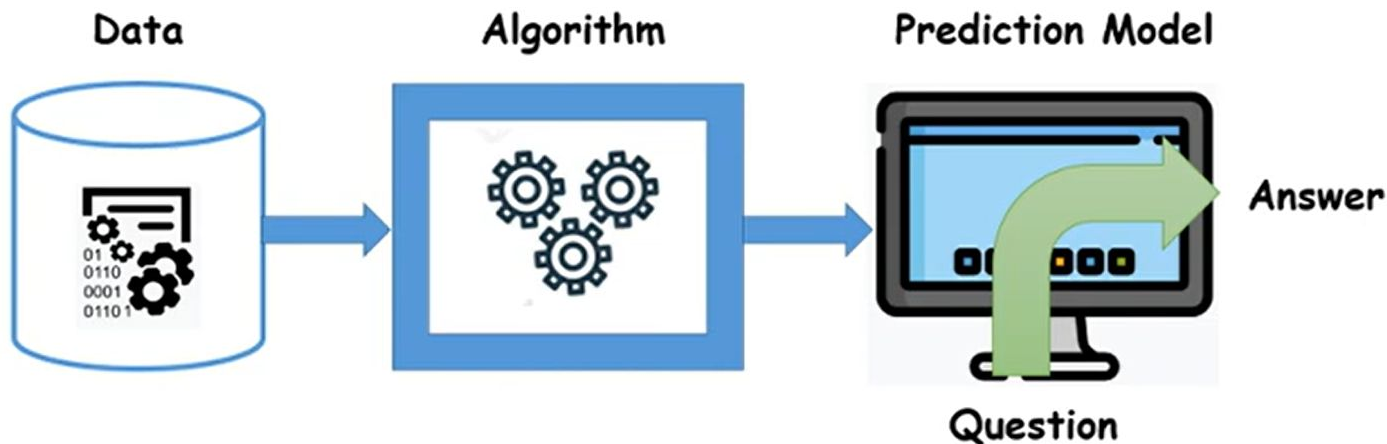


# Neuro Fuzzy System

CSE 4237  
Soft Computing

# **Modeling of Systems**

# What is machine learning?



# Why we need neural networks and fuzzy logic systems?

- In data and/ or information processing, the objective is generally to **gain an understanding** of the phenomena involved and to **evaluate relevant parameters quantitatively**.
- This is usually accomplished through “**modeling**” of the systems.
  - Either **experimentally or analytically** (using **mathematics** and **physical principles**)
- Once we have a model of system, we can carry out various procedures (for example, **sensitivity analysis, statistical regression**, etc.).

# Why we need neural networks and fuzzy logic systems?

- However, many situations are very complex and not well understood.
  - Physical measurements of the pertinent quantities are very difficult and expensive.
- These difficulties lead us to use of neural networks and fuzzy logic systems as a way of **obtaining models based on experimental measurements.**

# Neural networks

- Precise inputs and outputs
- Sufficient degrees of freedom
- Represent **complex nonlinear relationships** model
- Very good at classification of phenomena into **preselected categories**
- Precision of outputs is **sometimes** limited
- Minimization of least squares does not mean zero error
- **Time required** for proper training is still high

# Fuzzy Systems

- Reverse situations prevails compare to neural networks
- The **input and output variables** are encoded in **fuzzy representations**
- Interrelationships take the form of well-defined *if/then* rules

# Fuzzy systems - Advantages

- Address the impression of the input and output variables
  - Use fuzzy numbers and fuzzy sets that can be expressed in **linguistic terms** (e.g., cold, warm, and hot)
- Greater flexibility in formulating system descriptions
  - **Complex process behavior can be described in general terms**
- Fuzzy description are more parsimonious, easy to formulate and modify



# Neural networks and fuzzy logic systems

- Neural networks and fuzzy logic systems represent two distinct methodologies that deal with **uncertainty**.
  - These uncertainties usually arise from system complexity (complexity as a property of system description)
- Accomplish same results in different ways
- Can speed the unraveling and specifying the mathematical models
- Can be used to control nonlinear system
- Perform **mapping with some degree of impression**

**However, combination of the two technologies with the goal of gaining the advantages of both that is the focus of this soft computing course.**

# Neurofuzzy systems

- An integration of fuzzy logic and neural networks

## □ Advantages of neurofuzzy systems

- Addressing the problems of large complex systems.
- Ability to perform **many-to-many** mappings
- Dealt with in a flexible, reliable, and **near-optimal** manner.

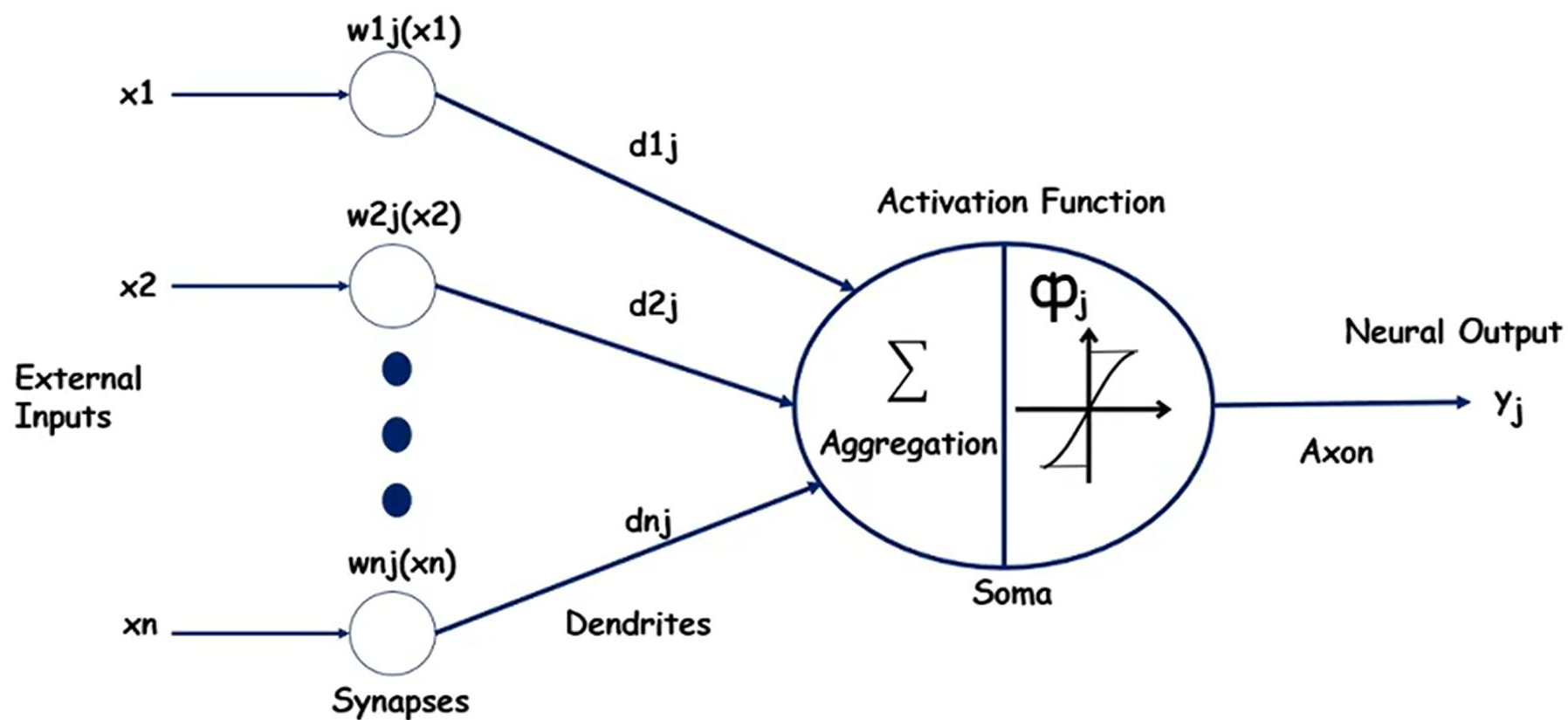
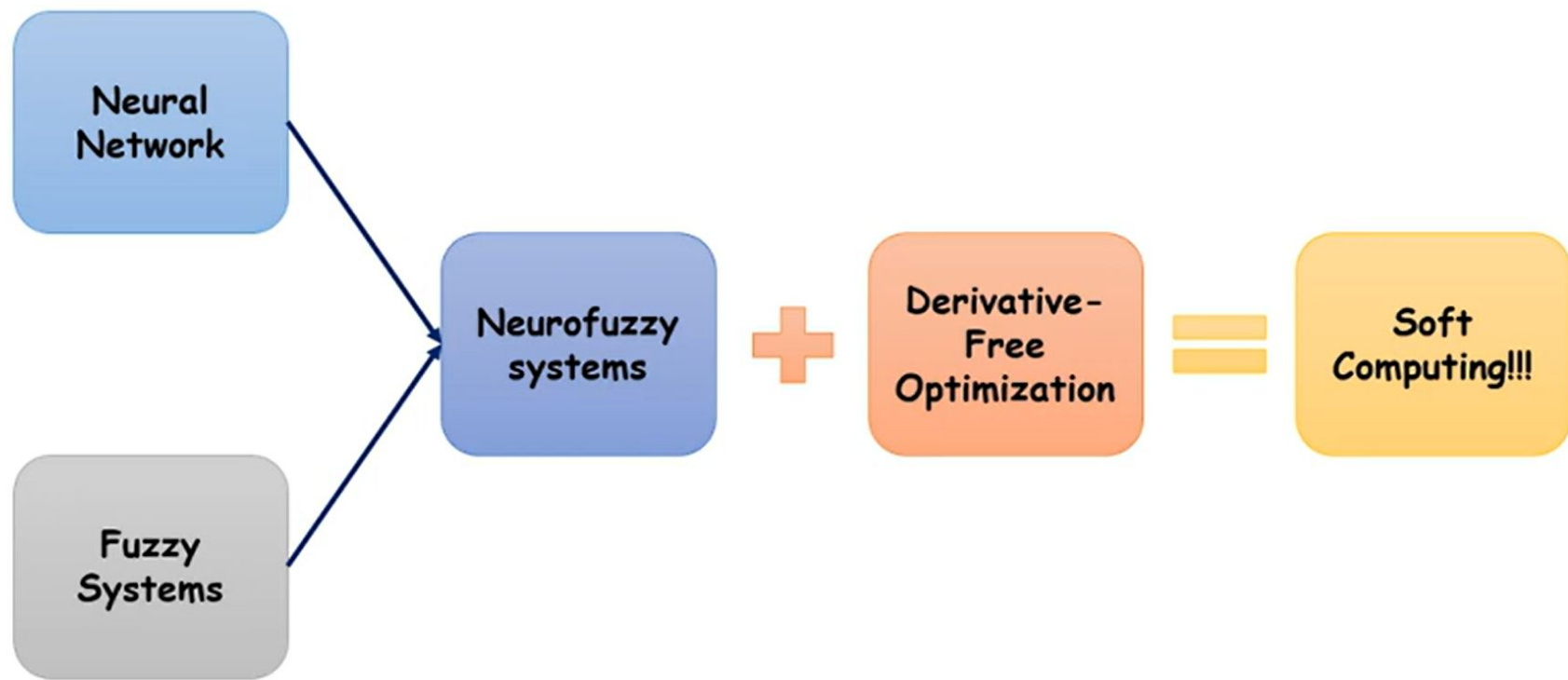
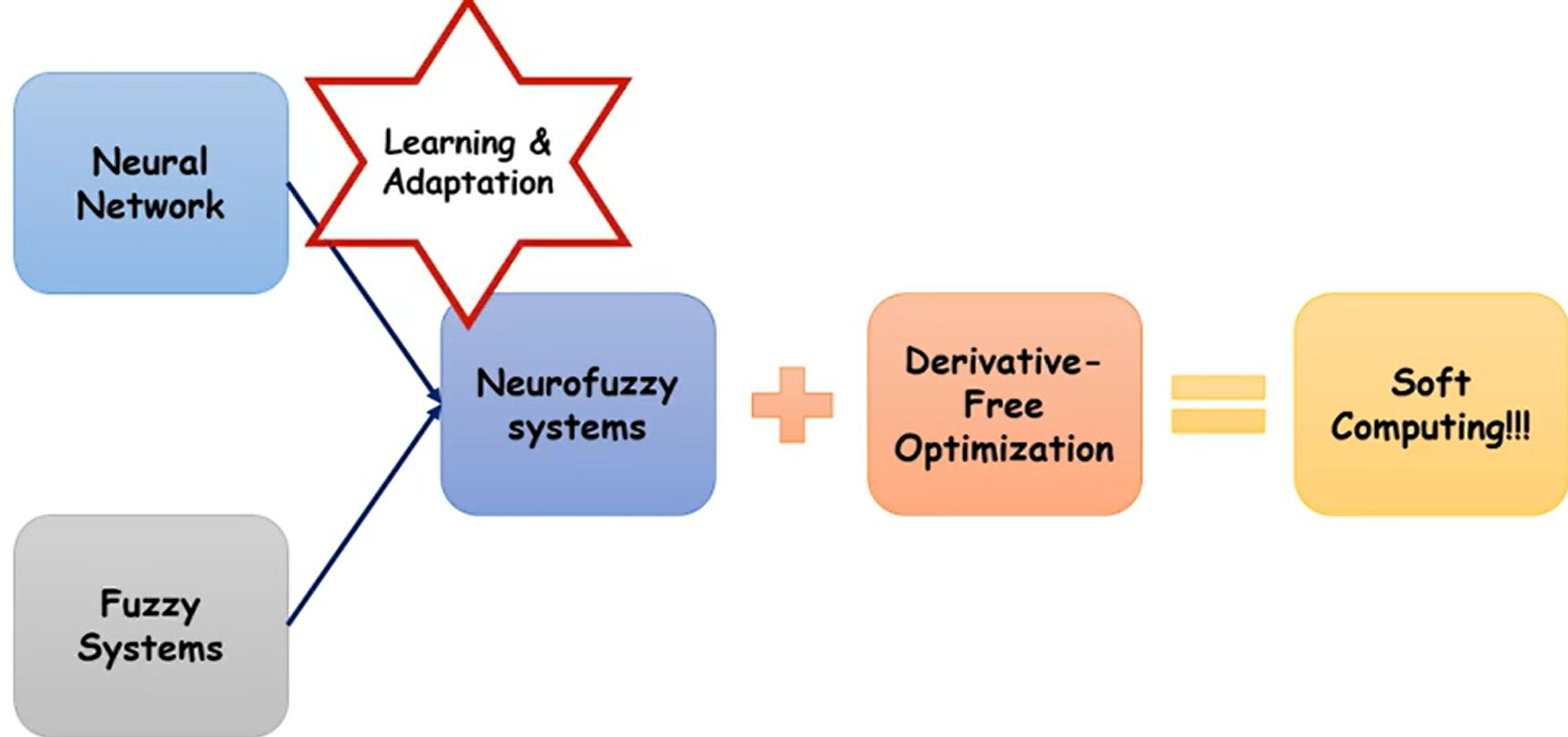
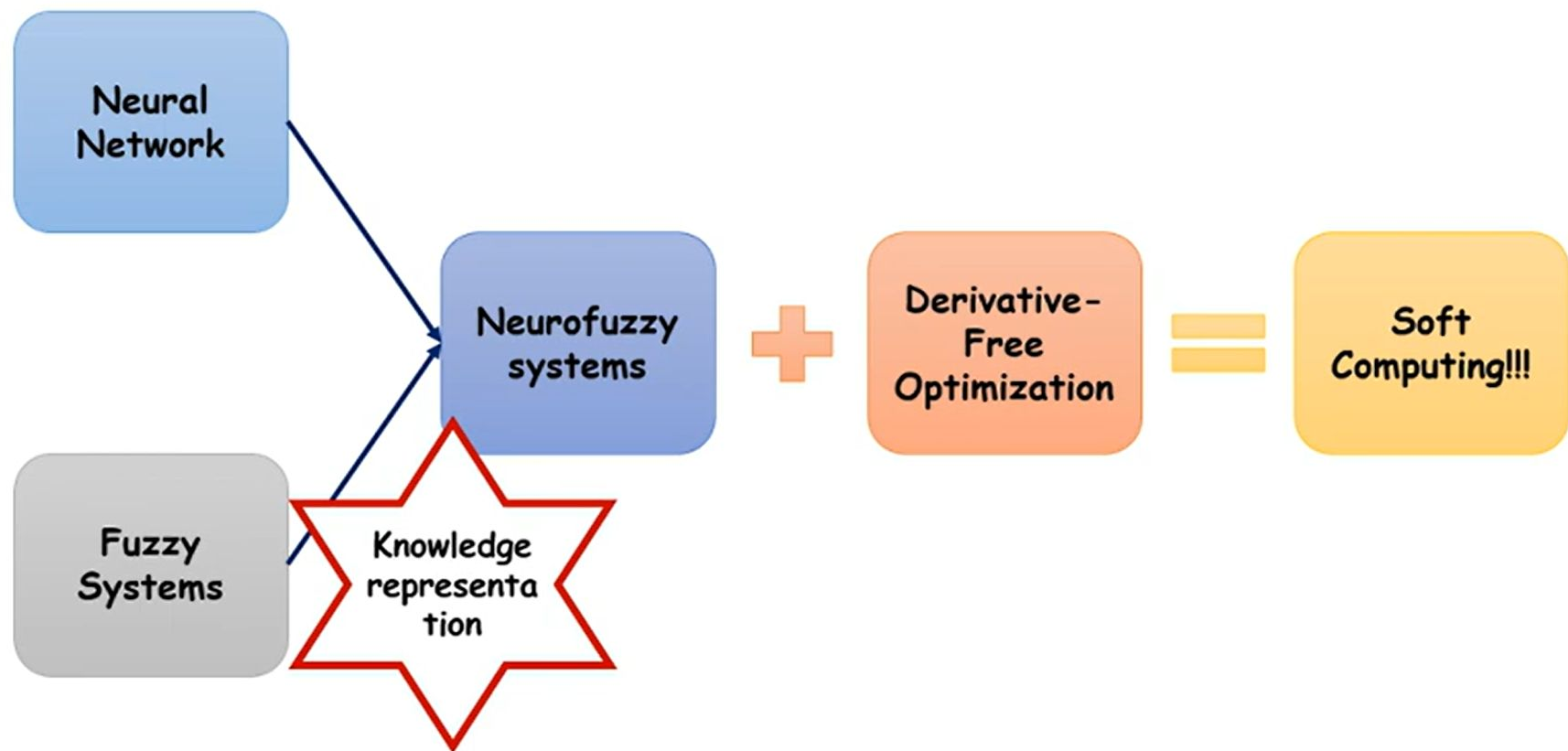
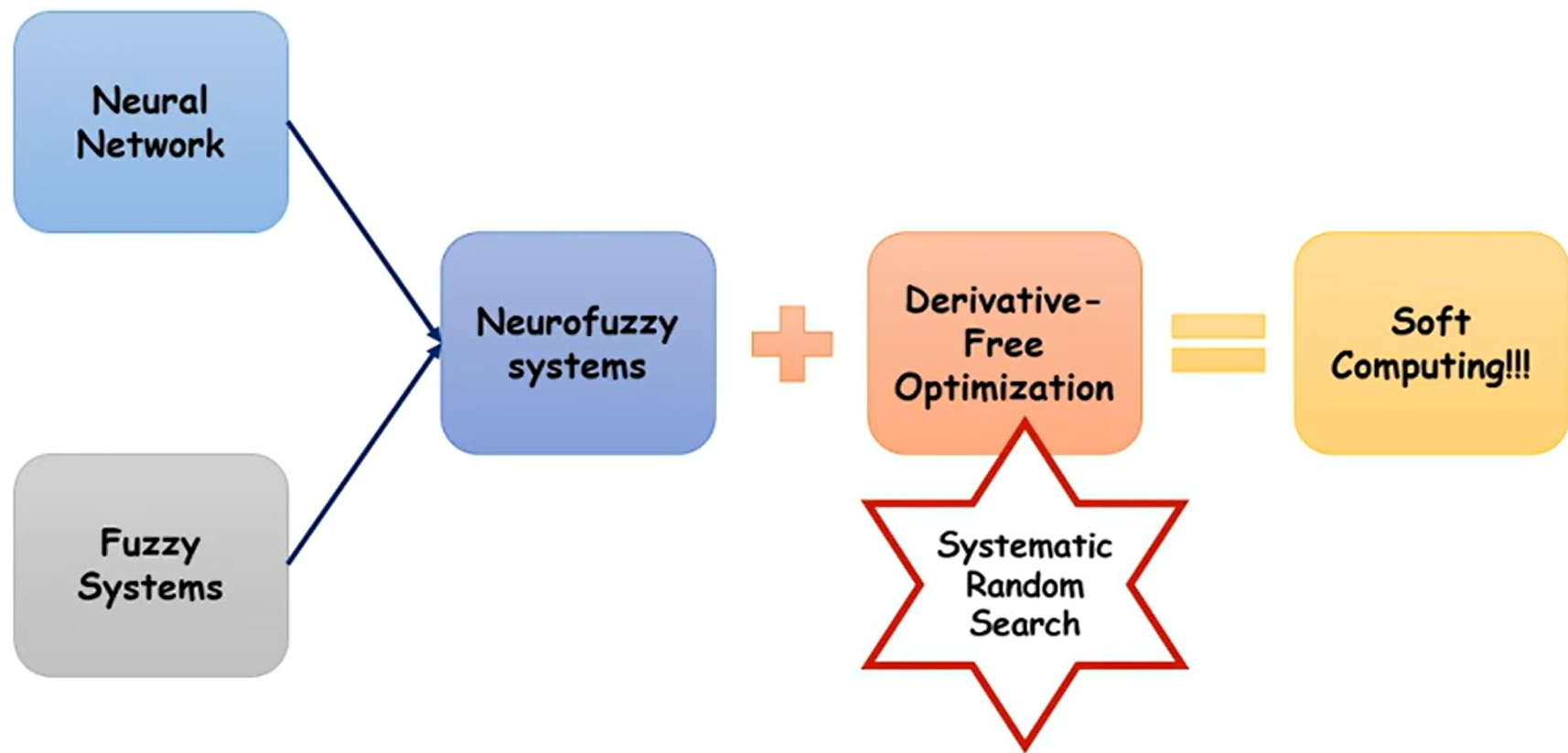


Figure: Simplified model of a neuron as an information processor.











# Soft Computing

❑ Can be characterized as:

- ✓ Human expertise (fuzzy if/then rules)
- ✓ Biologically inspired computing models (NN)
- ✓ Optimization techniques (GA, SA, etc.)
- ✓ Numerical computation