# **Understanding Forecastability in Time Series Analysis**

In the context of time series analysis, **forecastability** measures how predictable or stable a time series is. The more forecastable a time series, the easier it is to make accurate predictions about future values. Two key measures related to forecastability are **Apen Small** and **Spen Small**.

## 1. Apen Small (Approximate Entropy Small)

## • Definition:

Apen (Approximate Entropy) quantifies the unpredictability or randomness within a time series. When Apen is small, it indicates the data is less random and more regular or predictable.

## • Intuition:

- o If **Apen Small** is low, the time series has repetitive patterns, making it easier to forecast.
- o If **Apen Small** is high, the series is irregular or chaotic, making forecasting more challenging.

# 2. Spen Small (Standardized Entropy Small)

#### Definition:

Spen (Standardized Entropy) is another metric used to quantify the uncertainty in a time series. Like Apen, smaller Spen values suggest the series is more regular and easier to forecast.

## • Intuition:

- Spen Small focuses on measuring how deviations or variations within the series affect its predictability.
- o If Spen Small is low, the variations are well-structured and the series is predictable.

# Formula for Forecastability

The **forecastability** FFF of a time series can be expressed using a formula based on entropy measures like Apen or Spen. A common formula for forecastability is:

$$F = 1 - E$$

#### Where:

- E represents the entropy measure (such as Apen or Spen).
- F ranges from 0 to 1:
  - $\circ$  **F** = 1: The series is perfectly predictable (low entropy).
  - $\circ$  **F** = **0**: The series is completely unpredictable (high entropy).

#### Example Calculation of Forecastability

If the entropy (Apen or Spen) for a given time series is **0.2**, the forecastability FFF would be:

$$F = 1 - 0.2 = 0.8$$

This means the time series is 80% forecastable.

# **How Forecastability Works**

- 1. Compute Entropy (Apen or Spen):
  - o Measure the level of unpredictability in the time series.
- 2. Apply the Formula:
  - $\circ$  Use F = 1 –E to determine forecastability.
- 3. **Interpret Results:** 
  - o **High F (near 1):** Easier to forecast.
  - o Low F (near 0): Difficult to forecast.