## TIME SERIES ANALYSIS LECTURE 1

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# Common Empirical Time Series Patterns

## Pattern 1: Trend and Fluctuation Around the Trend

**Example:** Passenger bookings of an airline

## Data:

- The number of passengers traveling on the airline increased with time (i.e., an increasing trend).
- The bookings behaved cyclically with some fixed time periods.
- The fluctuation increased over time.

## Pattern to observe:

- Upward trend—a systematic dynamic in a time series that is not periodic.
- Seasonal effect—the seasonal effect is apparent in the box plot as well.

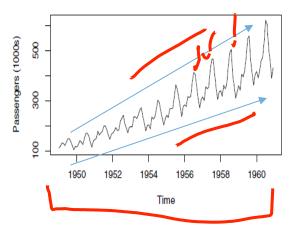
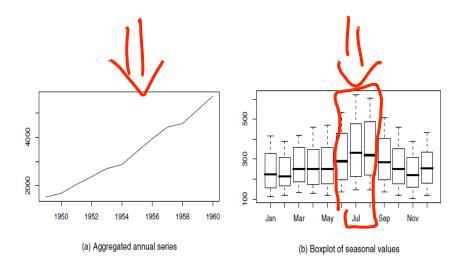


Fig. 1.1. International air passenger bookings in the United States for the period 1949–1960.



## Pattern 2: Change in Structure

**Example:** Annual average global temperature change between 1880 and 2009

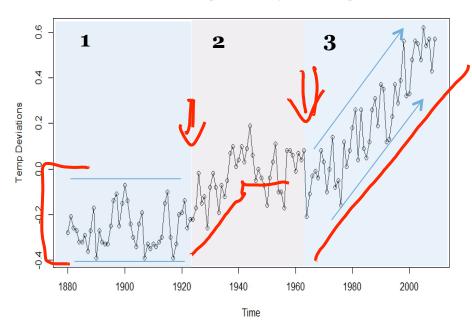
## **Observations:**

- i. The temperate change was range bounded between 0 and -0.4% from 1880 to 1920.
- ii. The range of temperate change started to increased to fluctuated between -0.2% to 0.2% from 1920 to 1960.
- iii. The temperate change continued to trend up since 1960, sparking the debate on global warming.

#### Pattern to observe:

 Possible structural change: A consistent upward trend with variation around the trend after a long period of range-bounded fluctuation (i.e., from 1880–1920)

#### **Annual Average Global Temperature Change**



## Pattern 3: Variation Around a Stable Mean

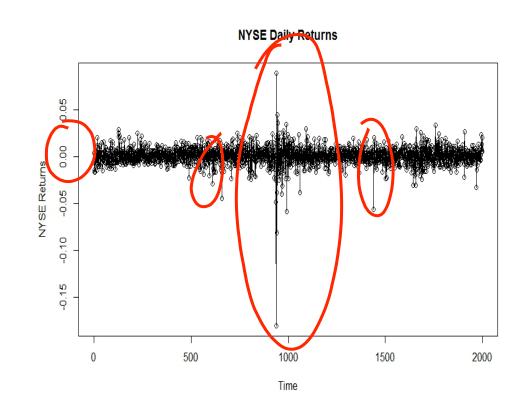
**Example:** New York Stock Exchange (NYSE) daily returns

#### **Observations:**

- The NYSE daily returns (in the observation window) fluctuated around zero.
- There were spikes in the fluctuations from time to time, so-called volatility clustering.

## Pattern to observed:

- Stable mean—the mean of the series looks stable.
- Time-varying volatility—the volatility of the series varies over time.



## Pattern 4: Periodicity

**Example:** Functional magnetic resonance imaging (fMRI) in different locations of the brain

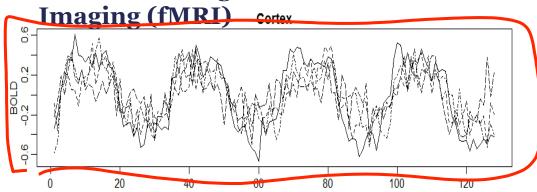
## **Observations:**

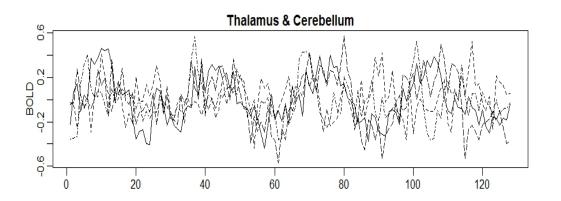
- Periodicity appear strongly in the motor cortex series.
- Periodicity appear much weaker in the thalamus and cerebellum series.

## Pattern to observed:

 Periodicity—cycles occurred in fixed frequency.

## **Functional Magnetic Resonance**





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