

SEMESTER EXAM – Machine Learning

Exercise 01 (6 pts):

A - Cite three cases where machine learning should be used instead of standard programming

1- Problems with no explicit or stable rules
2- Tasks involving unstructured data
3- Problems requiring probabilistic or approximate answers

B- Give three real-world applications that cannot be effectively solved using traditional rule-based programming, but can be successfully addressed using machine learning.

1- Image recognition
2- Speech recognition
3- Natural language understanding

C- Cite three essential topics in Machine Learning

1- Classification
2- Regression
3- clustering

Exercise 02: (14pts) Answer the following questions:

1. What does Machine Learning (ML) refer to, choose all correct answers?

- A. A computational paradigm in which models infer patterns and decision rules from data rather than relying solely on explicitly programmed logic.
- B. A subset of artificial intelligence that enables systems to improve their performance on a task through experience, without being explicitly programmed for each scenario.
- C. A collection of deterministic algorithms whose behavior and outputs are fully specified at design time.
- D. A set of statistical and optimization techniques used exclusively for descriptive data analysis, without predictive capabilities.
- E. An approach to problem solving in which model parameters are automatically adjusted based on data to optimize a defined objective function.
- F. A methodology focused on simulating human emotions and cognitive states directly within software systems.

2. Which of the following are essential elements for building a basic Machine Learning model? Choose all correct answers.

- A. A large dataset.
- B. A learning algorithm.
- C. A suitable programming framework or environment.
- D. Cloud storage infrastructure.
- E. High network bandwidth.
- F. A graphical processing unit (GPU).

3. Which statement best describes a regression model in Machine Learning? One correct answer.

- A. A model that classifies input data into a fixed set of discrete categories.
- B. A model that learns to predict continuous numerical outcomes based on input features.
- C. An unsupervised learning approach that groups similar data points into clusters.
- D. A deep learning model mainly designed for image and visual pattern recognition.
- E. A reinforcement learning approach that learns optimal actions through rewards and penalties.
- F. A statistical model used exclusively for text classification tasks.

4. Which of the following statements correctly describes the differences between supervised, unsupervised, and reinforcement learning? One correct answer.

- A. Supervised learning uses labeled data, unsupervised learning uses unlabeled data, and reinforcement learning involves learning through trial and error with rewards and penalties.
- B. Supervised learning uses unlabeled data, unsupervised learning uses labeled data, and reinforcement learning uses predefined rules.
- C. Supervised learning is used for classification tasks, unsupervised learning is only for clustering, and reinforcement learning is used only in robotics.
- D. Supervised learning uses rules to make decisions, unsupervised learning learns directly from outcomes, and reinforcement learning learns from historical data.

5. Dataset Analysis: Energy Consumption Prediction (4 points)

The following dataset represents daily energy consumption for different buildings.

Building_ID	Outdoor_Temperature (°C)	Occupancy	Operating_Hours	Building_Size (m²)	Energy_Consumption (kWh)
B001	15	120	10	1500	320
B002	30	200	12	2200	610
B003	10	80	8	1200	250
B004	25	160	11	1800	520
B005	18	100	9	1400	300

The objective is to **predict the Energy_Consumption** using the remaining variables.

5.1 Learning Paradigm: Which type of learning paradigm best describes this problem?

- A. Supervised Learning
- B. Unsupervised Learning
- C. Reinforcement Learning

5.2 Machine Learning Task: Which Machine Learning task is most appropriate for this problem?

- A. Classification
- B. Regression
- C. Clustering
- D. Dimensionality Reduction
- E. Anomaly Detection

5.3 Target Variable: Identify the target (output) variable in the dataset.

..... **Energy_Consumption**

6. Scenario: Smart Traffic Light Optimization

A city is developing a **smart traffic light system** called **SmartFlow**. The system adjusts the duration of traffic lights based on traffic conditions. After each adjustment, the system receives feedback in the form of a reward.

Attempt_ID	Green_Light_Duration (s)	Traffic_Density (cars/min)	Average_Wait_Time (s)	Reward
1	30	45	80	-6
2	40	50	55	+3
3	50	60	35	+9
4	25	40	90	-8
5	45	55	40	+7

- **Positive rewards** indicate reduced congestion and smoother traffic flow.
- **Negative rewards** indicate increased waiting time and traffic congestion.

Which type of Machine Learning model is most suitable for optimising the traffic light system through repeated interaction with its environment?

..... **Reinforcement Learning model**

What is the main objective of the learning process in this scenario?

- A. To classify traffic density into predefined categories
- B. To minimise average vehicle waiting time over time
- C. To cluster similar traffic patterns
- D. To predict future traffic density without interaction

7. Advanced Scenario: Predicting production in Modern Agriculture

An agricultural scientist is developing a system to **estimate production per hectare** based on environmental and soil conditions.

Field_ID	Soil_Moisture (%)	Nitrogen_Level (ppm)	Rainfall (mm)	Production (tons/ha)
F001	35	42	520	6.2
F002	28	30	410	4.8
F003	40	50	600	7.1

Two different learning strategies are considered for predicting the yield of a new field:

- **Strategy A:**
The system assumes that crop yield can be represented by a fixed functional relationship between the input variables and the output. Training consists of estimating a limited set of parameters, which are then used to make predictions.
- **Strategy B:**
The system does not build an explicit global model. Instead, it stores historical field data and predicts yield for a new field by identifying and averaging the yields of the most similar fields.

Which option correctly characterizes **Strategy A** and **Strategy B**?

- A. Strategy A → Instance-based learning, Strategy B → Model-based learning
B. Strategy A → Model-based learning, Strategy B → Instance-based learning
C. Strategy A → Unsupervised learning, Strategy B → Supervised learning
D. Strategy A → Clustering-based approach, Strategy B → Classification-based approach

Suppose now the estimated model is:

$$\hat{y} = 0.5267 SM + 0.0967 N - 0.03133 R$$

(Where SM=Soil_Moisture, N=Nitrogen_Level, R=Rainfall.)

Using the model above, evaluate its performance using **RMSE (the Root Mean Square Error)**.

$$RMSE = \sqrt{\frac{1}{n} \sum_{i=1}^n (\hat{Y}_i - Y_i)^2}$$

$$RMSE \approx 0.0043 \text{ tons per hectare}$$