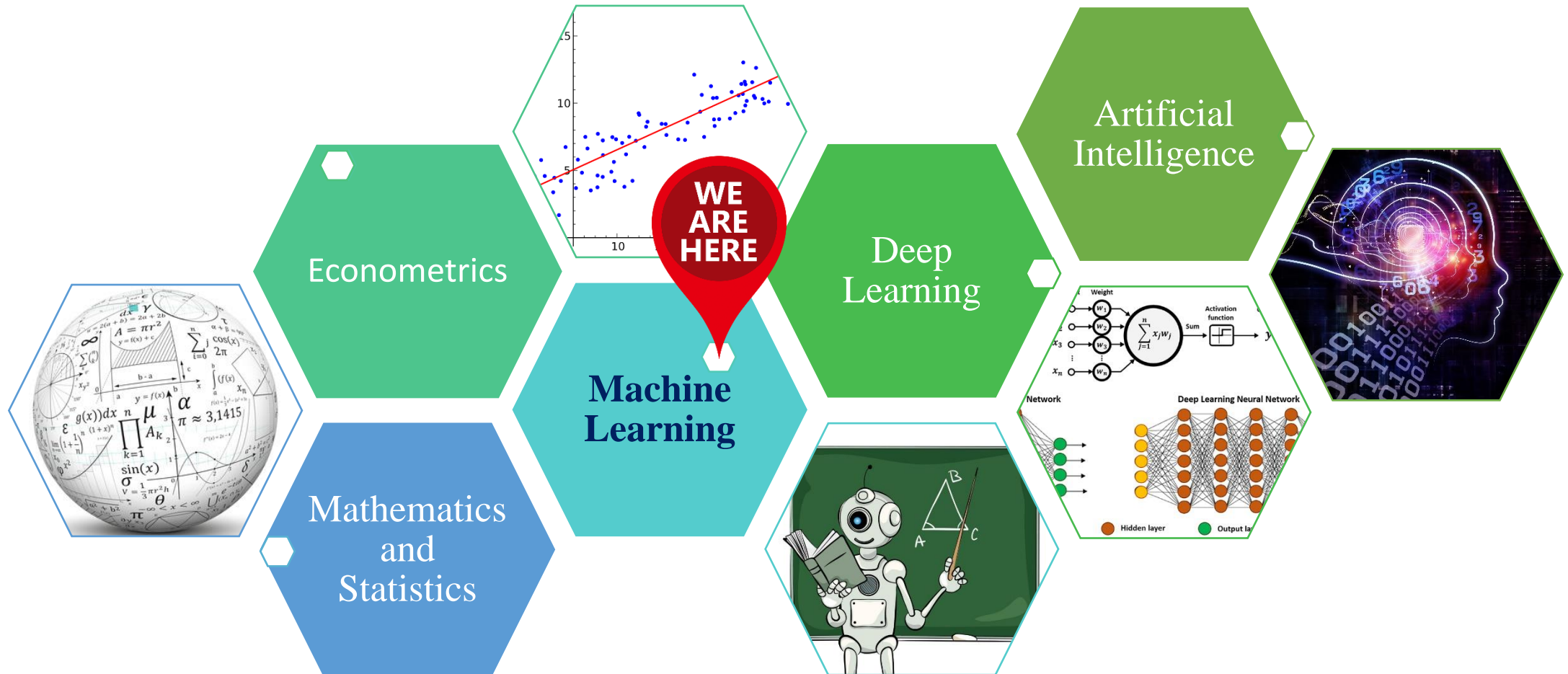
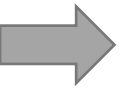
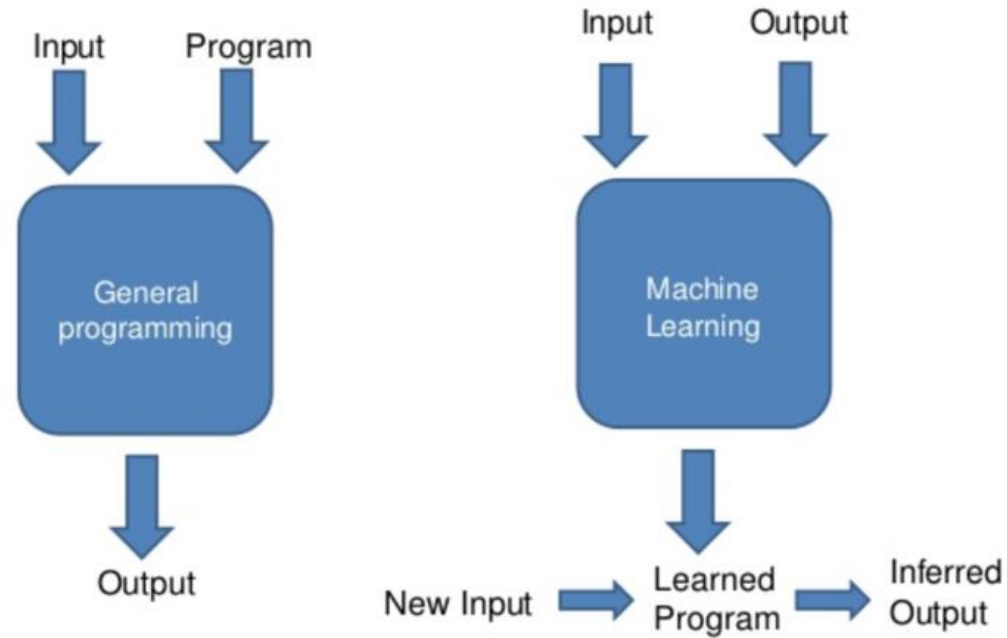
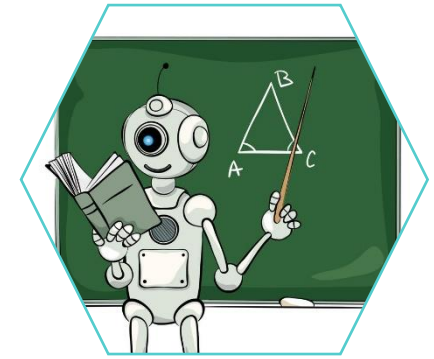


# Class 2- What is Machine Learning?





# General programming vs Machine learning



- Machine Learning: Involves automated detection of meaningful patterns in data and apply the pattern

# ➔ What is Machine Learning?

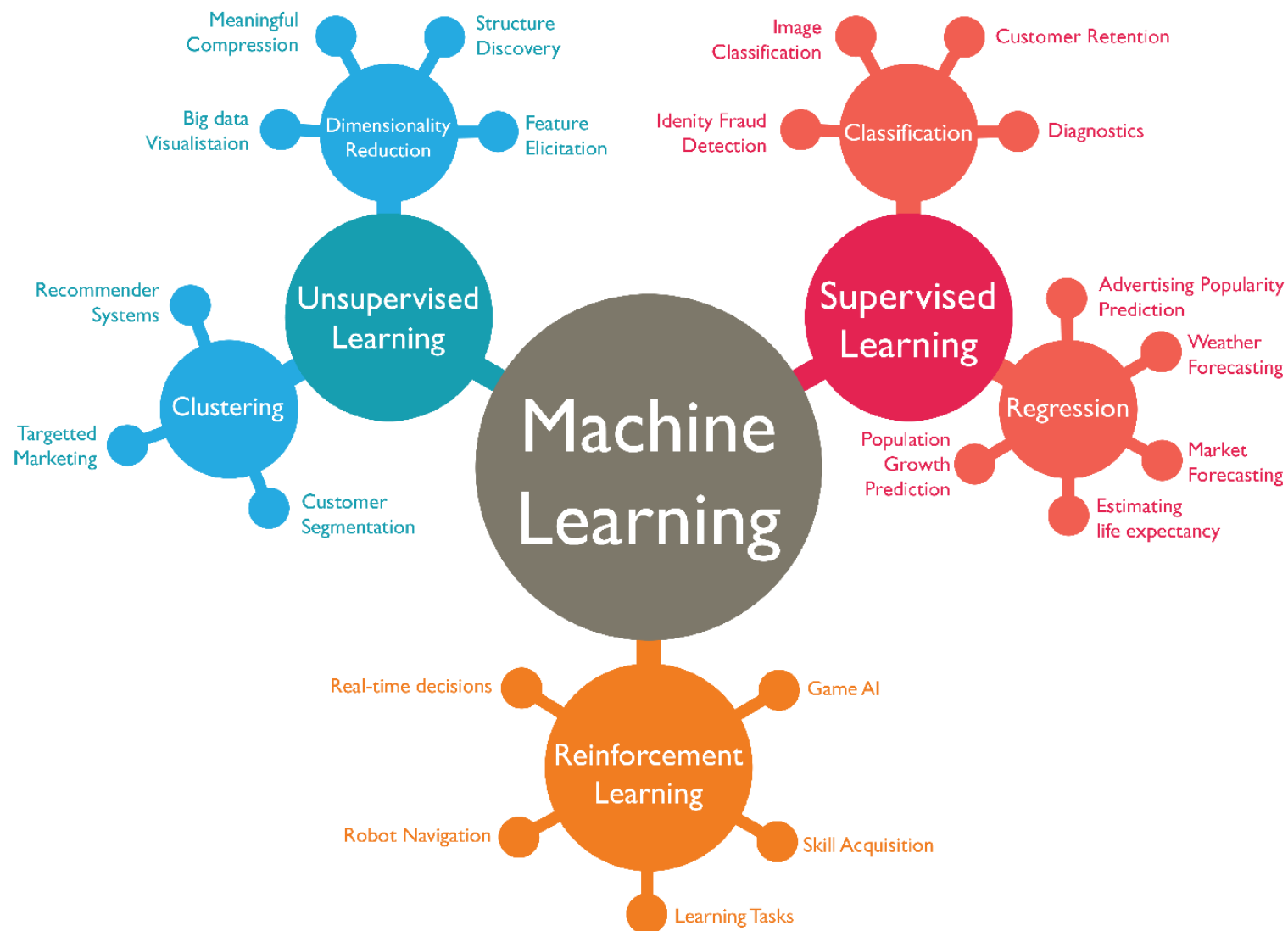
“A ML algorithm learns **complex patterns** in a **high dimensional** space **without being specifically directed**.” *Marcos Lopez De Prado: Advances in Financial Machine Learning* (2018, p.15)

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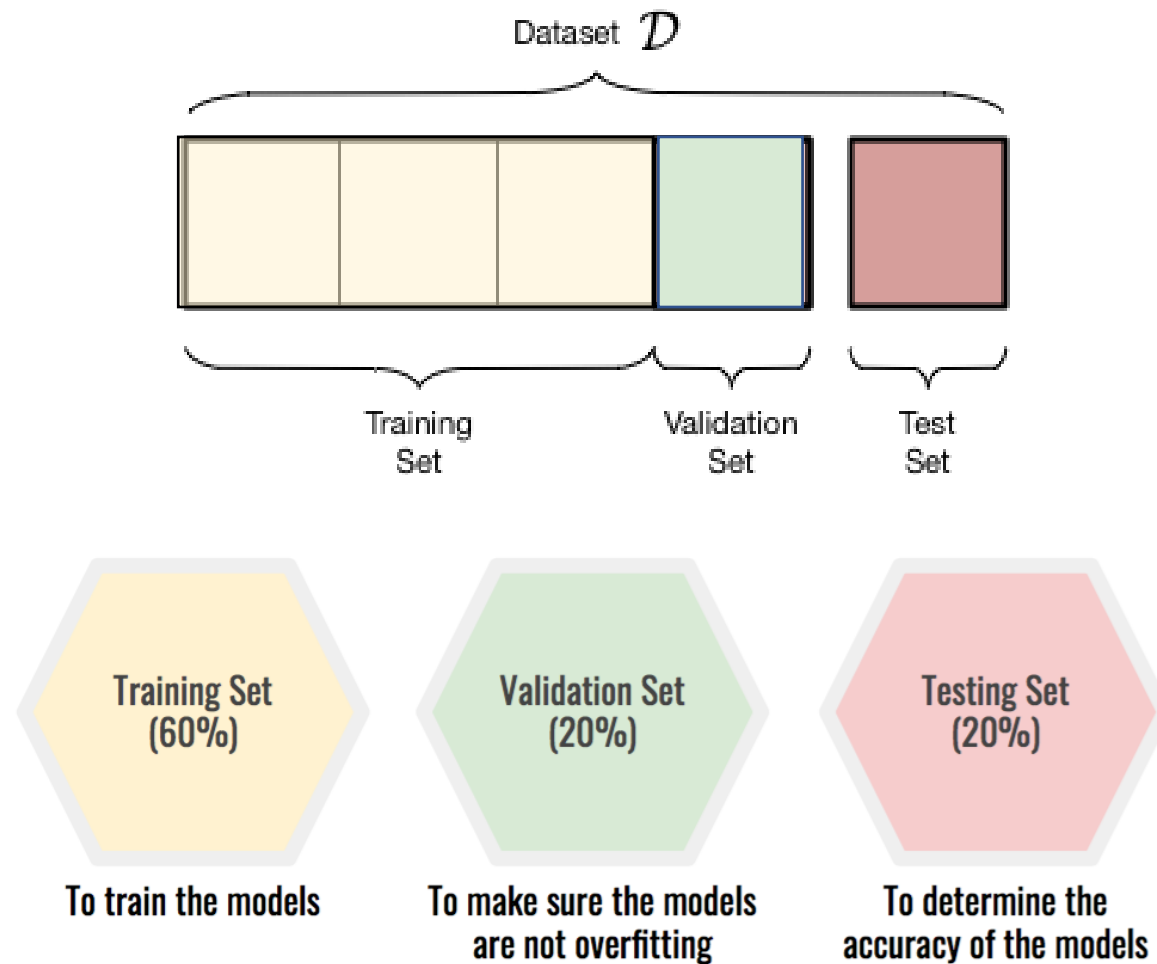
Let's break this statement into its components:

- ✓ **learns complex patterns**: The ML algorithm may find a pattern that cannot be easily represented with a finite set of equations.
- ✓ **learns ... in a high-dimensional space**: Solutions often involve many variables and the interactions between them.
- ✓ **learns ... without being specifically directed**: Unlike with other empirical tools, researchers do not impose a particular structure on the data. Instead, researchers let the data speak.

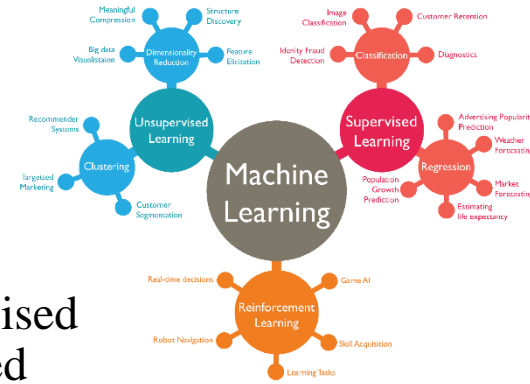
# Types of Machine Learning



# → Train, validation and test data



# Supervised Learning



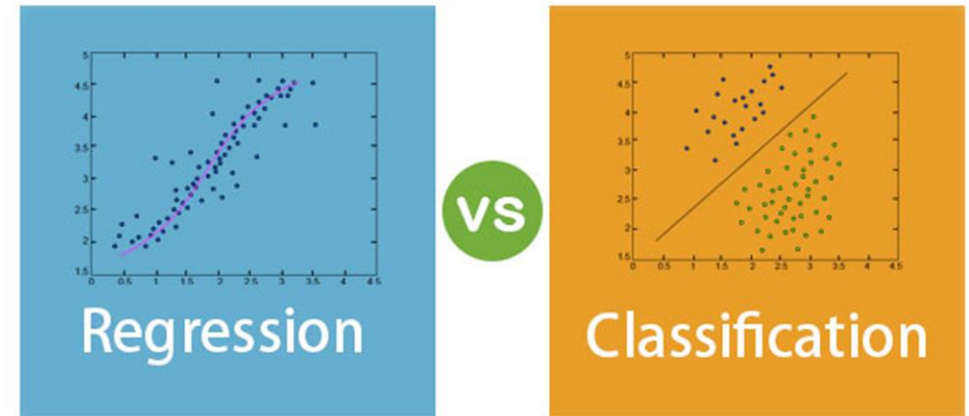
- In **supervised learning**, computers learn to model relationships based on **train data**. In supervised learning, **inputs and outputs are labeled** for the algorithm. After learning the pattern, the trained algorithms are used to predict outcomes for **test data**.

- **Regression:**

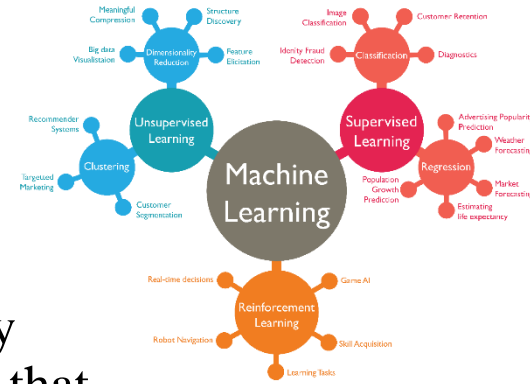
1. Predicting stock market returns
2. Predicting revenue growth
3. ....

- **Classification:**

1. Generating buy, sell, hold signals.
2. Likelihood of a successful M&A or IPO
3. Enhancing detection of fraud in financial statements
4. Classification on winning and losing funds or ETFs
5. ...



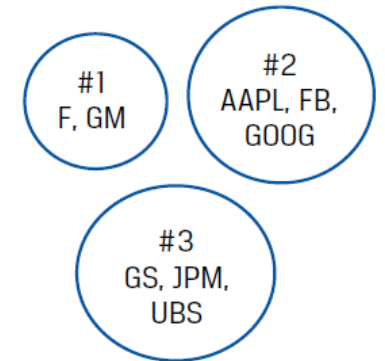
# ➔ Unsupervised Learning



- In **unsupervised learning**, computers are trained on **unlabeled train data** without any guidance. The goal is to discover the underlying patterns and find groups of samples that behave similarly. Examples:

- **Clustering:**

1. Grouping companies into peer groups based on some non-standard characteristics like financial statement data or corporate characteristics rather than sectors or countries.
2. Client profiling and asset allocation
3. Portfolio diversification and stock selection based on co-movements similarities



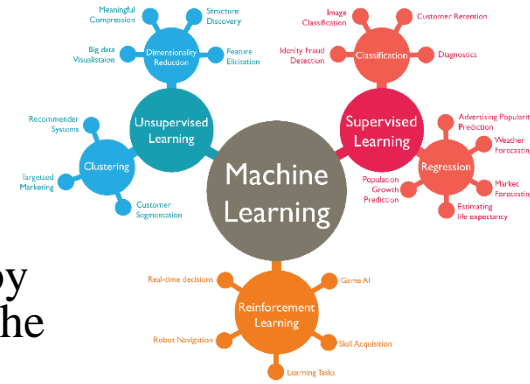
- **Dimensionality Reduction:**

1. Identify the most predictive factors underlying asset price movements (to avoid factor zoo)

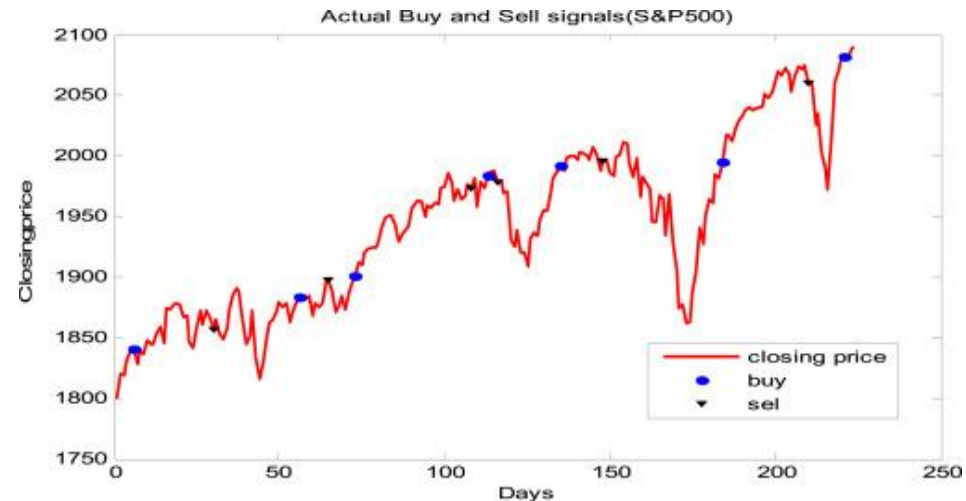
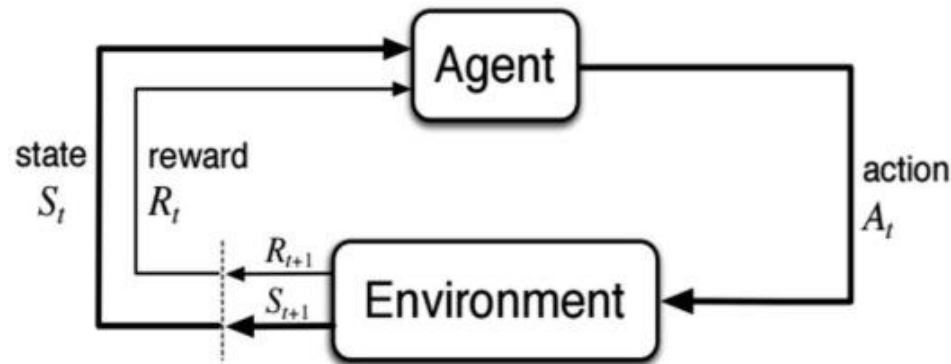




# Reinforcement Learning



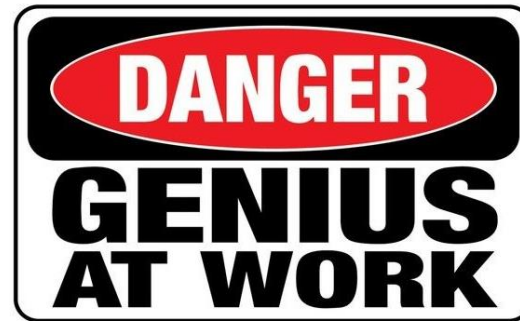
- In **reinforcement learning**, a computer (**agent**) learns from interacting with its **environment** by producing **actions** and discovering **rewards**. You need to define the environment, actions and the reward system. The machine will then explore and exploit to maximize the reward. The new actions may not be immediately optimal. The learning subsequently occurs through millions of trials and errors.



- Example: a virtual trader (agent) who follows certain trading rules (the actions) in a specific market (the environment) to maximize its profits (its reward).

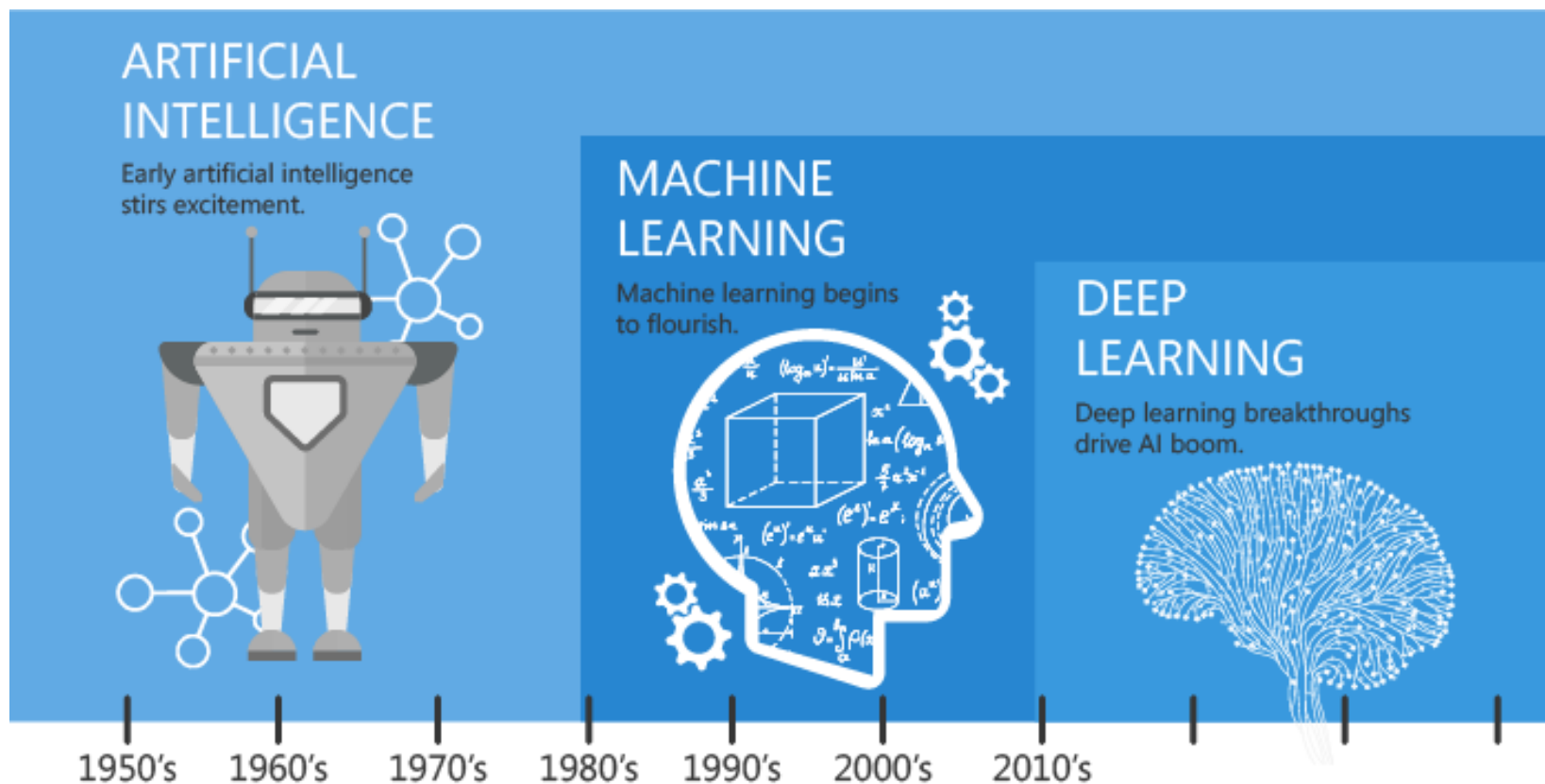


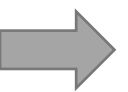
# → How are you doing so far?





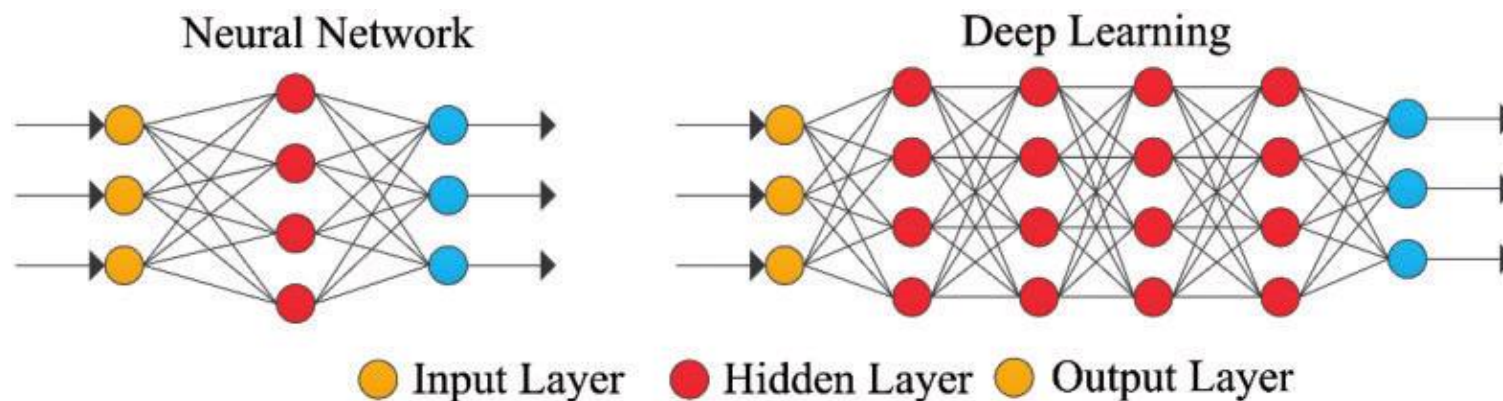
# AI vs ML vs DL





# Deep Learning

Deep learning is a subset of machine learning where artificial neural networks, algorithms inspired by the human brain, learn from large amounts of data.



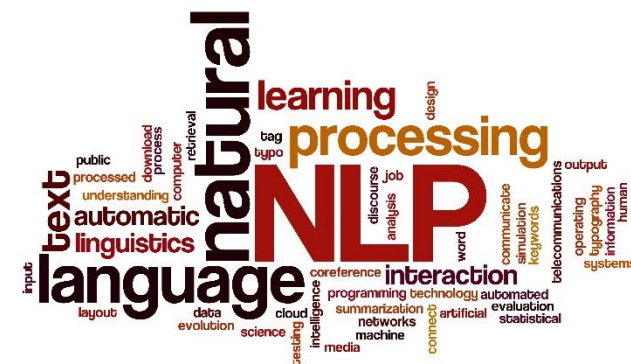
- Examples:

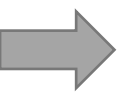
1. Image recognition algorithms can now analyze data from satellite-imaging systems to provide intelligence on the number of consumers in retail store parking lots,
2. Shipping activity and manufacturing facilities, and
3. Yields on agricultural crops.

➔ Natural Language Processing (NLP)

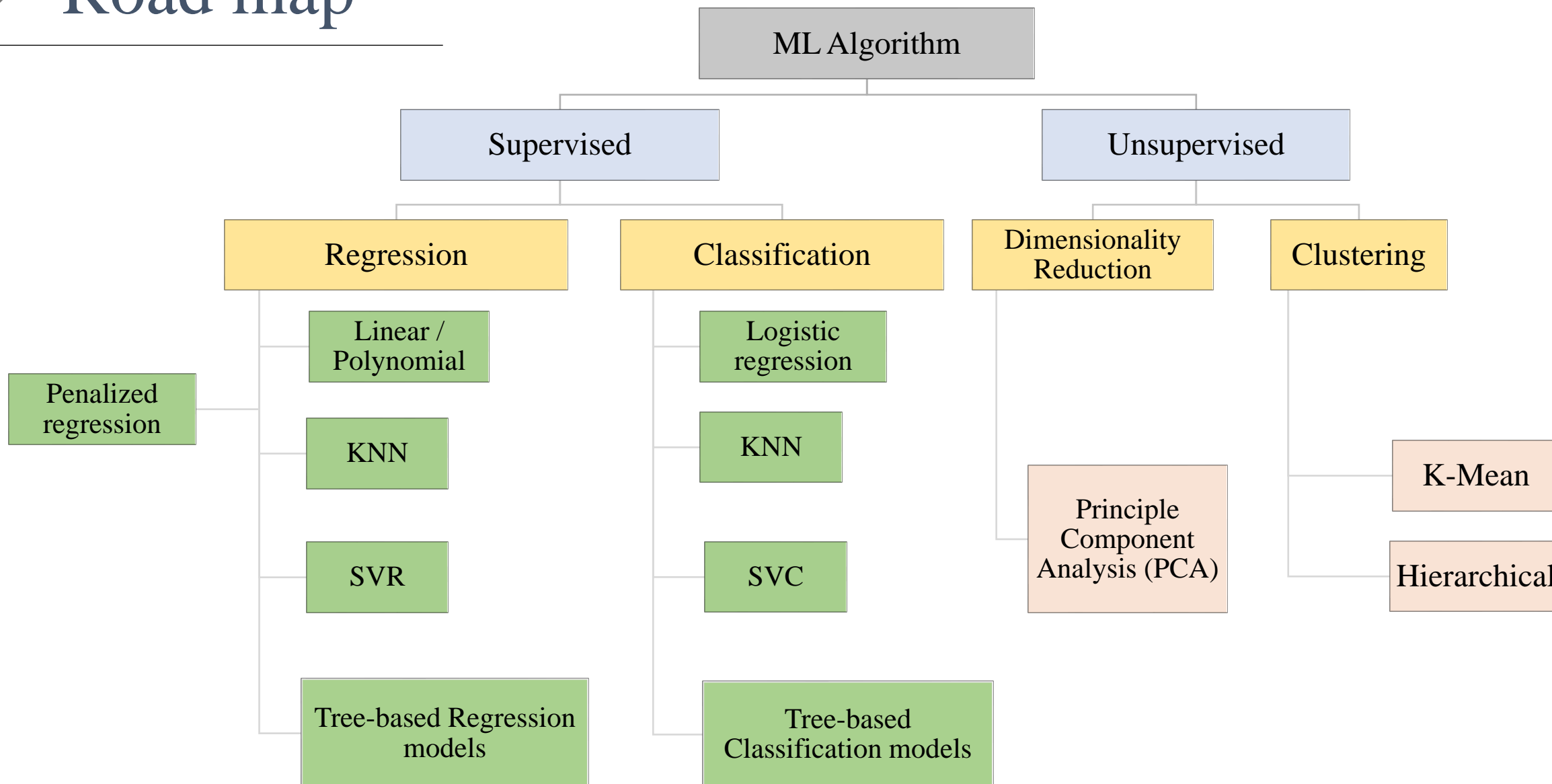
**NLP** is a field of research at the intersection of **computer science**, **artificial intelligence**, and **linguistics** that focuses on developing computer programs to analyze and interpret **human language**.

- Automated tasks using NLP include translation, speech recognition, text mining, sentiment analysis, and topic analysis.
- Examples:
  - Reading millions of pages of annual reports, thousands of hours of earning calls, transcripts, news articles and social media posts to identify trend in shorter timespans!
  - Analyzing communications and transcripts from policymakers (FED, ECB, ...) to provide insights around trending topics like interest rate policy, GDP, inflation expectation and etc
  - Chatbots answer basic retirement savings questions, learning from their interactions with investors.

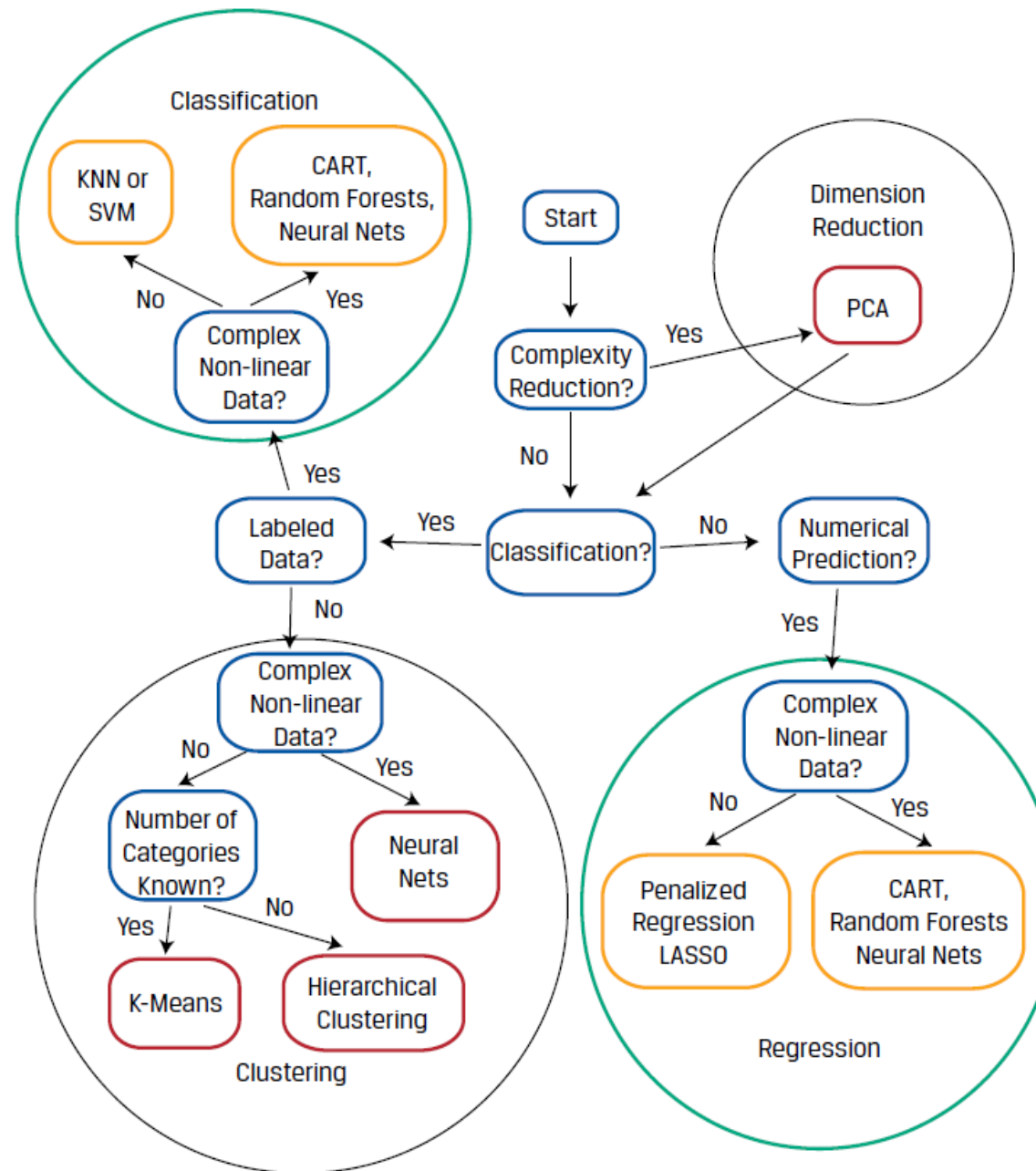


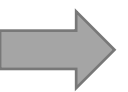


# Road map



## Exhibit 37 Stylized Decision Flowchart for Choosing ML Algorithms





# Having said that...

- **Warning:** A ML algorithm will always find a pattern, even if there is none.

