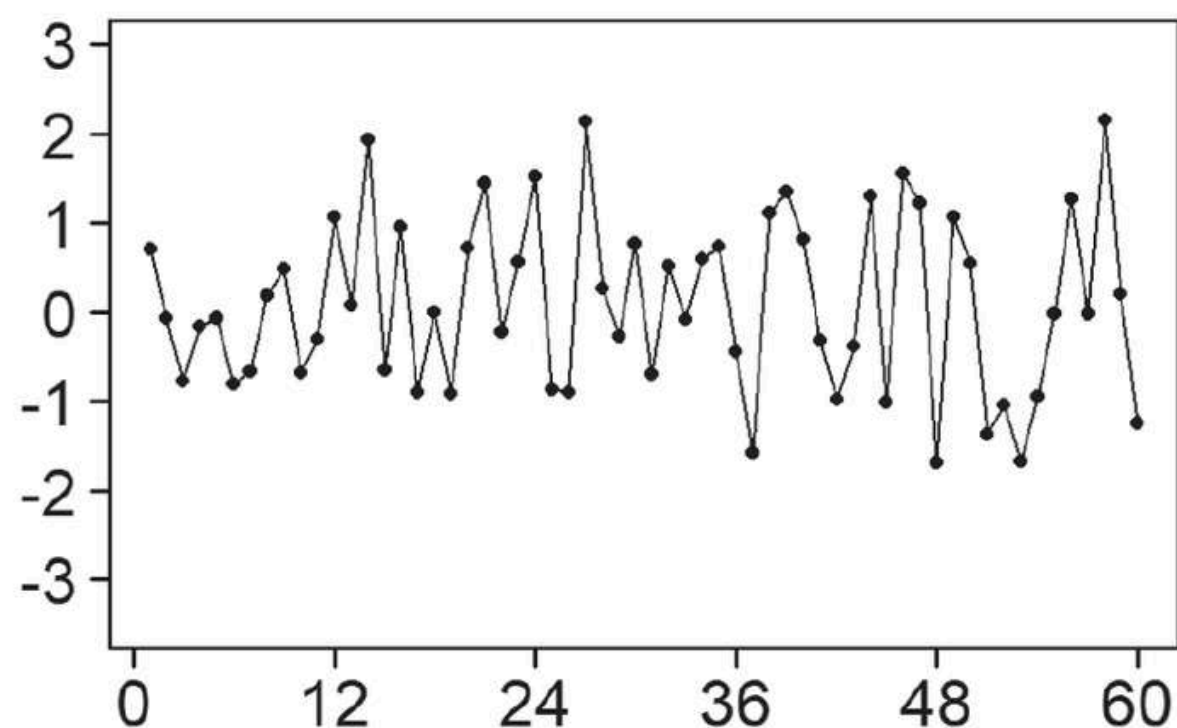
(a) Cosine with period 10



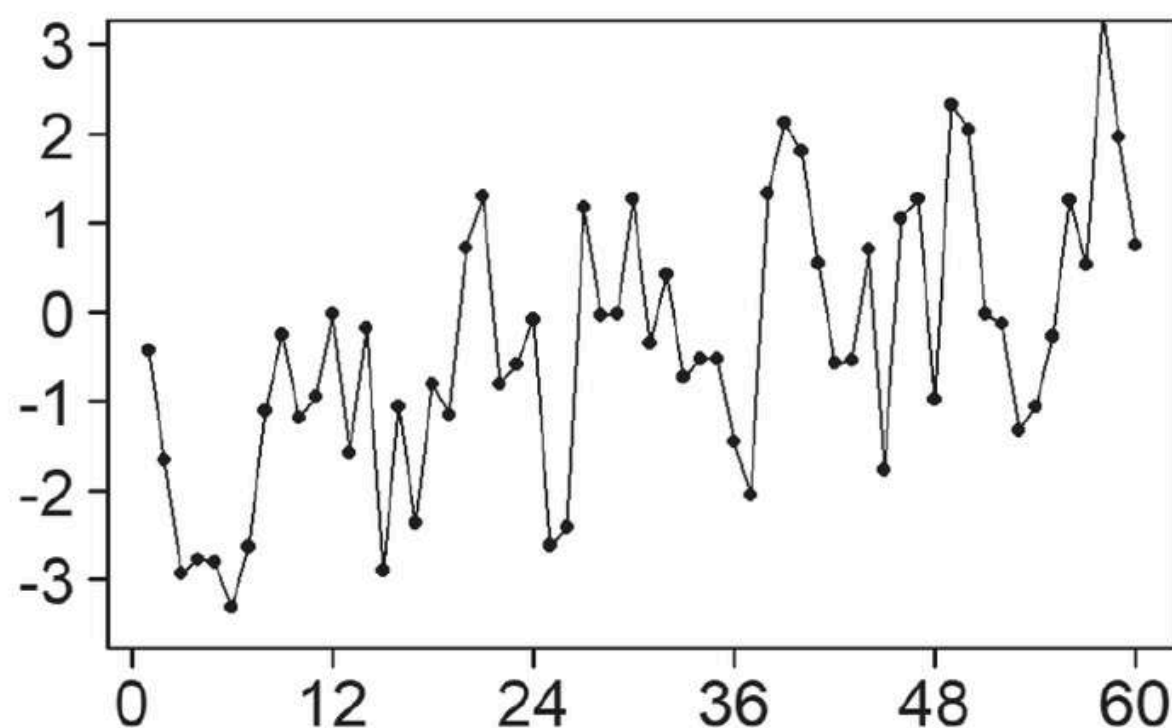
(b) Trend Line



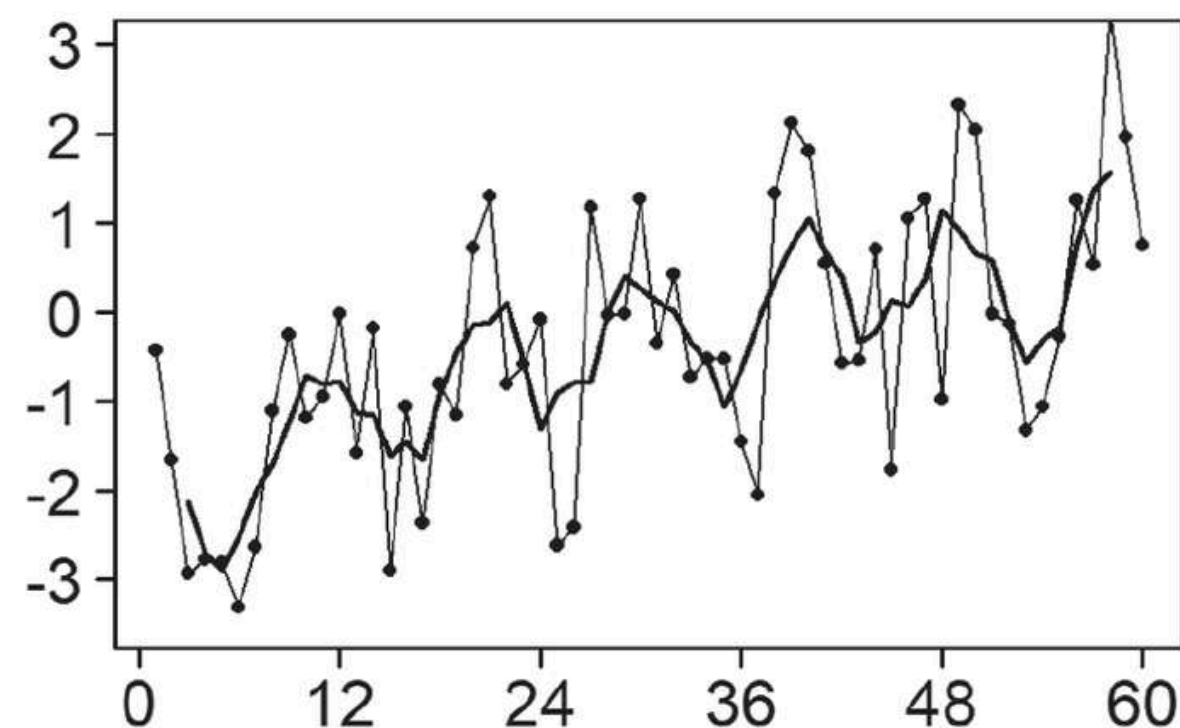
(c) The Signal: Cosine+Trend Line



(d) Noise



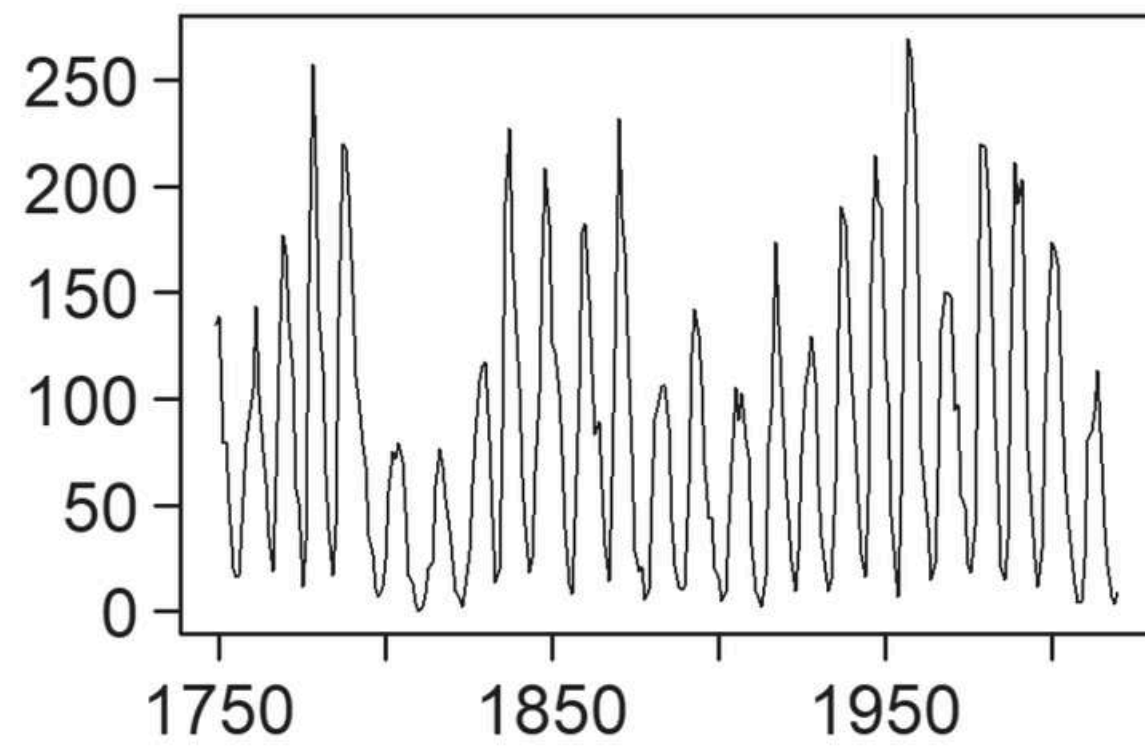
(e) Observed Data: Signal+Noise



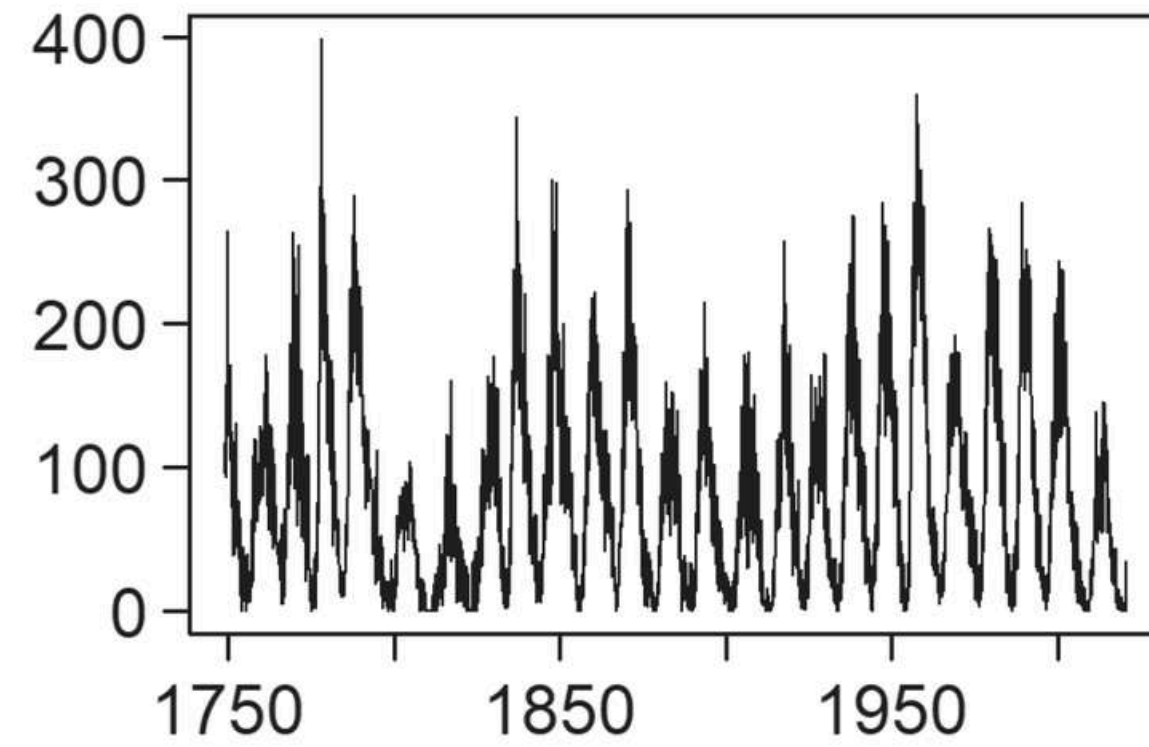
(f) MA Smoother, Order=5

**FIGURE 2.2** (a) Cosine curve with period 10, (b) the trend line, (c) cosine+line (the underlying signal), (d) the noise component, (e) signal+noise (the observed data), and (f) observed data in (e) with fifth order smoothing.

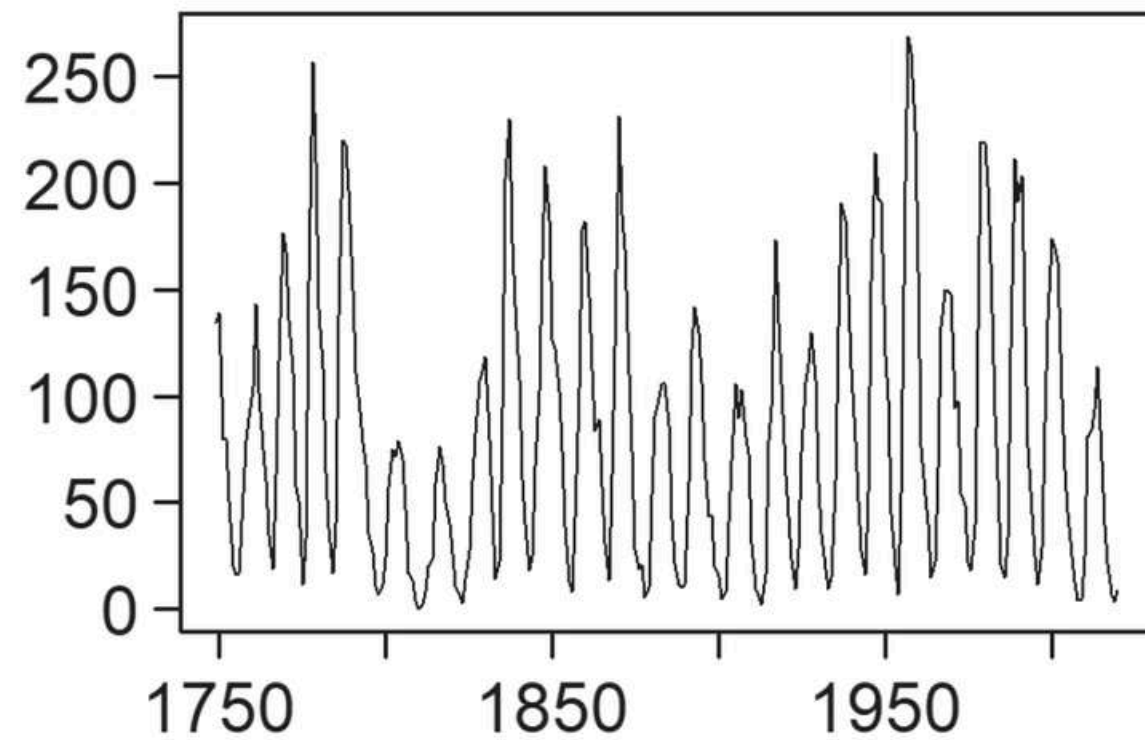




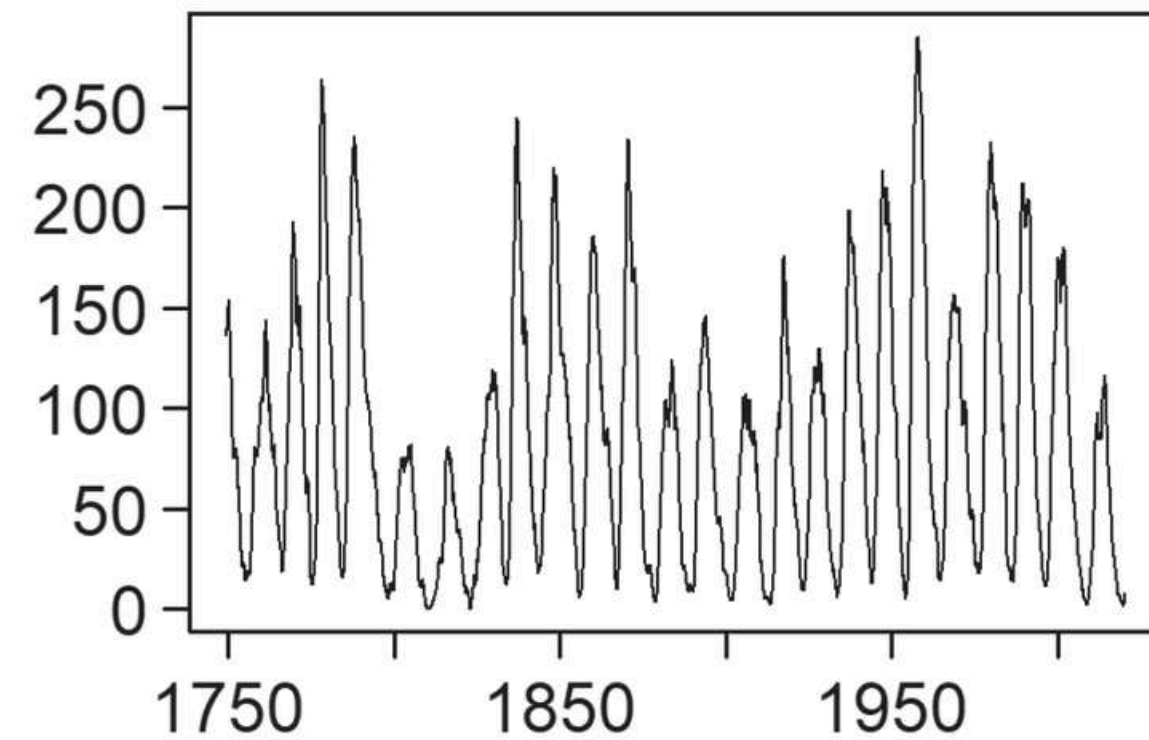
(a) Annual Sunspot2.0 Data



(b) Monthly Data

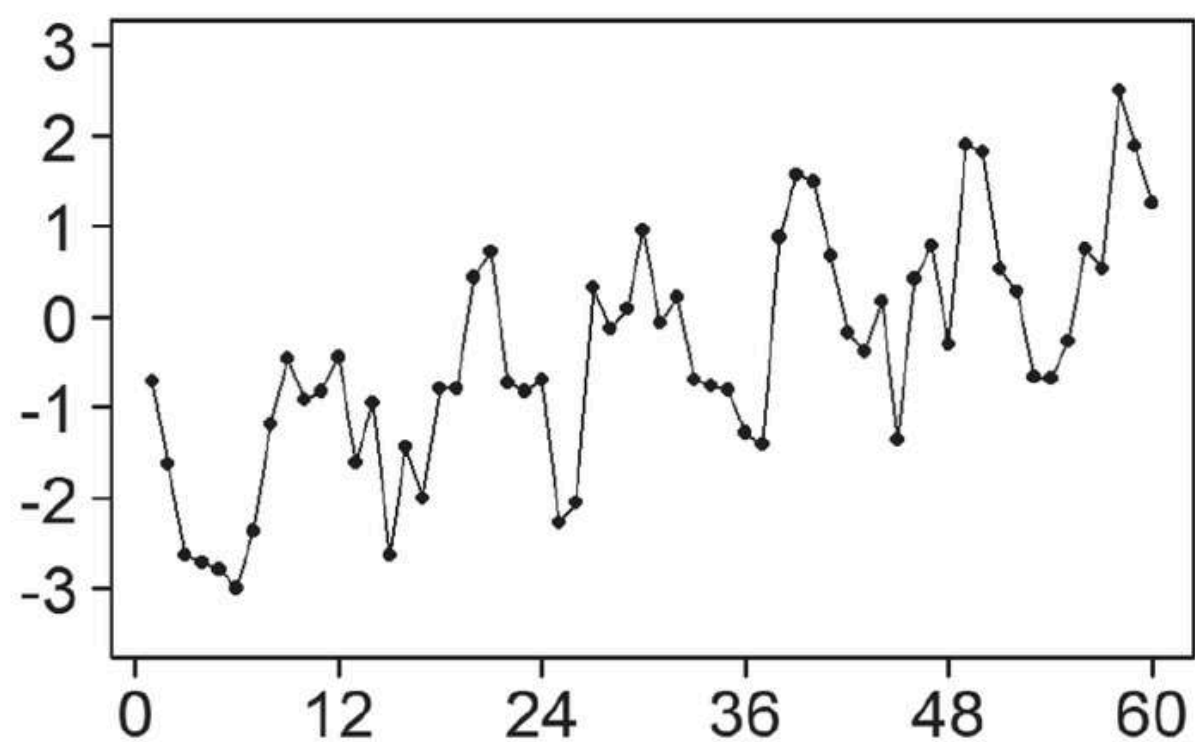


(c) Aggregated Monthly Data

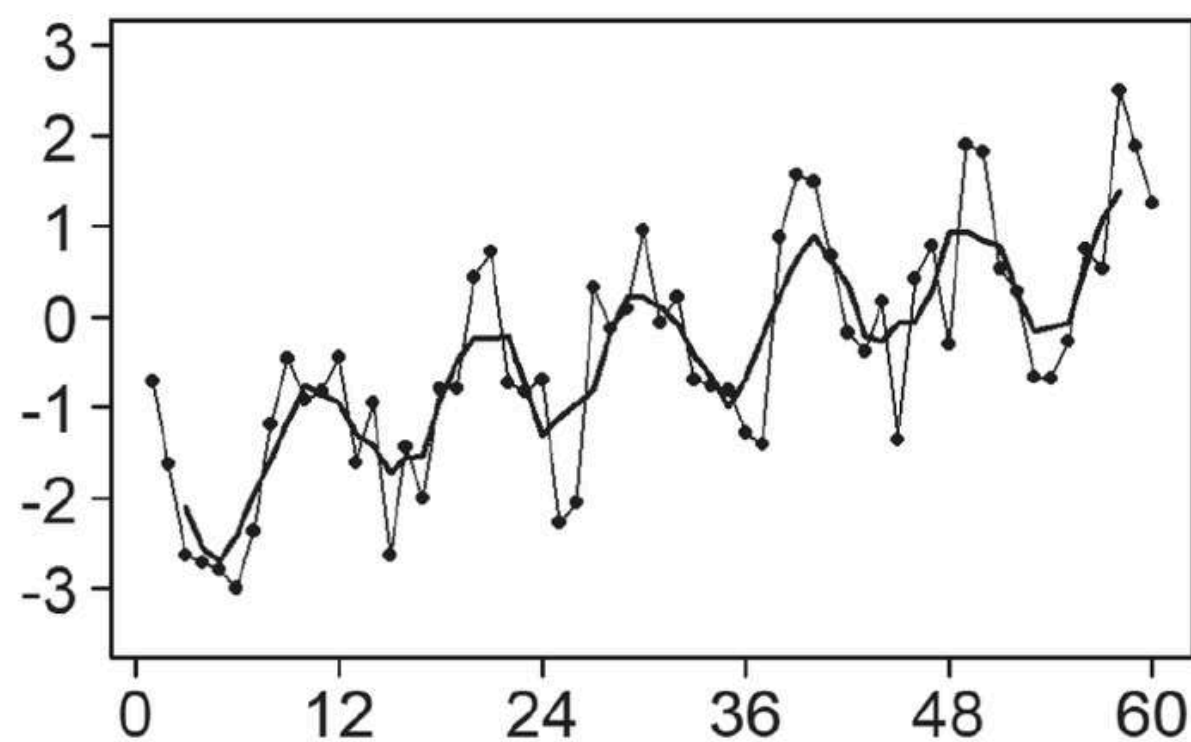


(d) Smoothed Monthly Data

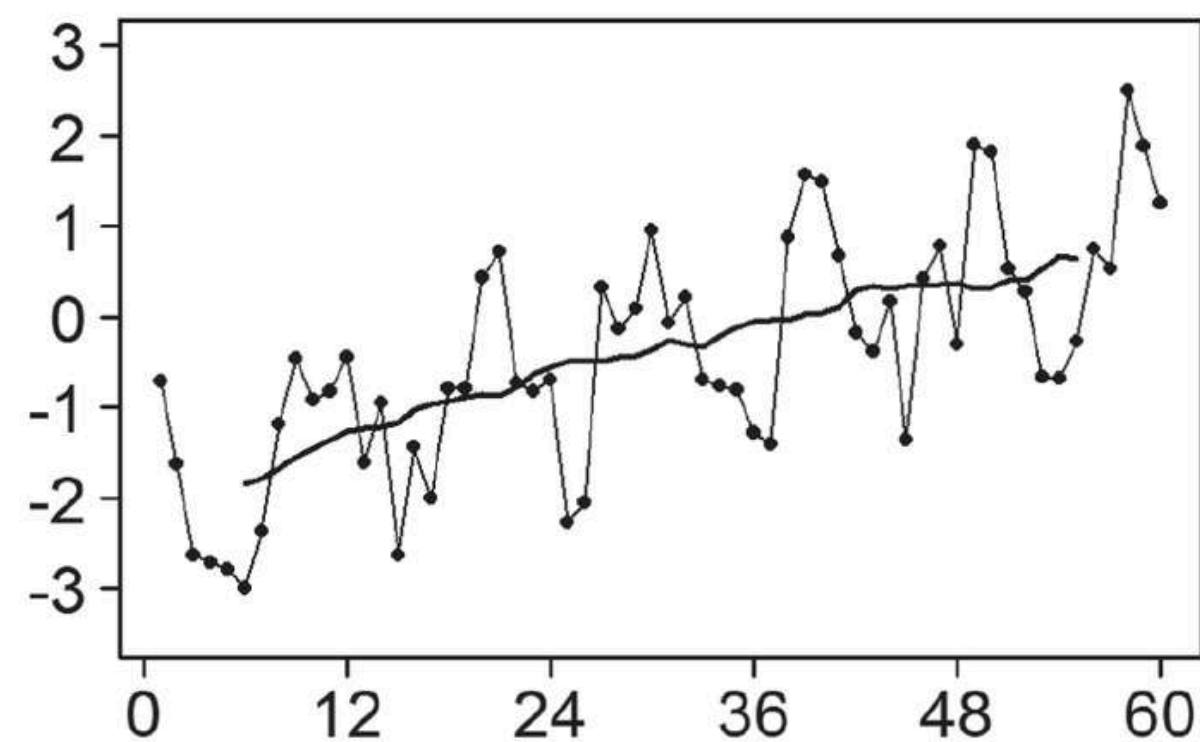
**FIGURE 2.3** (a) Annual sunspot data for the years 1749–2020, (b) monthly data for the same time period, (c) annual data obtained by aggregating the monthly data, (d) smoothed monthly data using a 12<sup>th</sup>-order moving average smoother.



(a) Observed Data: Signal+Noise

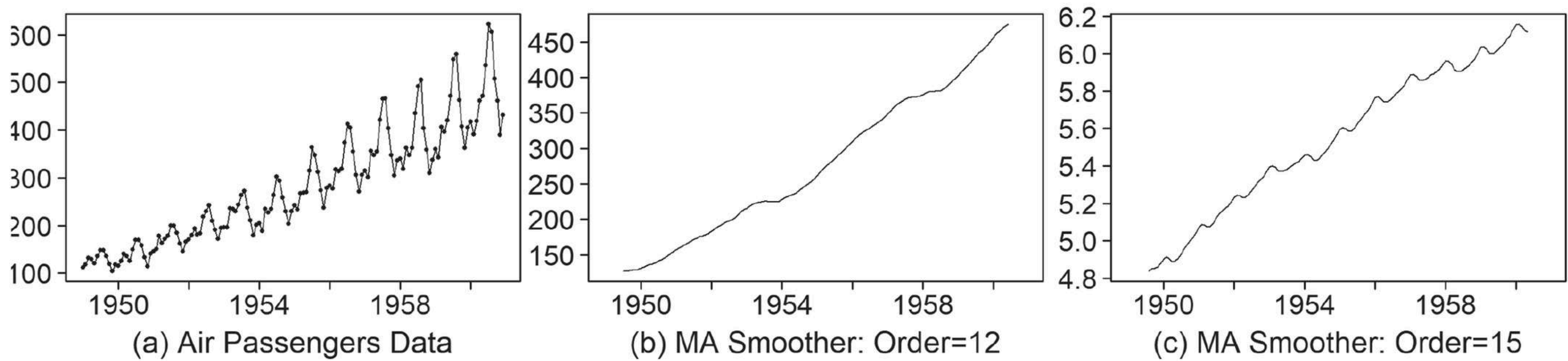


(b) MA Smoother, Order=5

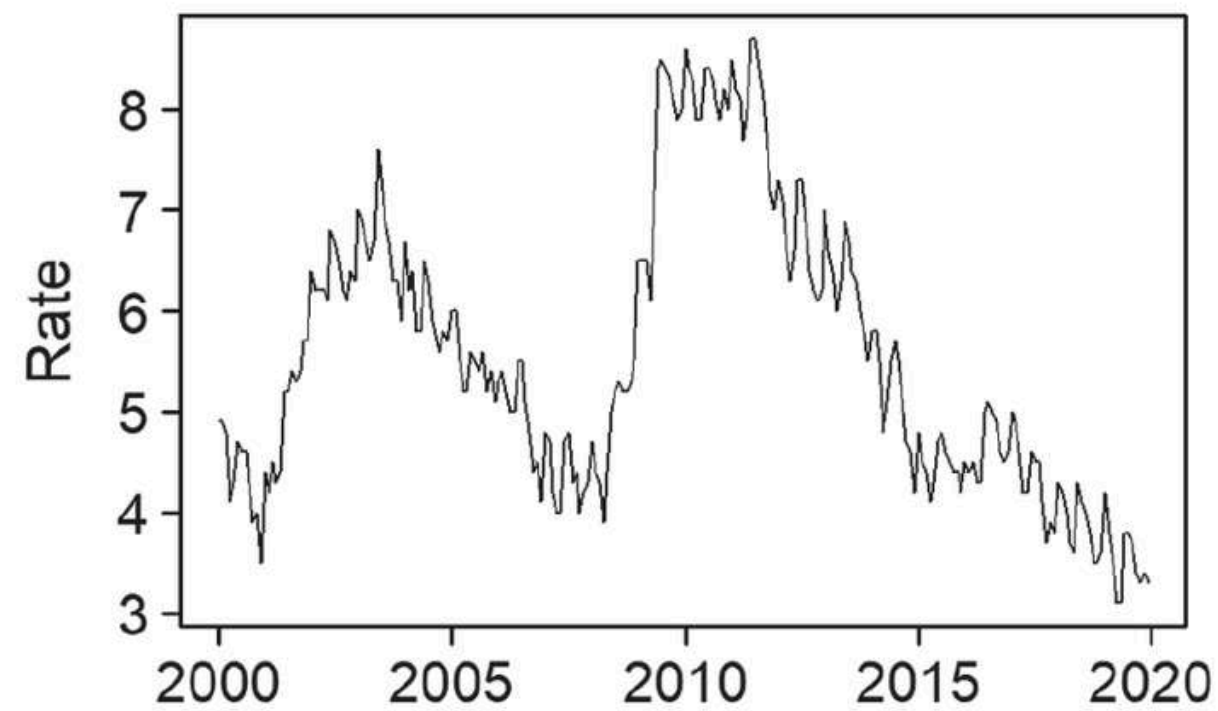


(c) MA Smoother, Order=10

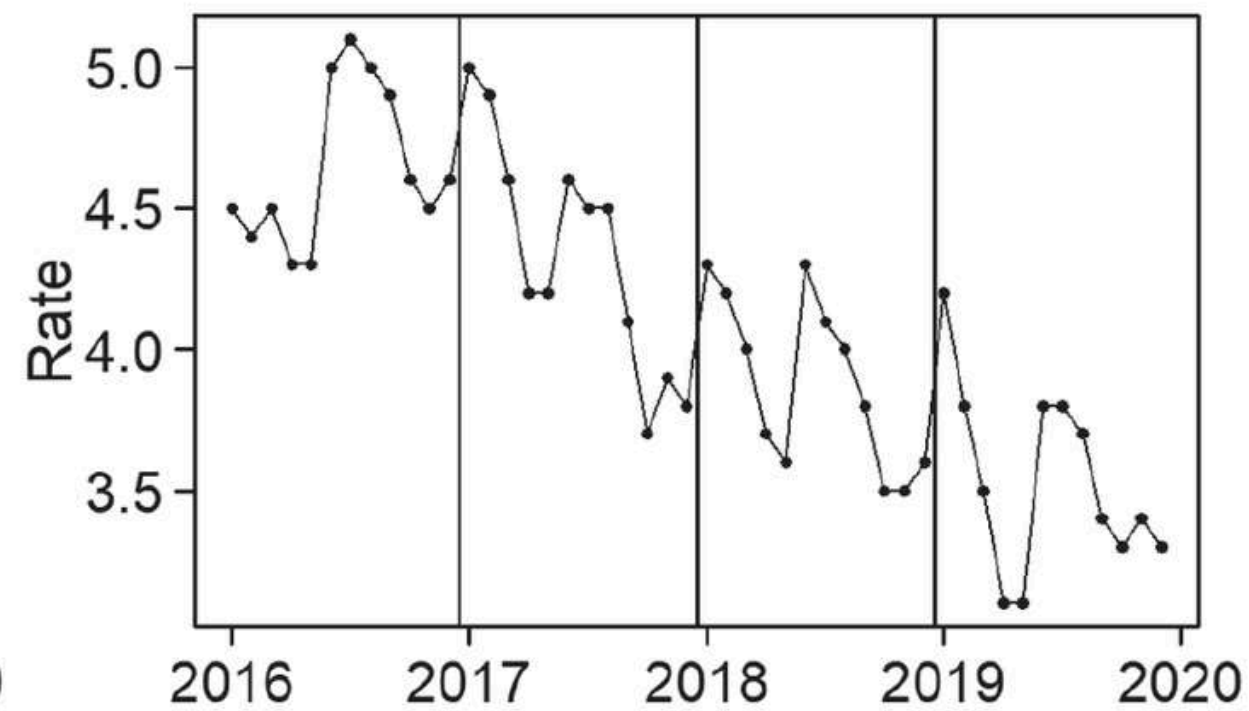
**FIGURE 2.4** (a) Cosine+line+noise data, (b) and (c) observed data in (a) with 5<sup>th</sup> and 10<sup>th</sup> order smoothing, respectively.



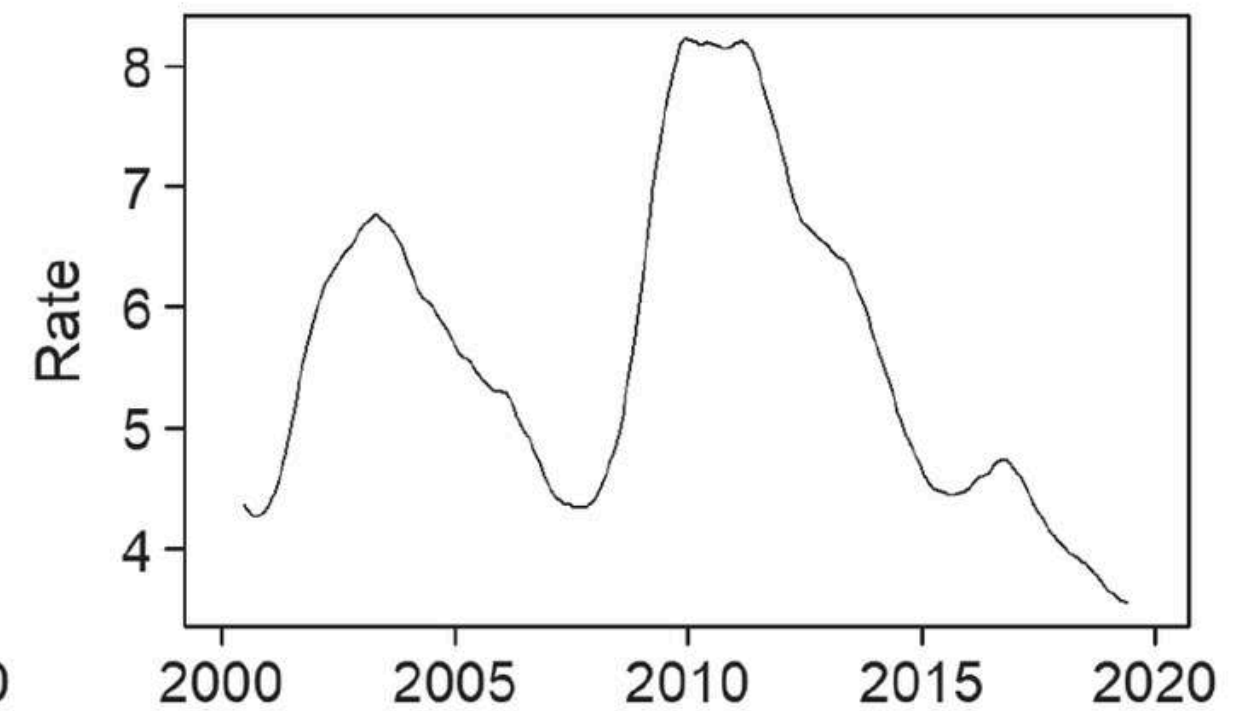
**FIGURE 2.5** (a) Air Passengers data, (b) and (c) observed data in (a) with 12<sup>th</sup> and 15<sup>th</sup> -order smoothing, respectively.



(a) Texas Unemployment: 2000-2019



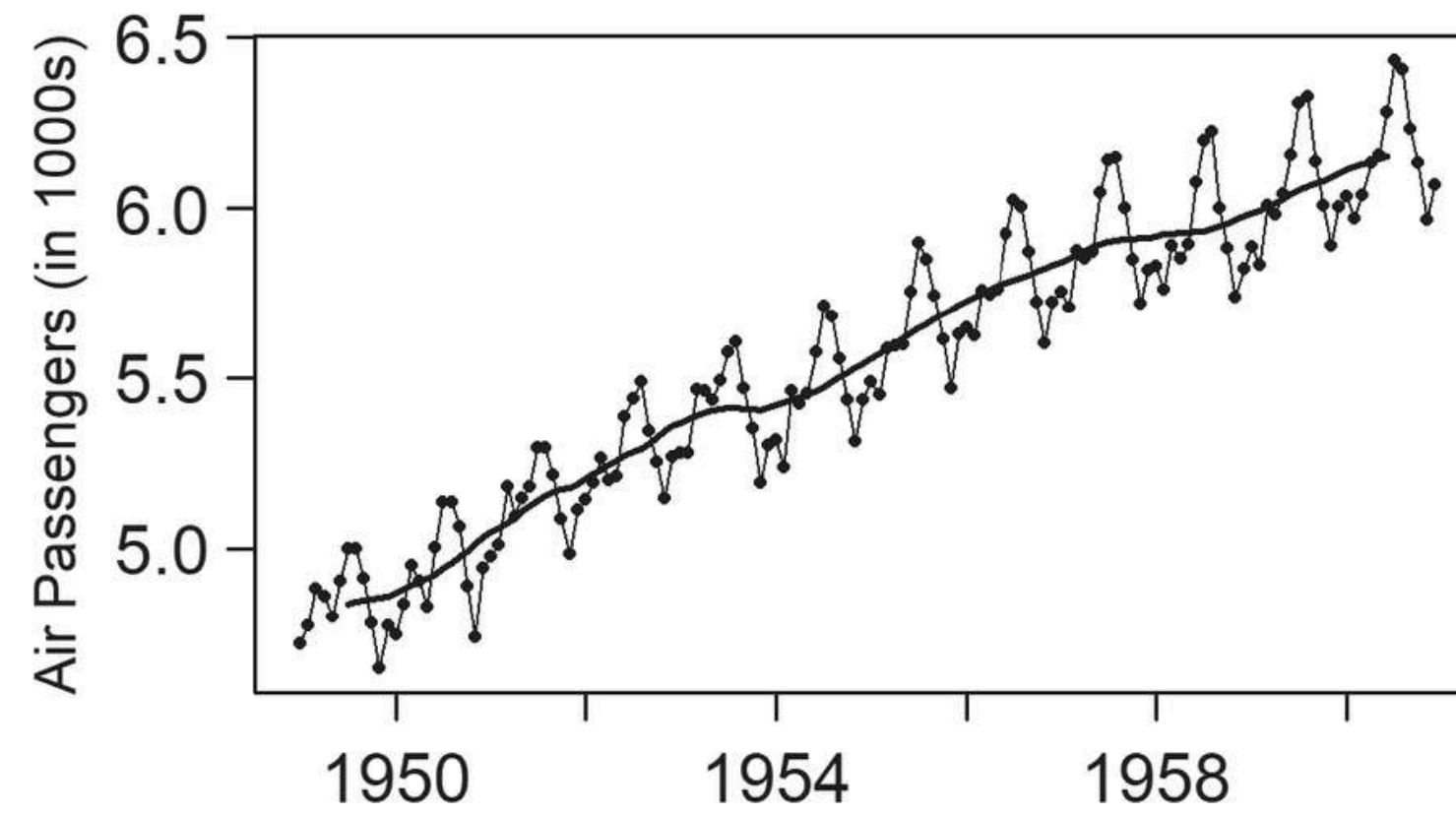
(b) Texas Unemployment: 2016-2019



(c) Smoothed Data: Order =12

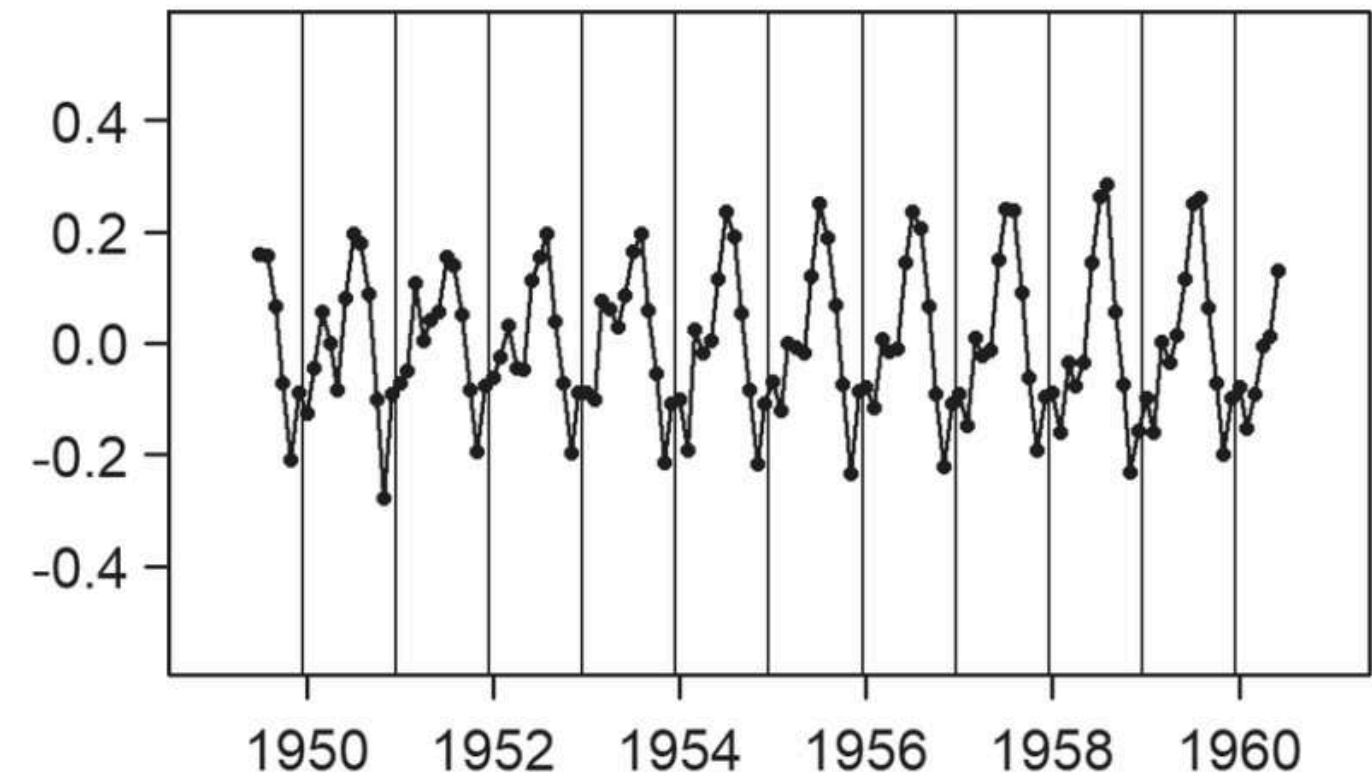
**FIGURE 2.6** (a) Monthly Texas unemployment rates from 2000 through 2019 and (b) unemployment rates from 2016 through 2019, (c) original data after applying a 12<sup>th</sup>-order moving average smoother.

1



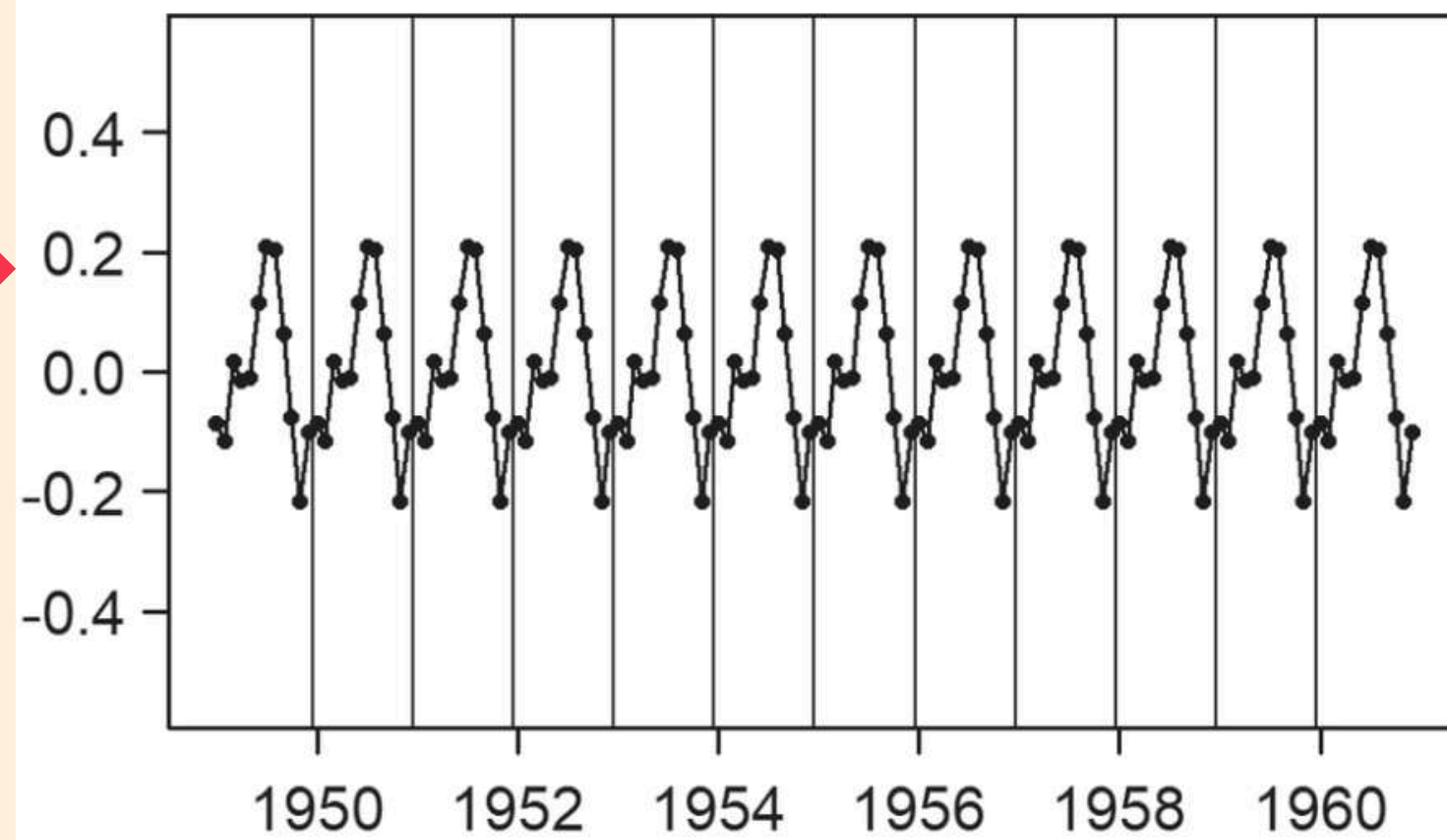
Air Passengers Data with Estimated Trend

2



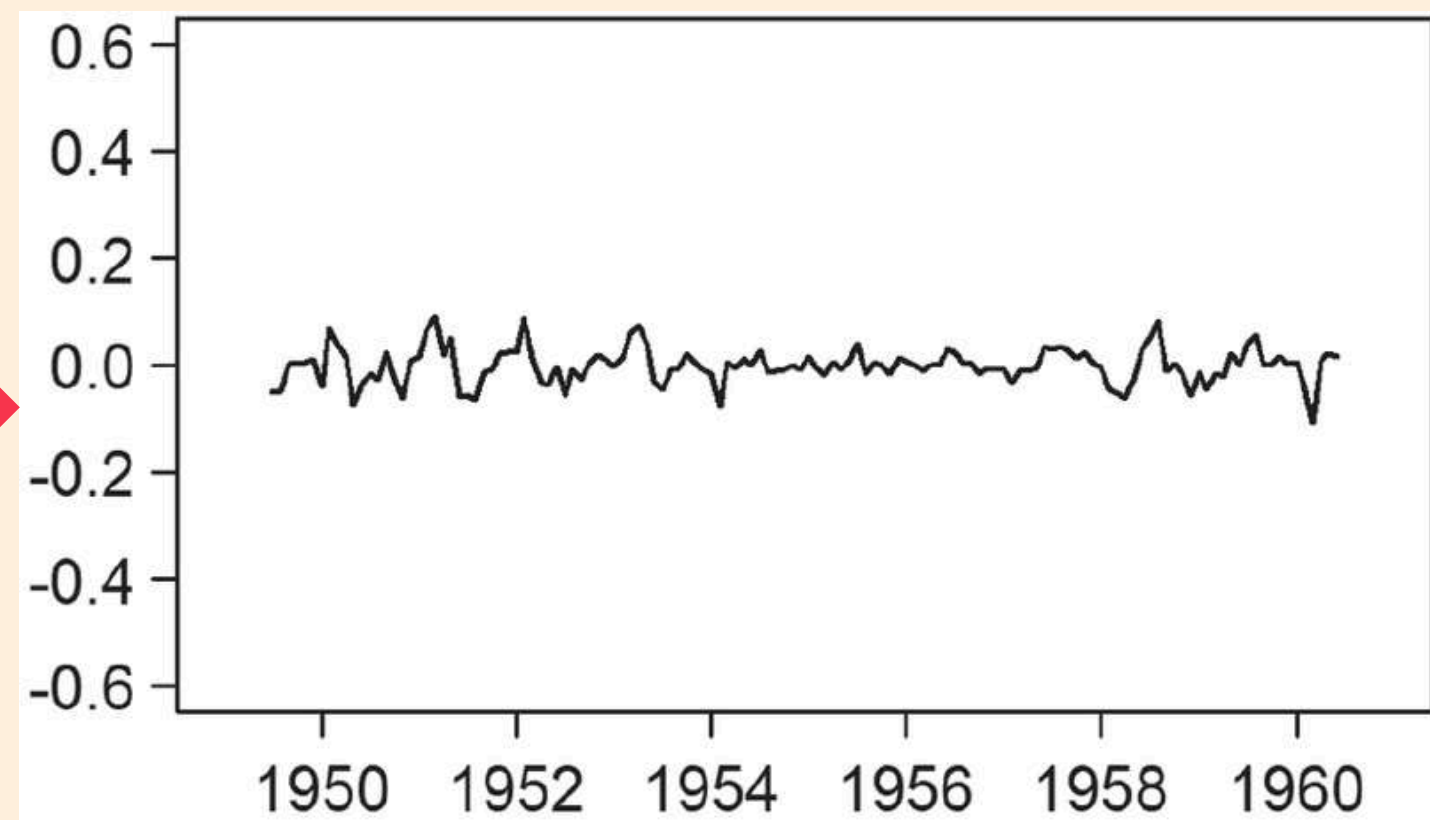
(a) Log Air Passengers Data minus Trend

3



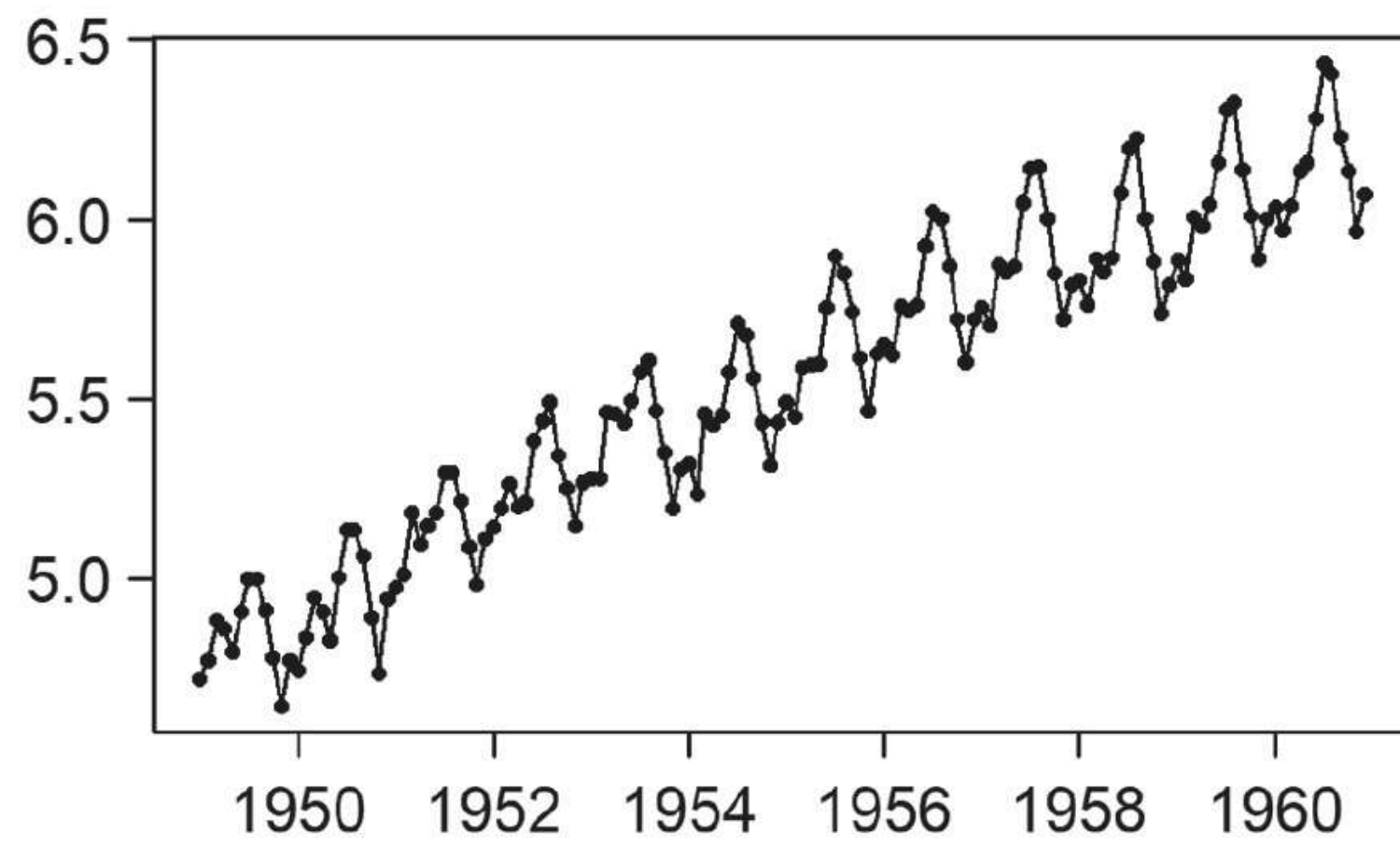
(b) Estimated Seasonal component

4

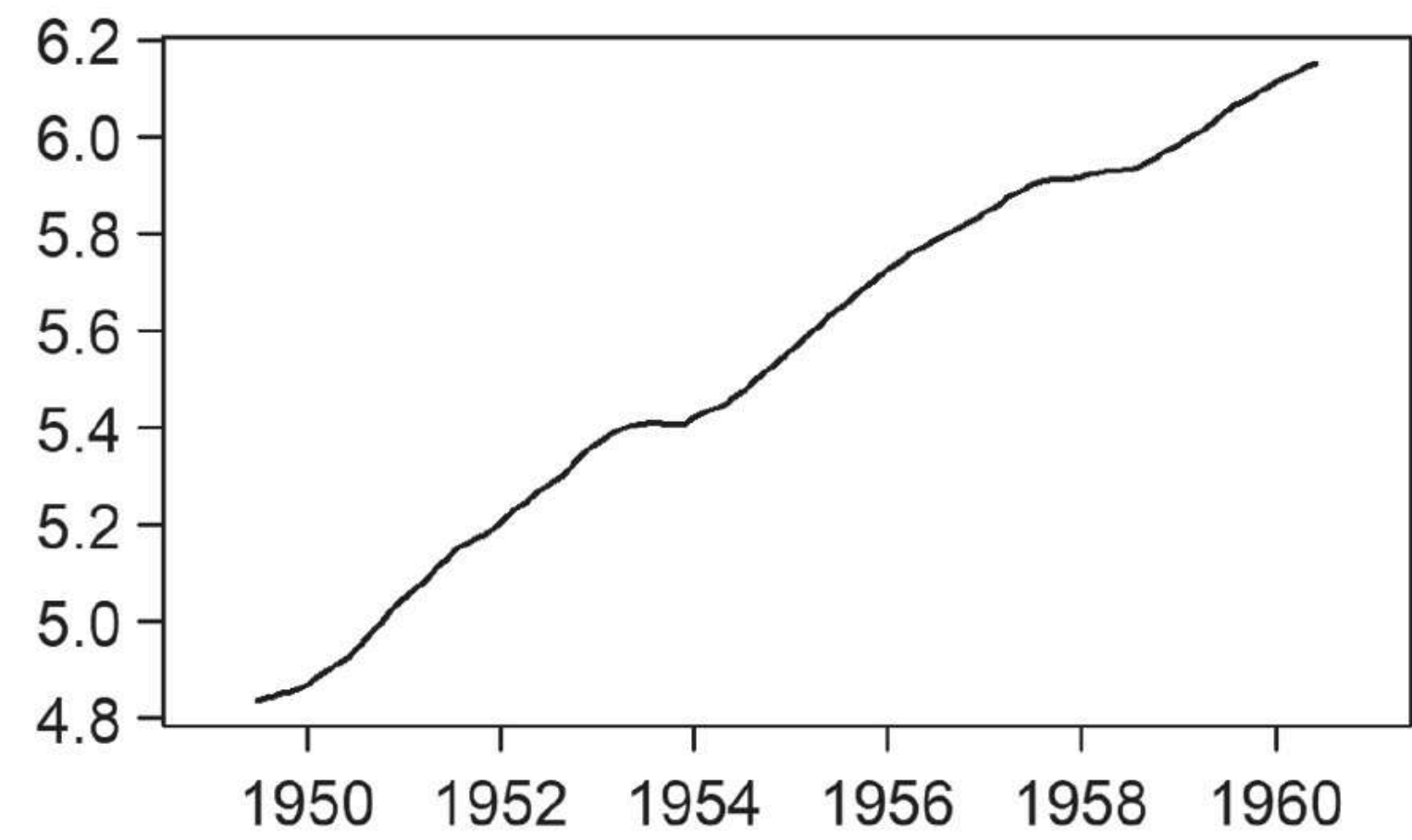


(d) Noise Component

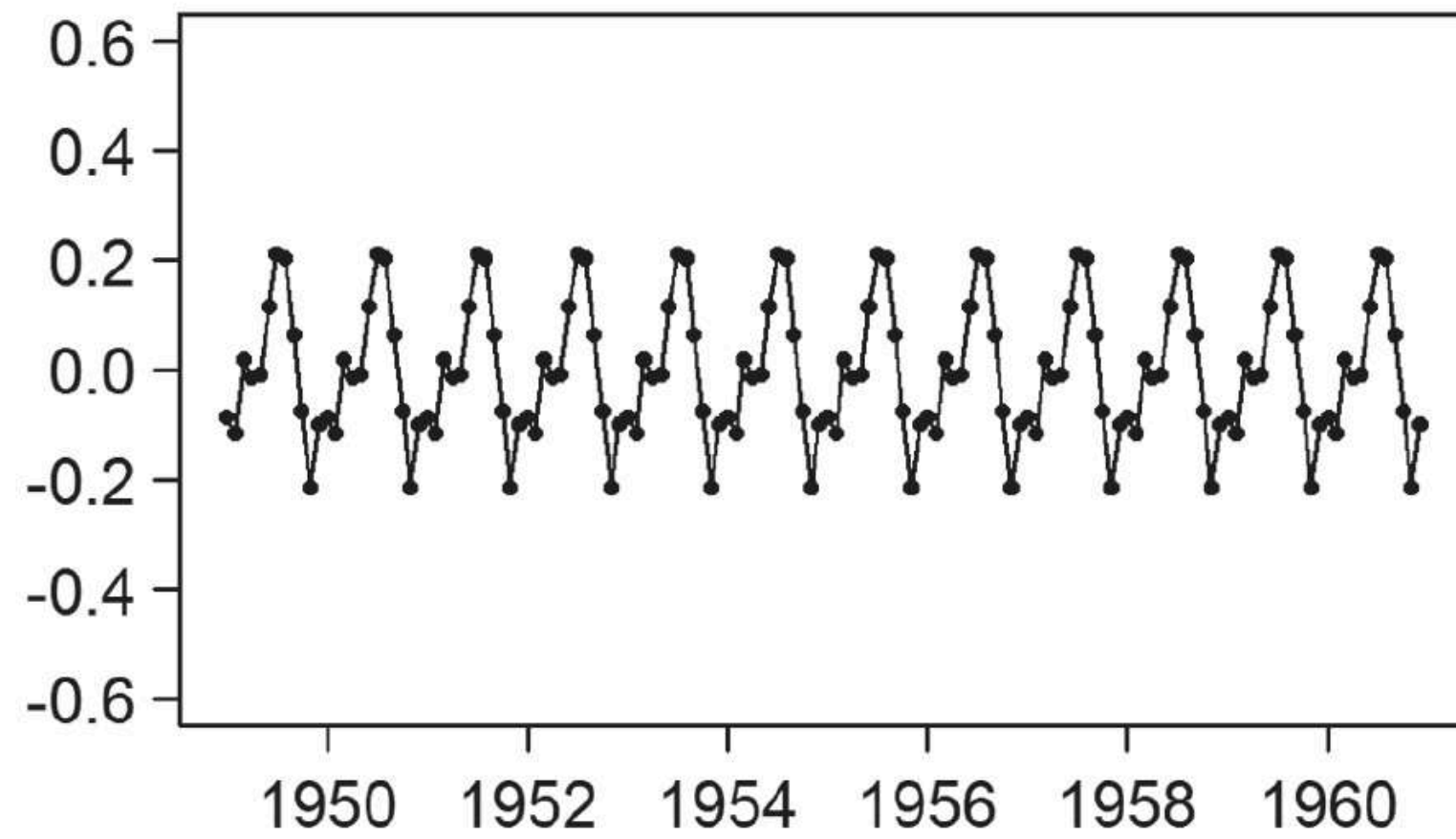




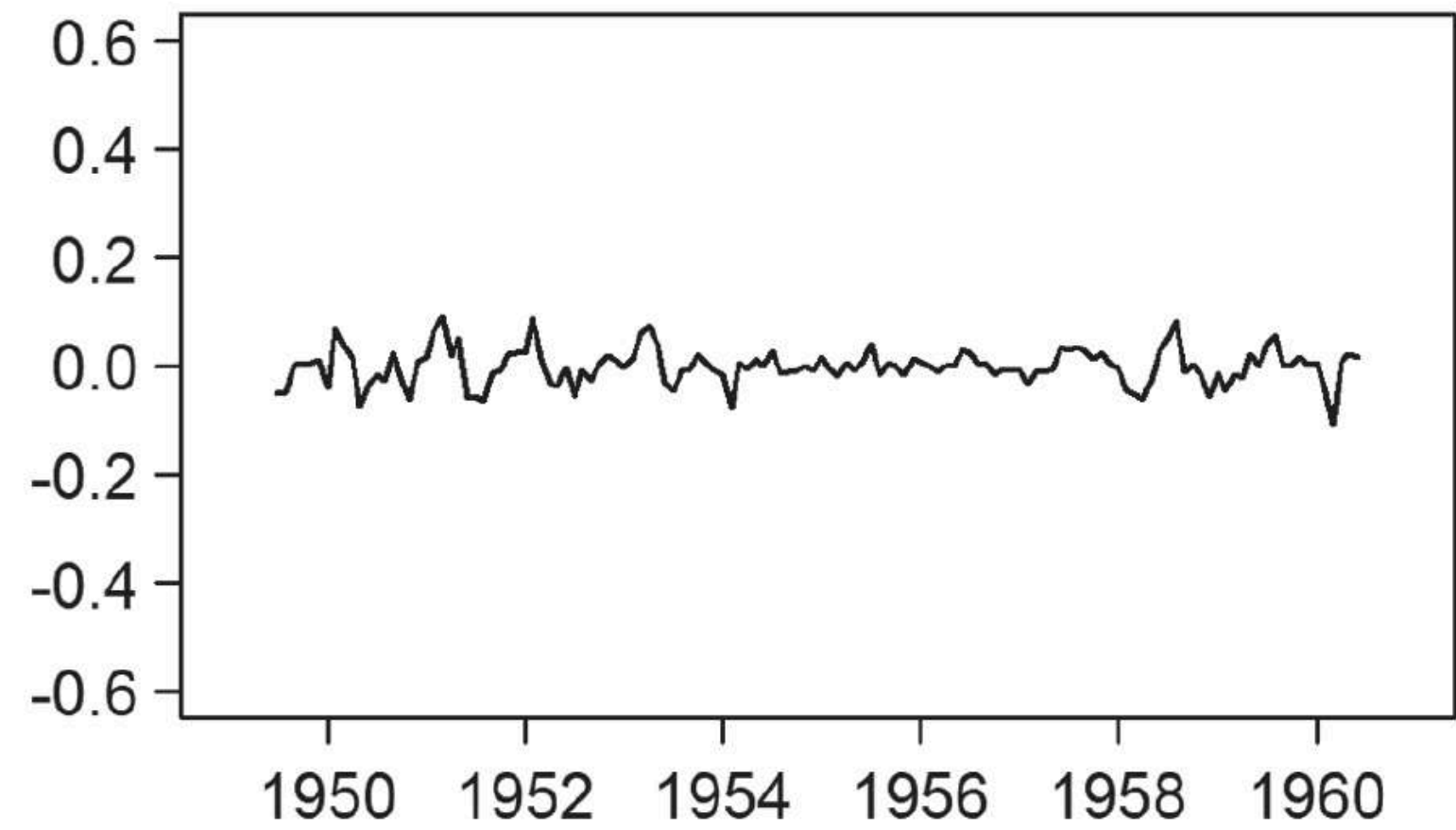
(a) Log Air Passengers Data



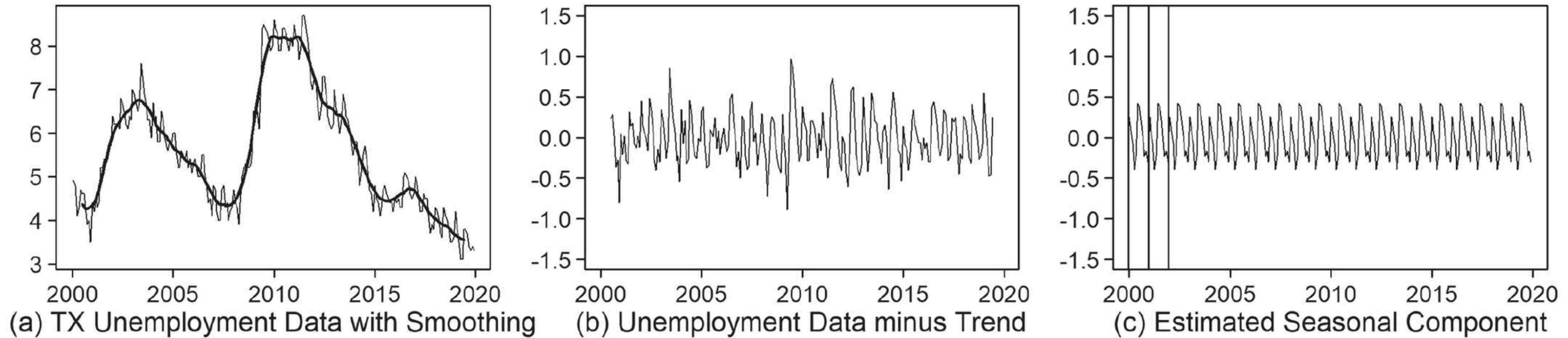
(b) Estimated Trend Component



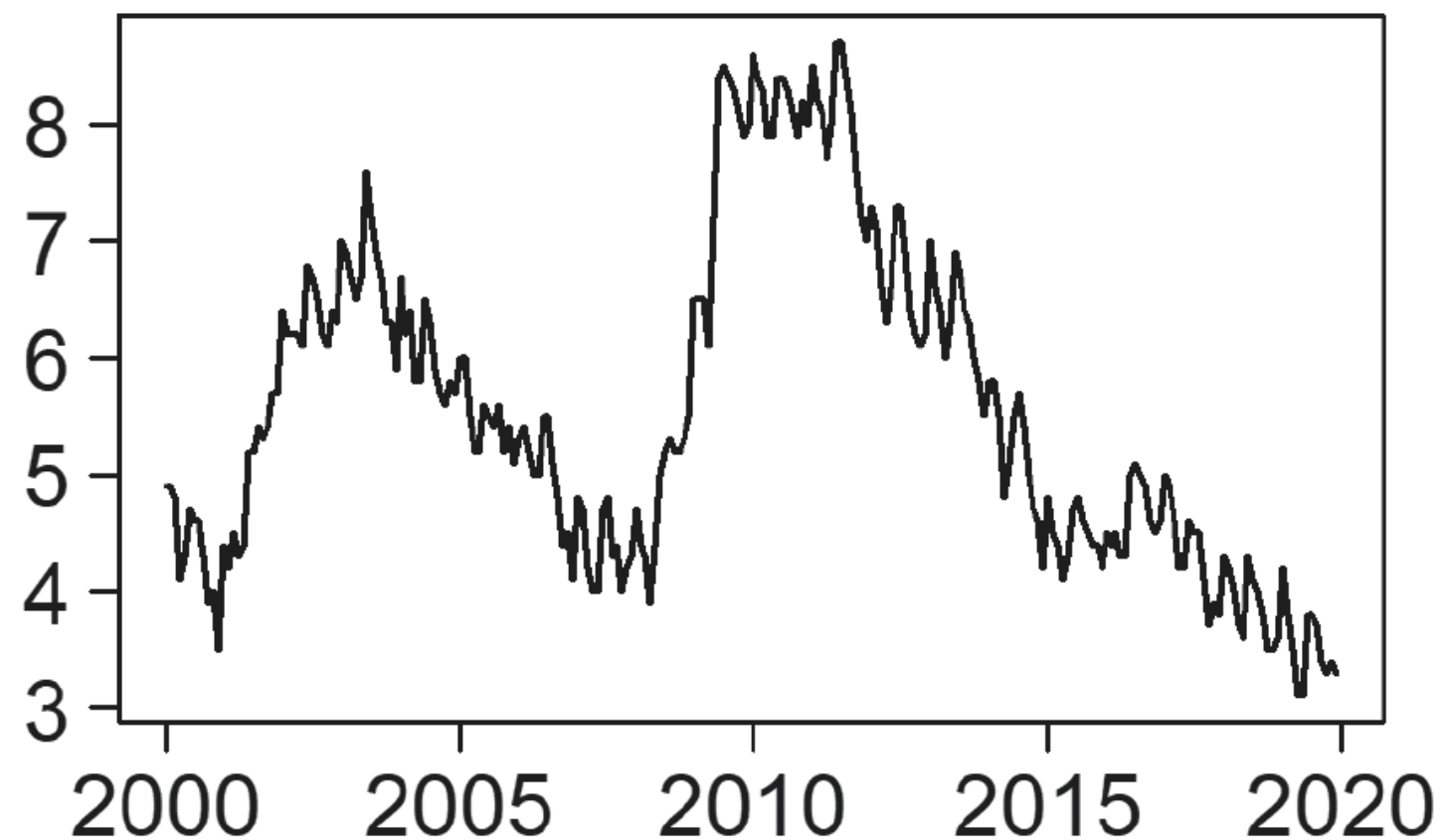
(c) Estimated Seasonal Component



(d) Noise Component



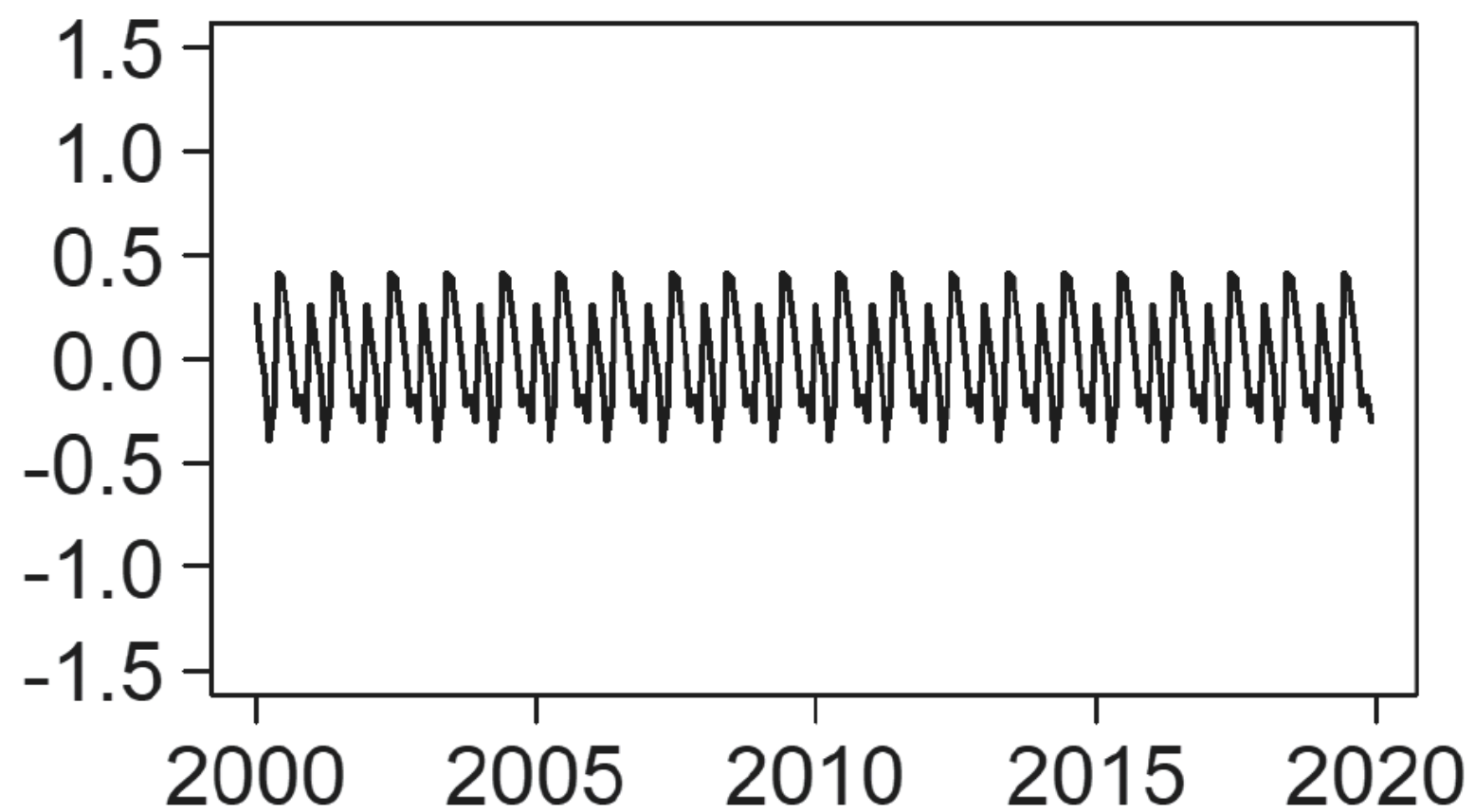
**FIGURE 2.11** (a) Texas unemployment rates for 2000 through 2019 and showing moving average smoothed data of order 12, (b) Texas unemployment data minus trend, and (c) estimated seasonal component.



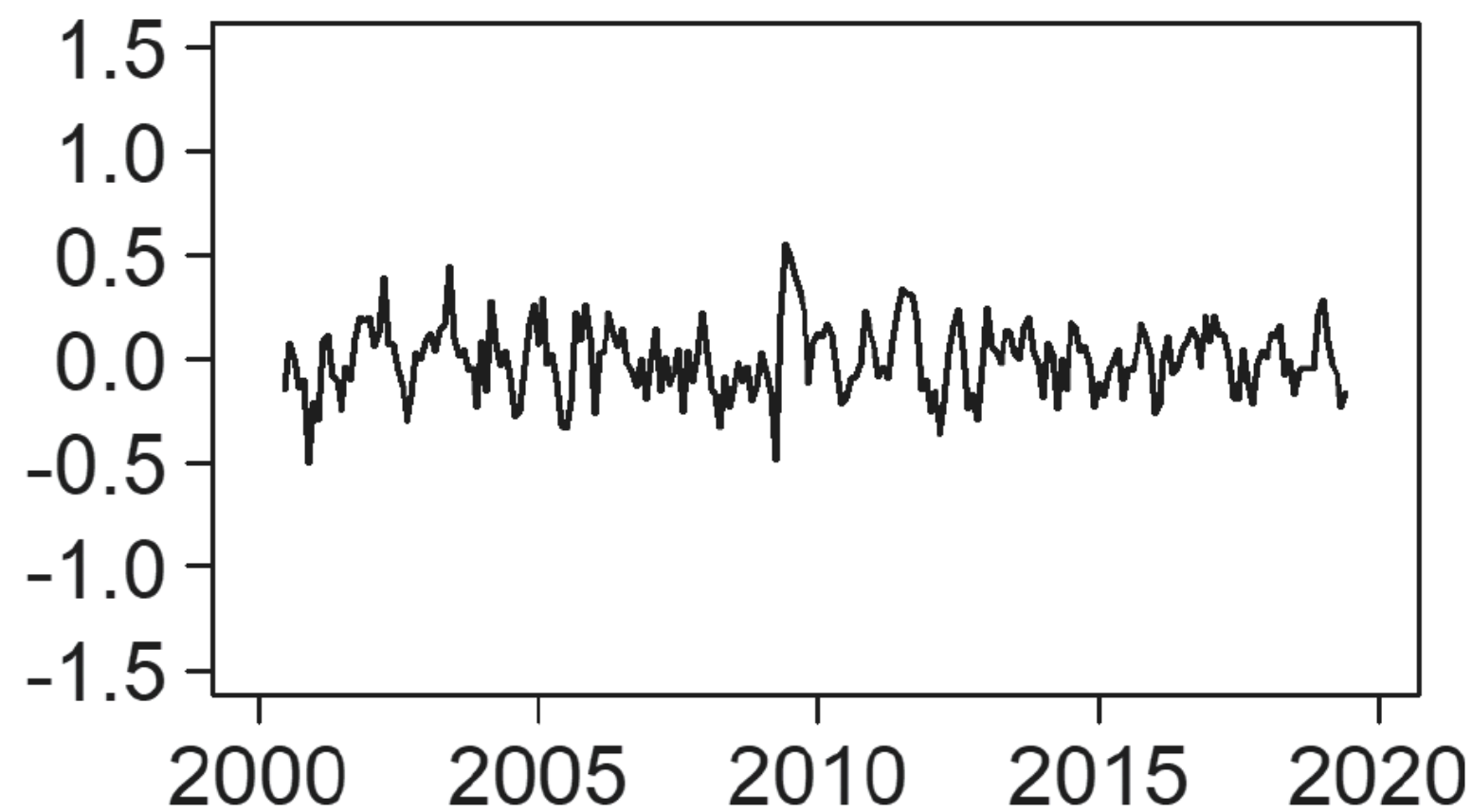
(a) Texas Unemployment Rates: 2000-2019



(b) Estimated Trend Component

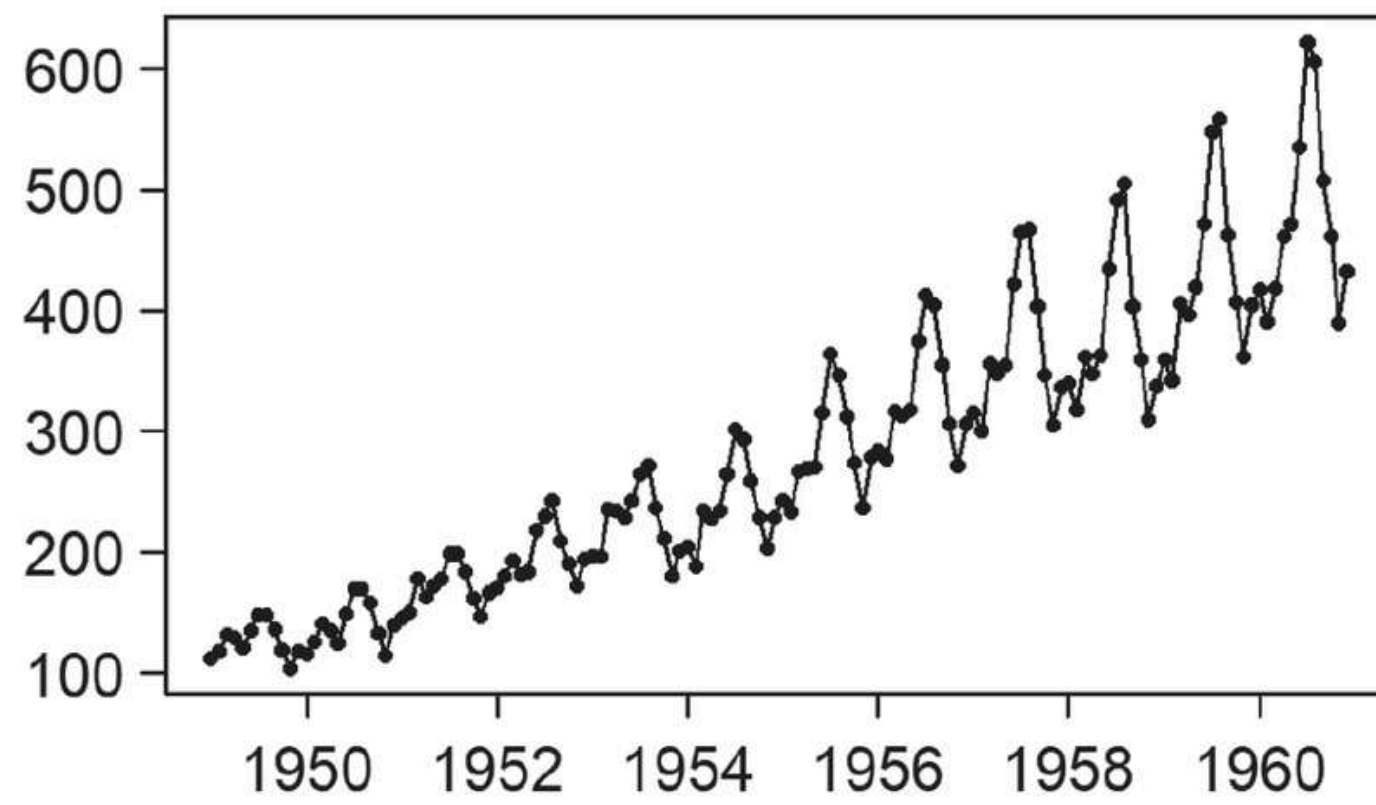


(c) Estimated Seasonal Component

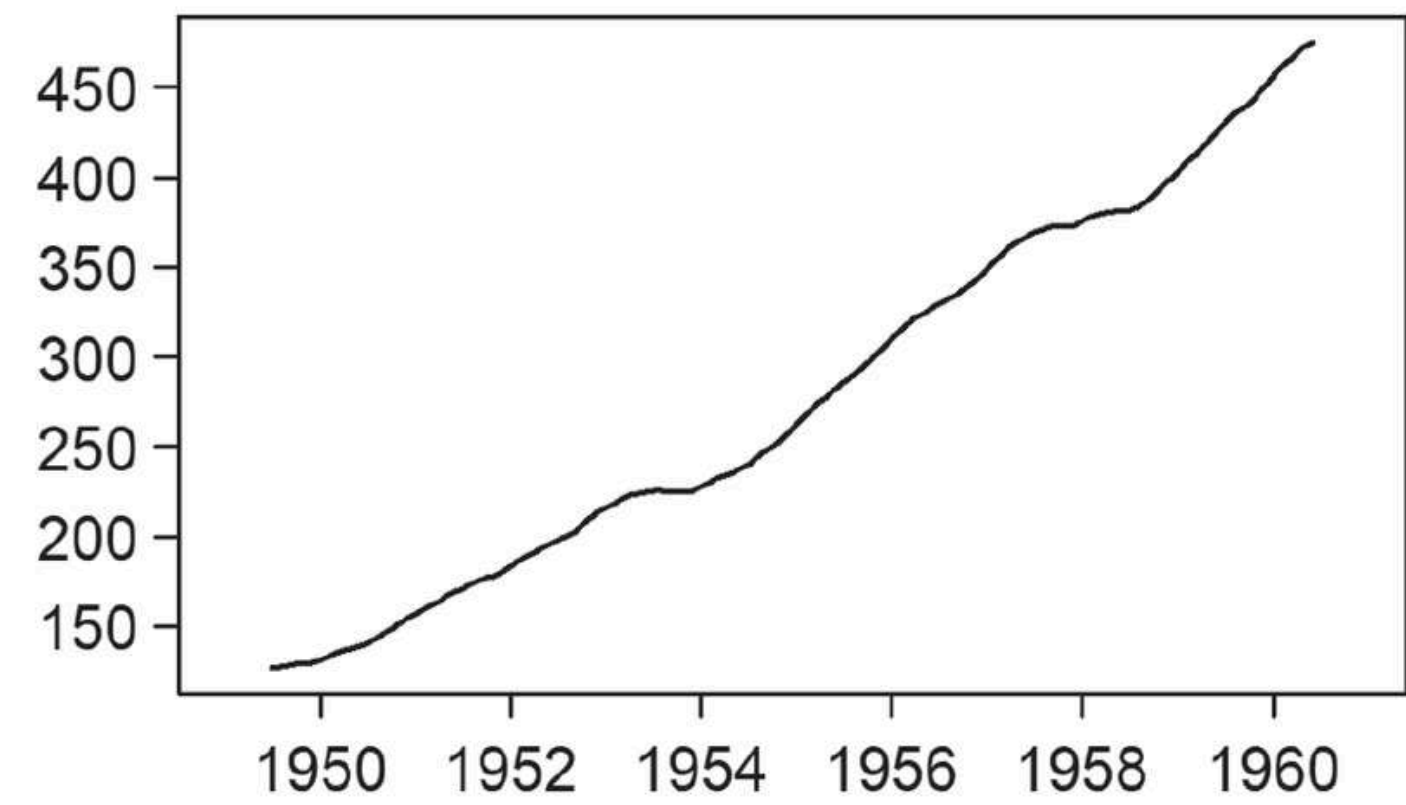


(d) Noise Component

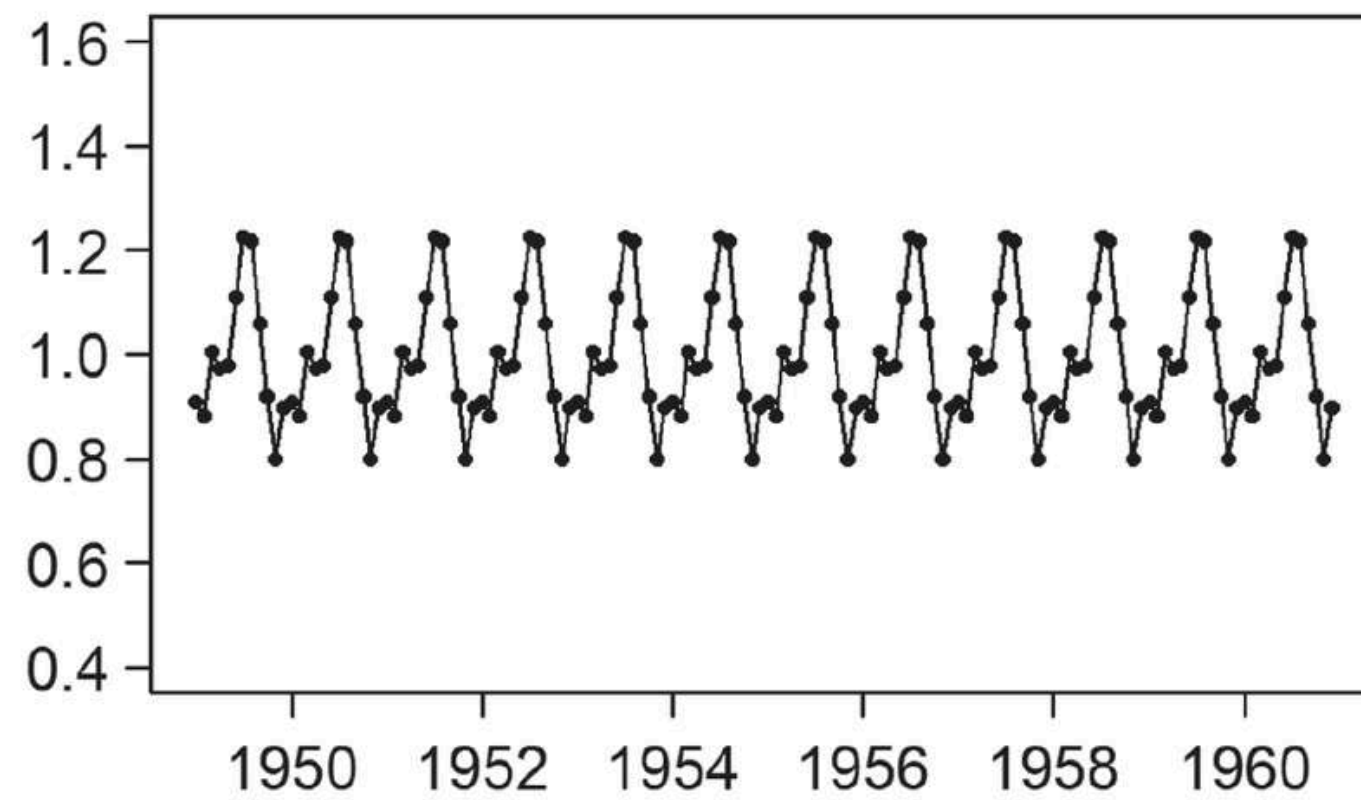




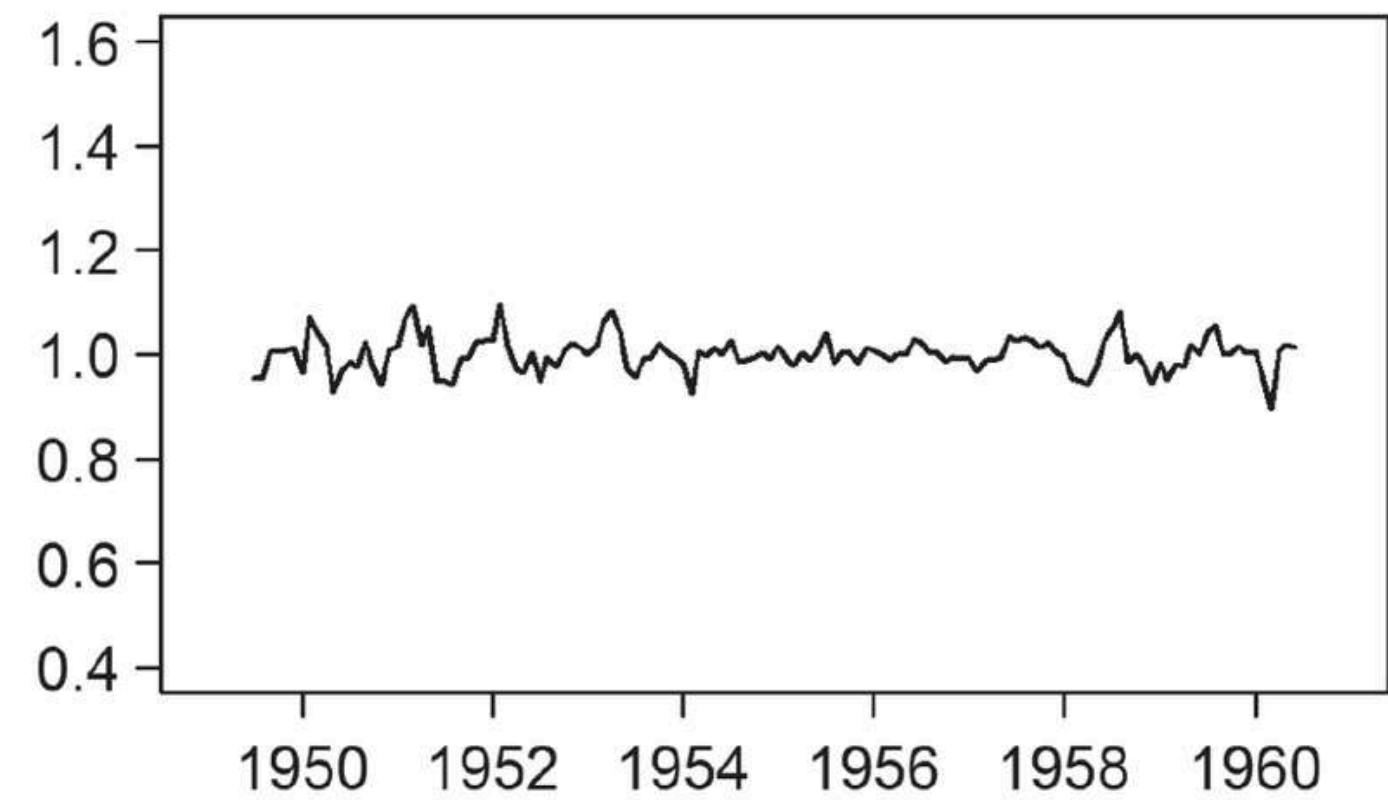
(a) Air Passengers Data



(b) Estimated Trend Component



(c) Estimated Seasonal Component



(d) Noise Component

**FIGURE 2.14** Multiplicative Decomposition of Air Passengers Data.

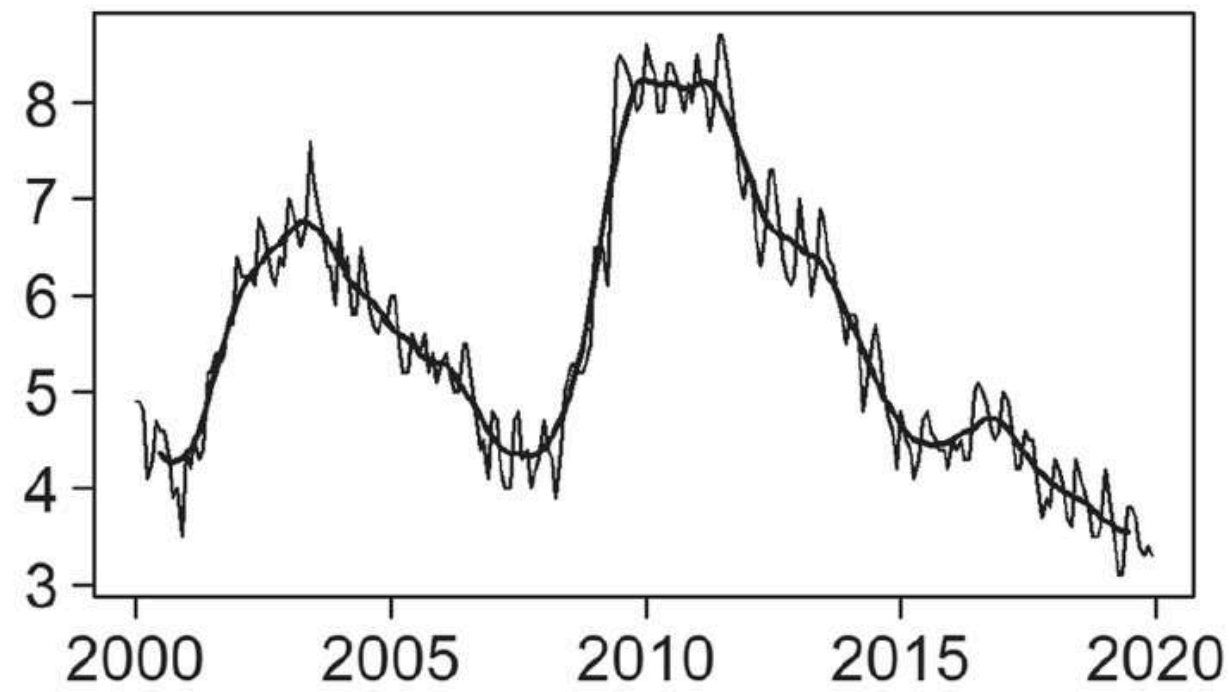
# Seasonal Adjustment

## **Total Nonfarm | FRED | St. Louis Fed**

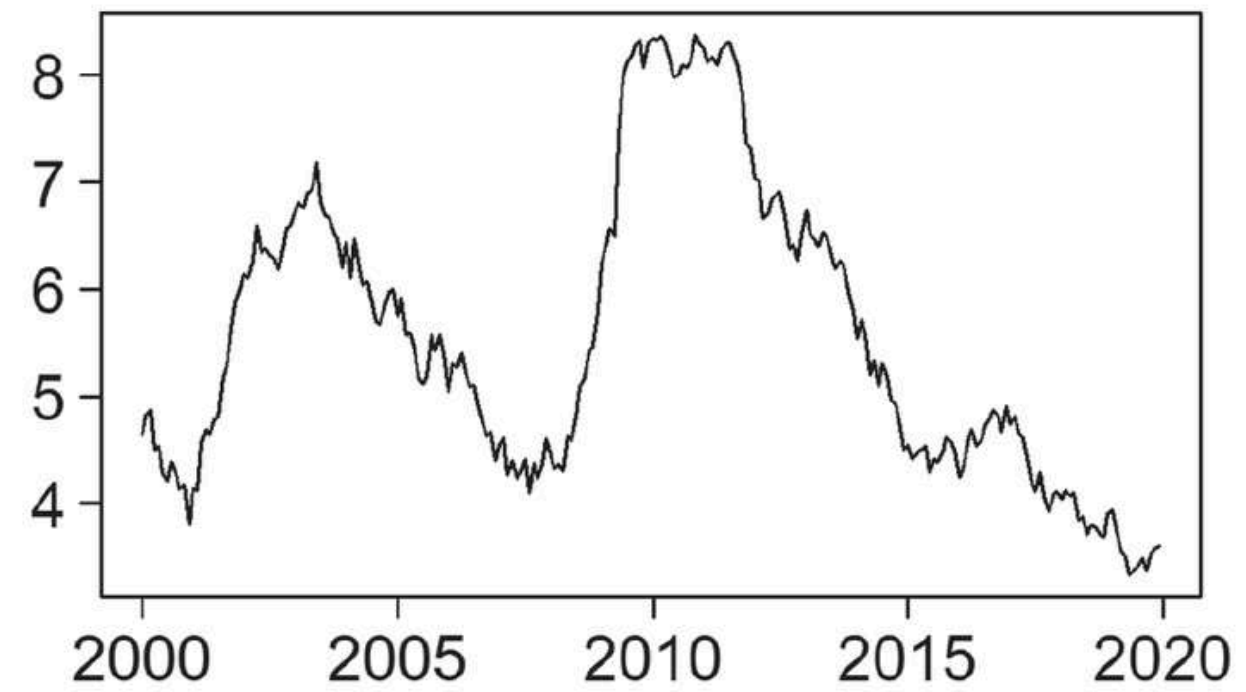
Category: Current Employment Statistics (Establishment Survey) > Total Nonfarm, 5 economic data series, FRED: Download, graph, and track economic data.

 [stlouisfed.org](https://fred.stlouisfed.org)

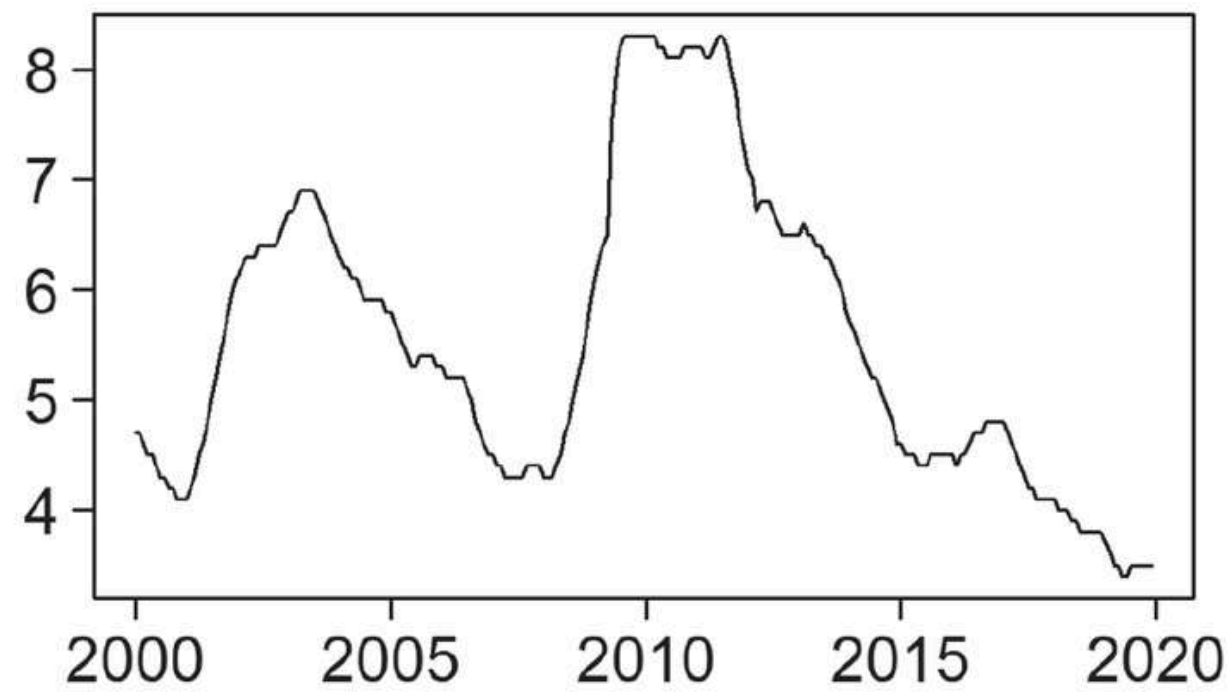




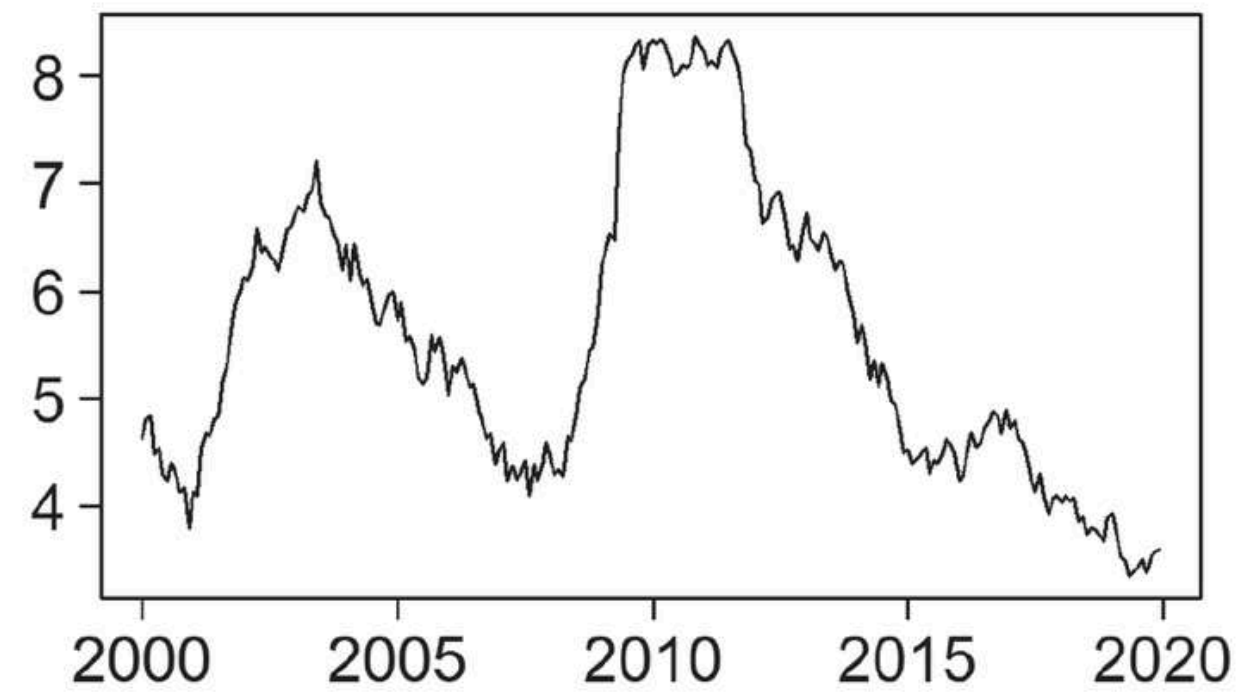
(a) TX Unemployment Data with Smoothing



(b) Seasonal Adjusted Data using (2.8)

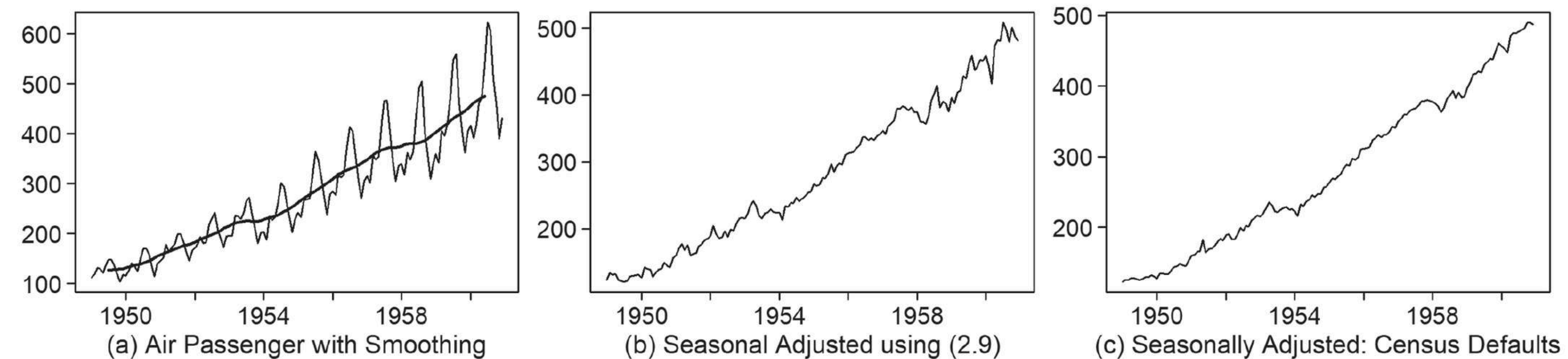


(c) Seasonally Adjusted Data on twc.texas.gov



(d) Seasonally Adjusted Data: Census Defaults

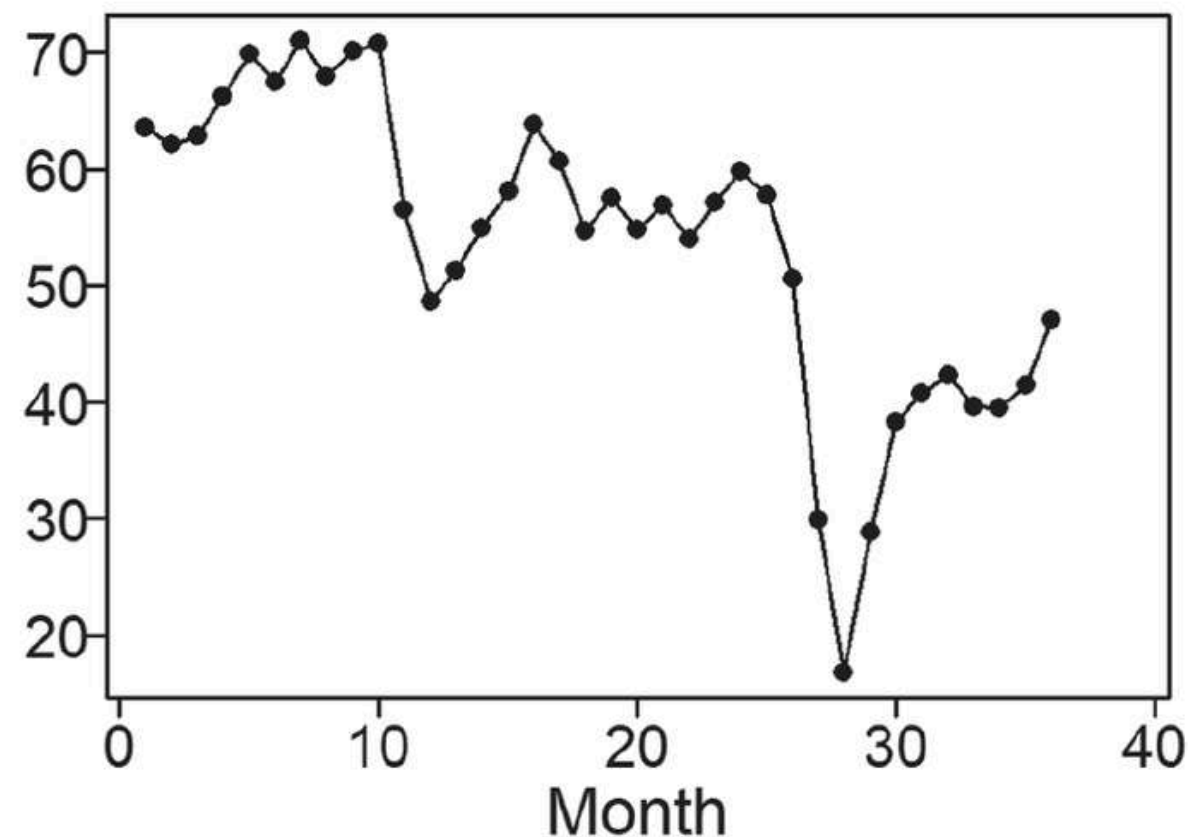
**FIGURE 2.15** (a) Texas unadjusted unemployment data superimposed with the output from a 12<sup>th</sup>-order moving average smoother, (b) seasonally adjusted data using (2.8), (c) seasonally adjusted data from the twc.texas.gov website, and (d) seasonally adjusted data using the default options of the function seas.



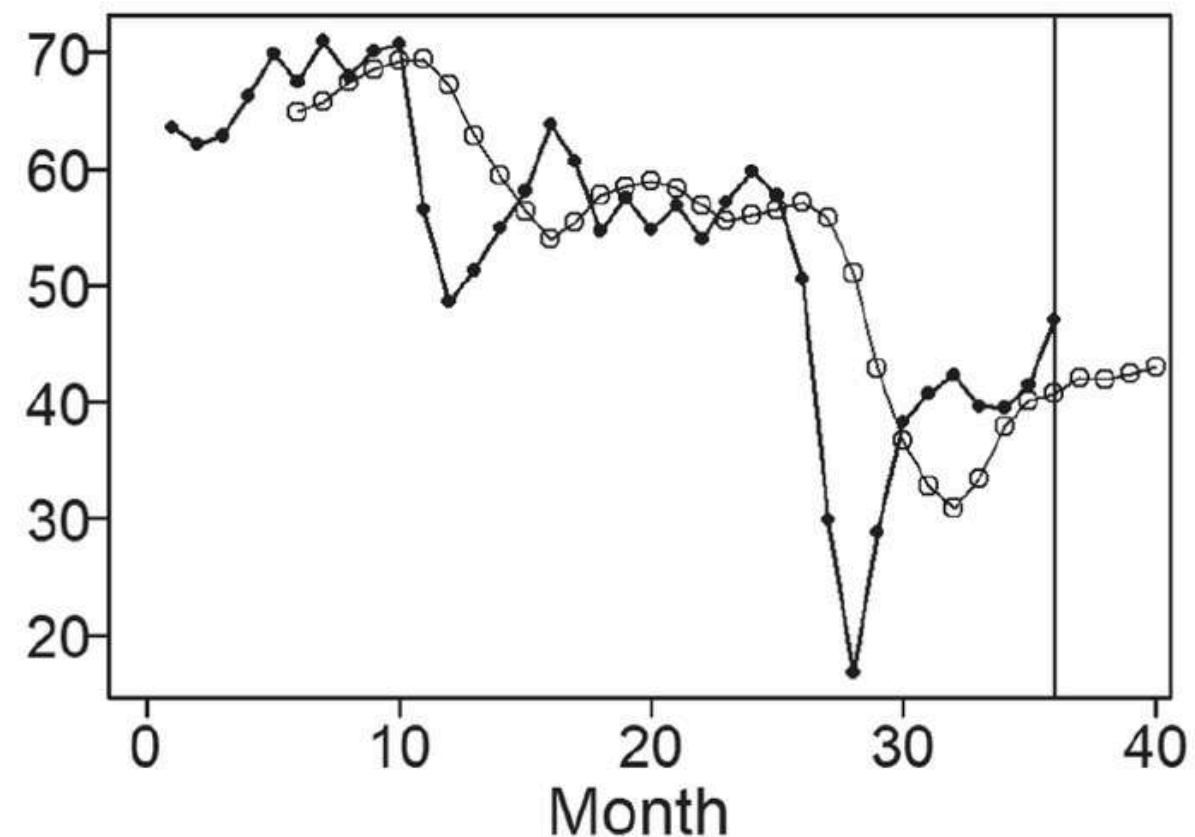
**FIGURE 2.16** (a) Air Passengers data superimposed with the output from a 12<sup>th</sup>-order moving average smoother, (b) seasonally adjusted data using (2.9), (c) seasonally adjusted data using the default options of the function *seas* in the CRAN package *seasonal*.



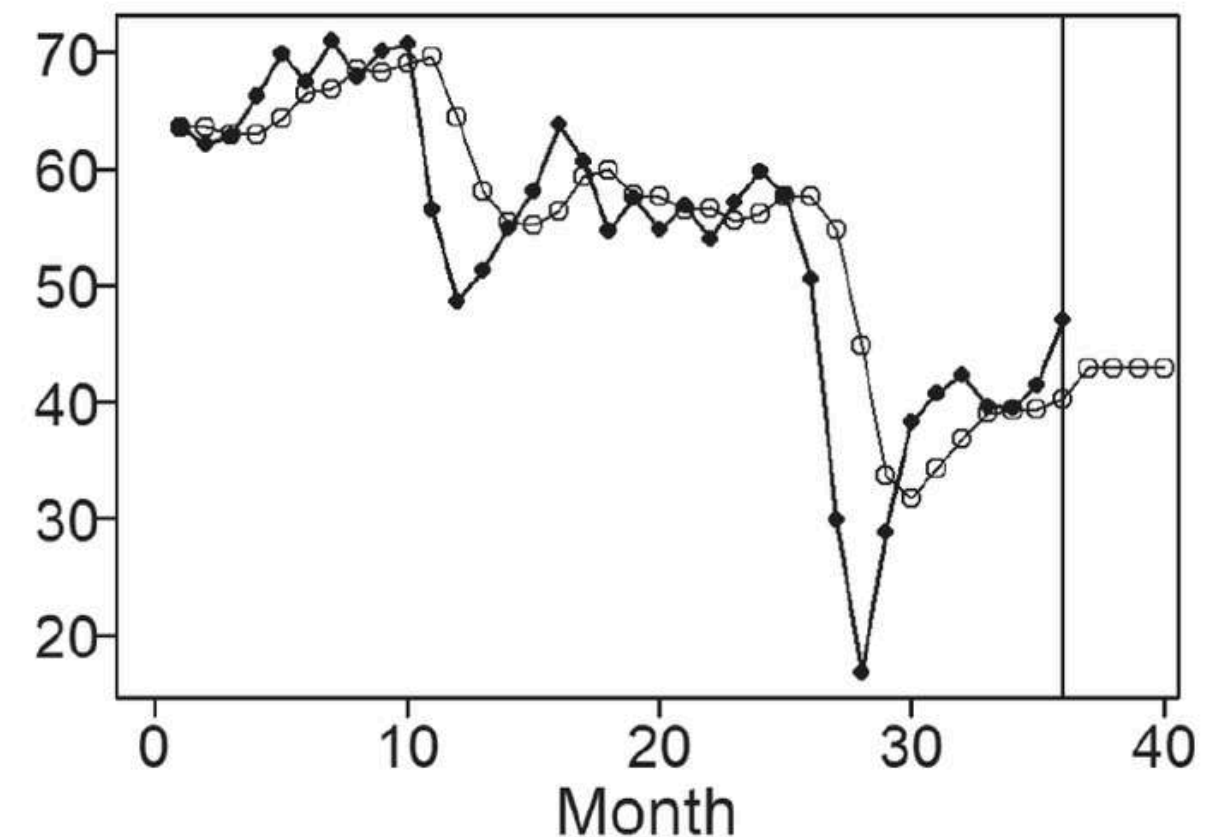
# Exponential Smoothing



(a) WTCrude 3 Years



(b) Moving Average Predictions



(c) Exponential Smoothing Prediction

**FIGURE 2.17** (a) Monthly price of West Texas Intermediate crude oil for the years 2018–2020, (b) crude oil prices along with 1-step ahead predictors using a 5<sup>th</sup>-order smoother, and (c) 1-step ahead predictions using exponential smoothing with  $\alpha = .4$ .

Exponential Smoothing

