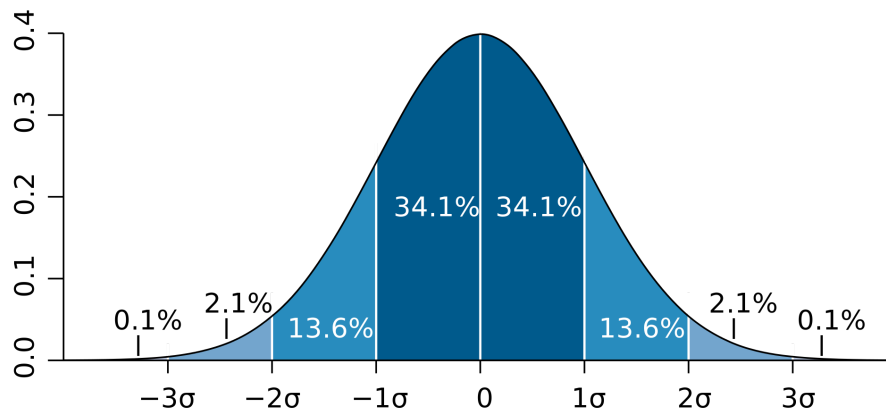


## Lecture 2: Measures of Shape

### ◆ What Are Measures of Shape?

In descriptive statistics, we don't just look at **averages (central tendency)** or **spread (dispersion)**—we also care about the **shape** of the data distribution.



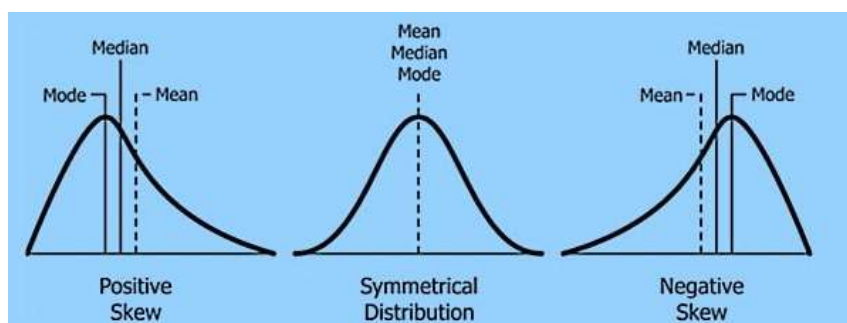
### ◆ Why Are These Measures Important?

1. Understanding Real-World Behavior
2. Choosing the Right Statistical Methods
3. Detecting Outliers and Anomalies

### ◆ Skewness?

**Skewness** is a statistical measure that describes the **asymmetry** of a distribution around its mean.

- When a distribution is **symmetrical**, the left and right sides are mirror images.
- When it is **skewed**, one tail is **longer or fatter** than the other.
- Skewness tells us the **direction** and **degree** of the skew.



## ◆ Types of Skewness

### 1 Symmetrical Distribution (Zero Skewness)

- **Mean  $\approx$  Median  $\approx$  Mode**
- Data is evenly distributed around the center.

#### Example:

Data: 60, 65, 70, 70, 71, 74, 80

Mean = 70, Median = 70, Mode = 70

Skewness  $\approx 0$  (symmetrical)

### 2 Positively Skewed (Right Skewness)

- **Mean  $>$  Median  $>$  Mode**
- Tail is stretched to the **right** (toward higher values)
- Bulk of data lies on the **left**

#### Example:

Data: 60, 65, 70, 70, 71, 74, 108

Mean = 74, Median = 70, Mode = 70

Skewness  $> 0$  (positive)

- Indicates a **few high outliers**
- Common in **income distributions**, **CO<sub>2</sub> emissions**
- Mean is "pulled" right by extreme values

### 3 Negatively Skewed (Left Skewness)

- **Mean  $<$  Median  $<$  Mode**
- Tail is stretched to the **left** (toward lower values)
- Bulk of data lies on the **right**

#### Example:

Data: 32, 65, 70, 70, 71, 74, 80

Mean = 66, Median = 70, Mode = 70

Skewness  $< 0$  (negative)

- Indicates **few low outliers**
- Can occur in datasets like **exam scores** where most students score high, but a few score very low
- Mean is "pulled" left by lower extreme values



## Mathematical Definition

The skewness coefficient is often calculated as:

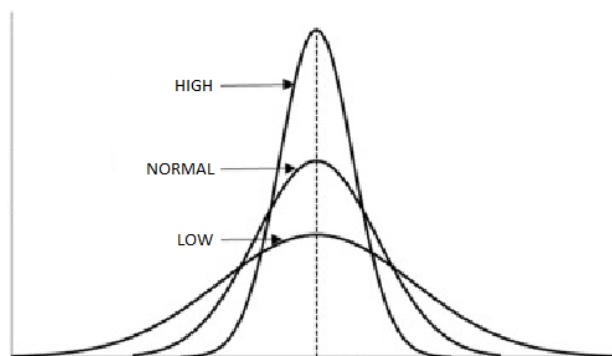
$$\text{Skewness} = \frac{n}{(n-1)(n-2)} \sum \left( \frac{X_i - \bar{X}}{s} \right)^3$$

Where:

- $X_i$  = each observation
- $\bar{X}$  = mean of the data
- $s$  = standard deviation
- $n$  = number of observations

## ◆ What Is Kurtosis?

**Kurtosis** measures the "**peakedness**" or **flatness** of a data distribution compared to a normal (bell-shaped) distribution.



## ◆ Types of Kurtosis

There are **three main types**:

### 1 Normal Kurtosis

- **Reference shape**: Normal distribution
- Moderate **peak**, moderate **tails**

### 2 High Kurtosis

- **Tall, sharp peak**

- **Heavy tails**
- Most values are **tightly clustered** near the mean
- A few values are **extremely far** from the mean
- Indicates a **highly concentrated center** with **more extreme values**.

### 3 Low Kurtosis

- **Flat or broad peak**
- **Light tails**
- Data is **evenly spread**; there is **no strong central tendency**.

### Mathematical Definition

$$\text{Kurtosis} = \frac{n(n+1)}{(n-1)(n-2)(n-3)} \sum \left( \frac{X_i - \bar{X}}{s} \right)^4 - \frac{3(n-1)^2}{(n-2)(n-3)}$$

- Excess Kurtosis is often used:
  - $\text{Excess Kurtosis} = \text{Kurtosis} - 3$

### Exercise

#### For the Daily PM2.5 Concentration (µg/m³) in a City Over 15 Days

Day	PM2.5 Concentration (µg/m³)	Day	PM2.5 Concentration (µg/m³)
1	22	9	40
2	25	10	45
3	28	11	55
4	30	12	60
5	32	13	65
6	34	14	70
7	35	15	100
8	36		

Find:

### **1 Central Tendency**

- Calculate the **Mean** PM2.5 value
- Find the **Median**
- Determine the **Mode** (if any)

### **2 Dispersion**

- Find the **Range**
- Calculate the **Variance**
- Calculate the **Standard Deviation**

### **3 Shape Analysis**

- **Skewness**
- **Kurtosis:**