Machine Learning Engineer (0-2 Years Experience) – Assessment Task

Objective

The purpose of this assessment is to evaluate the candidate's ability to preprocess data, train and evaluate machine learning models, deploy a simple model as an API, and follow basic MLOps practices.

Task: Build and Deploy a Machine Learning Model for Predicting House Prices

Instructions:

You are provided with a dataset containing house attributes and their corresponding prices. Your task is to:

- 1. **Preprocess the data** (handle missing values, feature engineering, scaling, encoding, etc.).
- 2. Train and evaluate a regression model that predicts house prices.
- 3. **Optimize the model** using hyperparameter tuning.
- 4. Deploy the model as a REST API using Flask or FastAPI.
- 5. Write a short report explaining your approach, decisions, and model performance.

Dataset

You can use any publicly available dataset such as **Kaggle's House Price Prediction Dataset** or **California Housing Dataset (from Scikit-learn)**.

Part 1: Data Preprocessing

- Load the dataset and perform exploratory data analysis (EDA).
- Handle missing values appropriately.
- Perform feature engineering (scaling, encoding categorical variables, feature selection).
- Visualize correlations between features and the target variable.

Part 2: Model Training & Evaluation

- Split the dataset into training and testing sets.
- Train a **regression model** (e.g., Linear Regression, Decision Tree, Random Forest, XGBoost).
- Evaluate the model using RMSE, MAE, and R² scores.

- Optimize the model using GridSearchCV or RandomizedSearchCV.
- Save the trained model using Pickle or Joblib.

Part 3: Model Deployment

- Build a simple Flask or FastAPI application to serve predictions.
- Create an endpoint /predict that takes input features as JSON and returns the predicted price.
- Test the API using Postman or CURL.
- Containerize the application using **Docker (optional for bonus points)**.

Part 4: Report & Documentation

- Provide a brief report explaining:
 - Steps taken for data preprocessing and feature engineering.
 - Model selection and optimization approach.
 - Deployment strategy and API usage guide.
- Include clear and well-commented code in a GitHub repository or a Jupyter Notebook.

Bonus Points (Optional)

- Implement logging and error handling in the API.
- Deploy the API on AWS/GCP/Azure or Render.
- Use **DVC or MLflow** for model versioning.
- Create a simple **frontend UI** to interact with the model.

Submission Guidelines

- Submit a **GitHub repository** containing:
 - Jupyter Notebook (.ipynb) or Python scripts (.py).
 - A README . md with clear instructions on running the project.
 - Model file (.pkl or .joblib).
 - Flask/FastAPI script (app.py).
 - Dockerfile (if applicable).
- Provide a link to a hosted API (if deployed).