

Project 2: Breast Cancer Prediction Documentation

Data Preprocessing

1. **Data Loading:**
 - Loaded the dataset from data.csv.
 - Inspected the first and last few rows, dataset information, and summary statistics.
2. **Handling Missing Values:**
 - Removed the column Unnamed: 32 as it contained no useful data.
 - Dropped the id column since it was not useful for analysis.
3. **Outliers Removal:**
 - Calculated the Interquartile Range (IQR) for each numerical feature.
 - Filtered out rows where feature values were outside the bounds defined by the IQR.
4. **Data Type Conversion and Scaling:**
 - Converted the categorical diagnosis column into numerical values (Malignant: 1, Benign: 0).
 - Standardized numerical features using StandardScaler to normalize their scales.

Feature Engineering

1. **New Features Created:**
 - **radius_texture_mean:** Ratio of radius_mean to texture_mean.
 - **area_perimeter_mean:** Ratio of area_mean to perimeter_mean.
 - **smoothness_compactness_mean:** Product of smoothness_mean and compactness_mean.
 - **radius_worst_area_worst:** Ratio of radius_worst to area_worst.
 - **compactness_concavity_mean:** Product of compactness_mean and concavity_mean.

Feature Selection

1. **Correlation Analysis:**
 - Selected features based on their correlation with the diagnosis column.
 - Used a correlation threshold of 0.5 to determine relevance.
2. **Selected Features:**
 - Included features with an absolute correlation greater than the threshold.

Machine Learning Model

1. **Model Training and Tuning:**

- Used Support Vector Machine (SVM) with hyperparameter tuning via GridSearchCV.
- Optimized hyperparameters: C, kernel, and gamma.

2. Performance Metrics:

- **Accuracy:** 91%
- **Confusion Matrix:**
 - True Positives (Malignant): 27
 - True Negatives (Benign): 82
 - False Positives: 4
 - False Negatives: 7
- **Classification Report:**
 - Precision, Recall, and F1-score for both classes (Benign and Malignant).

Challenges and Observations

1. Challenges:

- Handling outliers effectively while maintaining data integrity.
- Deciding on the appropriate correlation threshold for feature selection.

2. Observations:

- The model achieved a high accuracy of 91%, indicating strong performance.
- The confusion matrix and classification report highlighted good precision and recall, with minor improvements needed in predicting malignant cases.