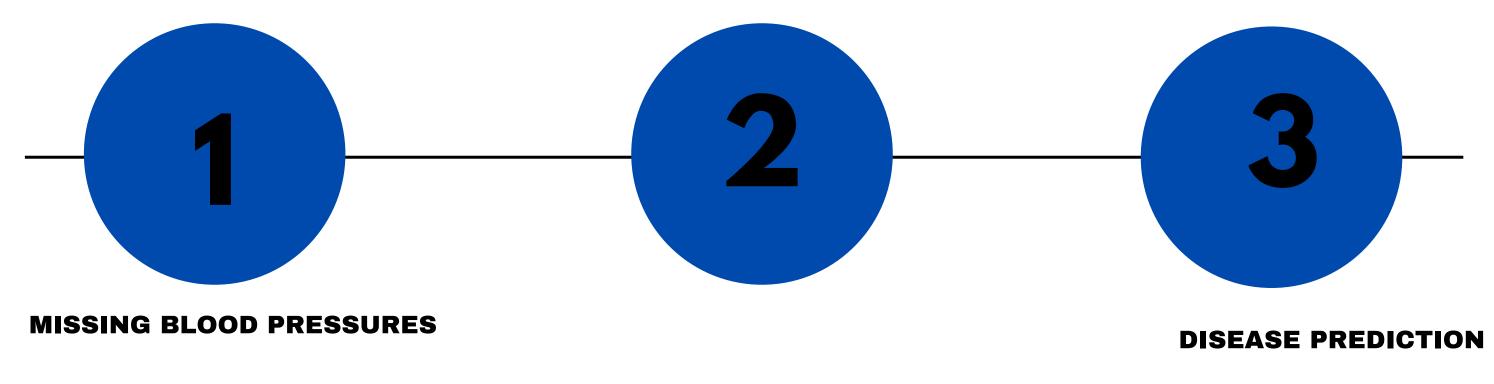
DIABETES PREDICTION

Project submission

Presented by: Group 6

MACHINE LEARNING TUNING

3 CRITICAL ASPECTS TO SOLVE



UNBALANCED TARGET VARIABLES

MODEL INTERPRETABILITY AND EMPERICAL TUNING

BLOOD PRESSURE IMPUTATION - FEMALE ONLY

VISUALIZE RELATIONSHIPS

Features and their description

- 1. Pregnancies Number of times the person conceived
- 2. Fasting Glucose 8 hrs of fasting
- 3. Age In years -> 21 and up
- 4. BMI weight in kg / Height in meters^2
- 5. Family History 0 for no Family history in diabetes, 1 if there is family history
- 6. Waist to hip ratio = Waist / Hips in cm
- 7. Bloodpressure Diastolic blood pressure (mm Hg)
- 8. Outcome 0 for not diabetic and 1 if diabetic (Target Variable)

BloodPressure Age	1.000000 0.281644	LIME Feature Import Feature	ance Matrix for B		
BMI	0.227042	5 Age	2.464679		
WaistToHipRatio	0.205303	2 BMI	1.783704		
Pregnancies	0.186144	4 FamilyHistory	1.215964		
Glucose	0.111212	3 WaistToHipRatio	0.608275		
FamilyHistory	0.071707	1 Glucose	0.287391		
Outcome	0.043079	0 Pregnancies	0.191928		
Name: BloodPressure, dtype: float64					

Predicted value	negative Age <= -0.94	positive	Feature	Value
62.36 (min) 65.26	84.05 4.46 BMI <= -0.73		Age	-1.30
(5.20	3.06 FamilyHistory <= -0.31		BMI	-1.30
		istToHipRatio <=	FamilyHistory	-0.31
		1.00	WaistToHipRatio	-1.47
	0.16	51 < Glucose <= -0.19	Pregnancies	-0.84
	o.:		Glucose	-0.33



Feature	Correlation Rank	LIME Importance Rank
Age	1	1
BMI	2	2
WaistToHipRatio	3	4
FamilyHistory	6	3
Glucose	5	5
Pregnancies	4	6

```
feature_sets = {
    "Set 1 (Age,BMI,WaistToHipRatio)": ['Age', 'BMI', 'WaistToHipRatio'],
    "Set 2 (Age Only)": ['Age'],
    "Set 3 (All Features Except Outcome)": ['Age', 'BMI', 'WaistToHipRatio', 'Pregnancies', 'Glucose', 'FamilyHistory']
}
```

```
# Step 1: Perform 80/20 split
BP_X = data[features]
BP_y = data['BloodPressure']
BP_X_train_80, BP_X_test_20, BP_y_train_80, BP_y_test_20 = train_test_split(BP_X, BP_y, test_size=0.2, random_state=42)

# Step 2: Perform 60/20 split on 80% training data
BP_X_train_60, BP_X_val_20, BP_y_train_60, BP_y_val_20 = train_test_split(BP_X_train_80, BP_y_train_80, test_size=0.25, random_state=42)

# Step 3: Scale data
scaler = StandardScaler()
BP_X_train_60_scaled = scaler.fit_transform(BP_X_train_60)
BP_X_val_20_scaled = scaler.transform(BP_X_val_20)
BP_X_test_20_scaled = scaler.transform(BP_X_test_20)

# Step 4: Train model on 60% training data (only rows with non-missing y)
BP_train_complete = BP_X_train_60_scaled[BP_y_train_60.notna()]
BP_y_train_complete = BP_y_train_60|BP_y_train_60.notna()]
```

Missing values successfully filled!

Chosen Feature Set for Imputation of BloodPressure: ['Age', 'BMI', 'WaistToHipRatio']

Feature Set	R-squared (Validation)	MSE (Validation)	R-squared (Test)	MSE (Test)
Set 1 (Age,BMI,WaistToHipRatio)	0.094433	100.519790	0.086290	102.787343
Set 2 (Age Only)	0.073139	102.883468	0.066154	105.052557
Set 3 (All Features Except Outcome)	0.094287	100.535924	0.088351	102.555416

MODEL INTERPRETABILITY AND EMPERICAL TUNING

BLOOD PRESSURE IMPUTATION - ALL GENDER

VISUALIZE RELATIONSHIPS

Features and Their Descriptions

- Pregnancies Number of times the person conceived.
- Glucose 2 hours of fasting.
- BloodPressure Diastolic blood pressure (mm Hg).
- SkinThickness Measurement of Triceps Skinfold Thickness (mm):
- Insulin Fasting insulin levels (μU/mL). Normal range: 2–25 μU/mL.
- BMI Body Mass Index (weight in kg / height in meters²):
- Family History 0 for no family history in diabetes, 1 if there is family history.
- Age In years, ranging from 1 to 85.
- Outcome 0 for not diabetic and 1 if diabetic (Target Variable).

BloodPressure	1.000000	LI	ME Results All	Genders:
Outcome	0.335337		Feature	LIME Importance
BMI	0.283767	5	FamilyHistory	2.865276
Glucose	0.223614	6	Pregnancies	2.272630
Insulin	0.204414	1	Glucose	1.854726
Age	0.201559	ø	BMI	1,396009
SkinThickness	0.100627	3	Age	0.696293
FamilyHistory	0.097086	2	Insulin	0.460933
Pregnancies	-0.022024			
Name: BloodPress	sure, dtype: float64	4	SkinThickness	0.063152

LIME Results All Genders: Predicted value	negative positive	Feature	Value
69.05 (min) 71.43	FamilyHistory <= -0.19 85.44 294 (max) BMI <= -0.57 2.50 Pregnancies <= -0.05 Age <= -0.73 1.47 SkinThickness <= -0.80 0.12	FamilyHistory BMI Pregnancies Glucose Age SkinThickness Insulin	-0.19 -1.57 -0.05 -0.26 -1.27 -1.48 0.10

Feature	Correlation Rank	LIME Importance Rank
Age	1	1
BMI	2	2
WaistToHipRatio	3	4
FamilyHistory	6	3
Glucose	5	5
Pregnancies	4	6

```
feature_sets = {
    "Set 1 (BMI, Glucose, Insulin, Age)": ['BMI', 'Glucose', 'Insulin', 'Age'],
    "Set 2 (BMI Only)": ['BMI'],
    "Set 3 (All Features Except Outcome)": ['Age', 'Pregnancies', 'Glucose', 'SkinThickness', 'Insulin', 'BMI', 'FamilyHistory']
}
```

Missing values successfully filled!

Chosen Feature Set for Imputation of BloodPressure:
['Age', 'Pregnancies', 'Glucose', 'SkinThickness', 'Insulin', 'BMI', 'FamilyHistory']

Feature Set	R-squared (Validation)	MSE (Validation)	R-squared (Test)	MSE (Test)
Set 1 (BMI, Glucose, Insulin, Age)	0.119334	47.845930	0.124019	48.036539
Set 2 (BMI Only)	0.076599	50.167707	0.080864	50.403078
Set 3 (All Features Except Outcome)	0.125836	47.492698	0.130732	47.668442

```
# Define parameter grid for tuning
param_grid = {
    'n_estimators': [50, 100, 200],
    'max_depth': [3, 5, 7],
    'learning_rate': [0.01, 0.1, 0.2],
    'subsample': [0.8, 1.0],
    'colsample_bytree': [0.8, 1.0],
    'gamma': [0, 0.1, 0.5],
    'reg_alpha': [0, 0.1, 1],
    'reg_lambda': [1, 2, 5]
}
```

Performing hyperparameter tuning...

Fitting 3 folds for each of 2916 candidates, totalling 8748 fits

Best Parameters: {'colsample_bytree': 1.0, 'gamma': 0, 'learning_rate': 0.1, 'max_depth': 7, 'n_estimators': 100, 'reg_alpha': 1, 'reg_lambda': 5, 'subs ample': 0.8}

Test Set Results for Tuned XGBoost Model: R-squared (Test): 0.2320 MSE (Test): 36.3895

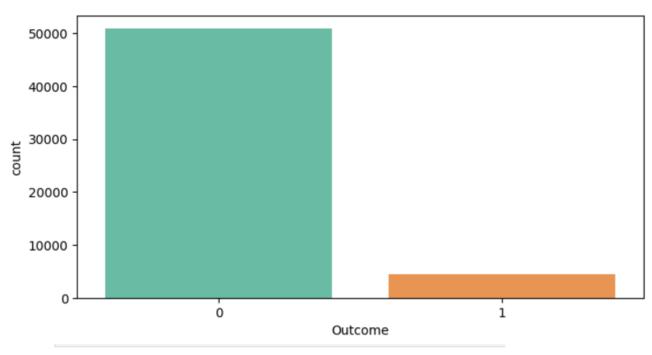
ORIGINAL FEATURES - FEMALE ONLY

Features and their description

- 1. Pregnancies Number of times the person conceived
- 2. Fasting Glucose 8 hrs of fasting
- 3. Age In years -> 21 and up
- 4. BMI weight in kg / Height in meters^2
- 5. Family History 0 for no Family history in diabetes, 1 if there is family history
- 6. Waist to hip ratio = Waist / Hips in cm
- 7. Bloodpressure Diastolic blood pressure (mm Hg)
- 8. Outcome 0 for not diabetic and 1 if diabetic (Target Variable)

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 55299 entries, 0 to 55298
Data columns (total 8 columns):
                    Non-Null Count Dtype
    Column
                     -----
    Pregnancies
                    55299 non-null int64
                    55299 non-null int64
    Glucose
    BloodPressure
                    55299 non-null float64
                    55299 non-null float64
    BMI
    WaistToHipRatio 55299 non-null float64
    FamilyHistory
                    55299 non-null int64
                    55299 non-null int64
    Age
                    55299 non-null int64
    Outcome
dtypes: float64(3), int64(5)
```

memory usage: 3.4 MB



Class distribution after undersampling: 0

4463

Name: Outcome, dtype: int64

Training Accuracy of Logistic Regression: 95.30812324929971 Accuracy (Test) score of Logistic Regression: 95.07278835386337 Accuracy score of Logistic Regression: 95.07278835386337

AUC: 0.9849910512569402

Training Accuracy of SVM: 95.92436974789916 Accuracy (Test) score of SVM: 95.18477043673013

Accuracy score of SVM: 95.18477043673013

AUC: 0.9837198501721406

Training Accuracy of Random Forest: 99.9859943977591 Accuracy (Test) score of Random Forest: 95.91265397536394 Accuracy score of Random Forest: 95.91265397536394

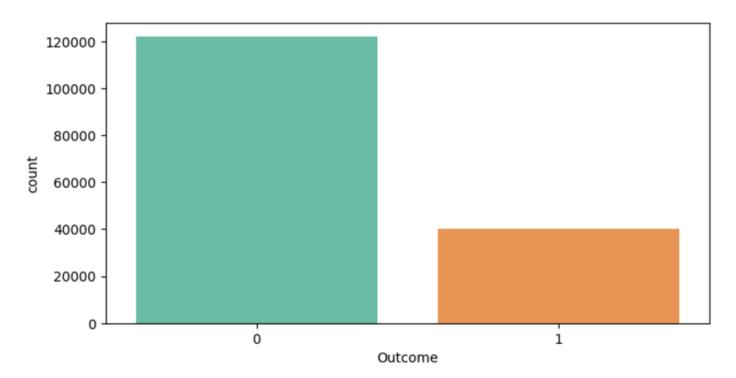
AUC: 0.9899184419828658

ALL GENDER RESULTS

Features and Their Descriptions

- Pregnancies Number of times the person conceived.
- Glucose 2 hours of fasting.
- BloodPressure Diastolic blood pressure (mm Hg).
- SkinThickness Measurement of Triceps Skinfold Thickness (mm):
- Insulin Fasting insulin levels (μU/mL). Normal range: 2–25 μU/mL.
- BMI Body Mass Index (weight in kg / height in meters2):
- Family History 0 for no family history in diabetes, 1 if there is family history.
- Age In years, ranging from 1 to 85.
- Outcome 0 for not diabetic and 1 if diabetic (Target Variable).

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 162248 entries, 0 to 162247
Data columns (total 9 columns):
    Column
                   Non-Null Count
                                   Dtype
                   -----
                   162248 non-null int64
    Age
                  162248 non-null int64
    Pregnancies
    Glucose
                   162248 non-null float64
    BloodPressure 136239 non-null float64
    SkinThickness 162248 non-null float64
    Insulin
                   162248 non-null float64
                   162248 non-null float64
    BMI
    FamilyHistory 162248 non-null int64
    Outcome
                   162248 non-null int64
dtypes: float64(5), int64(4)
memory usage: 11.1 MB
```



Class_weight='balanced

Model: Logistic Regression Training Accuracy: 94.64% Test Accuracy: 94.51% Accuracy Score: 94.51%

AUC: 0.98

Model: Support Vector Machine (SVM)

Training Accuracy: 95.14% Test Accuracy: 95.00% Accuracy Score: 95.00%

AUC: 0.98

Model: Random Forest

Training Accuracy: 100.00%

Test Accuracy: 97.61% Accuracy Score: 97.61%

AUC: 0.99

SUBSEQUENT MODEL BUILDING

RISK LEVEL CLASSIFICATION:

High Risk:

Glucose > 180 or BloodPressure > 140

Moderate Risk:

BMI > 30

Low Risk:

All other cases

Classification applied to Outcome == 1

Model: Random Forest Training Accuracy: 100.00% Test Accuracy: 97.61% Accuracy Score: 97.61% AUC: 0.99

Confusion Matrix:

[[24143 121] [656 7530]]

Definitions:

True Positives (TP): 7530 - Correctly predicted positive cases.

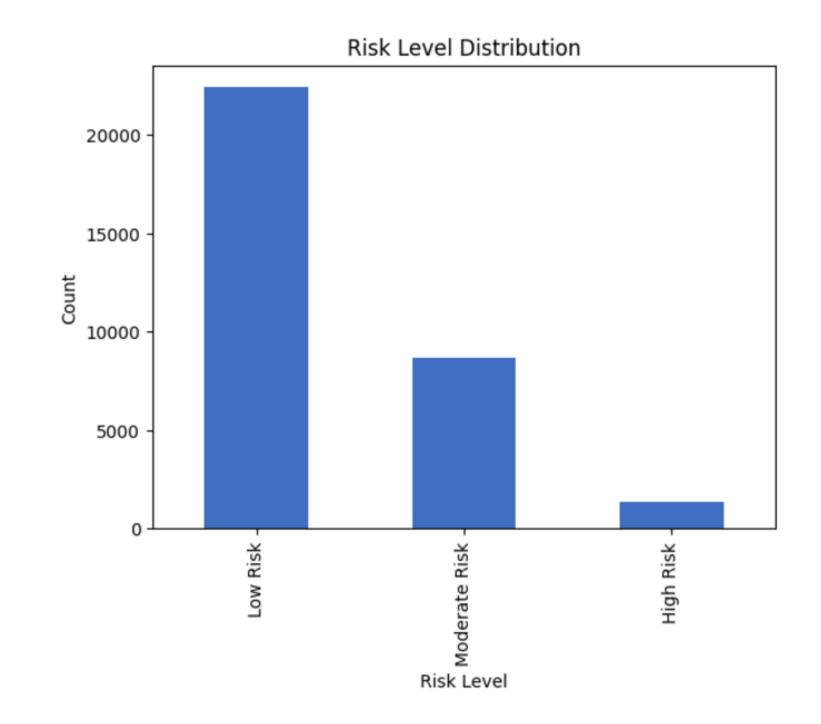
False Negatives (FN): 656 - Positive cases incorrectly predicted as negative.

False Positives (FP): 121 - Negative cases incorrectly predicted as positive.

True Negatives (TN): 24143 - Correctly predicted negative cases.

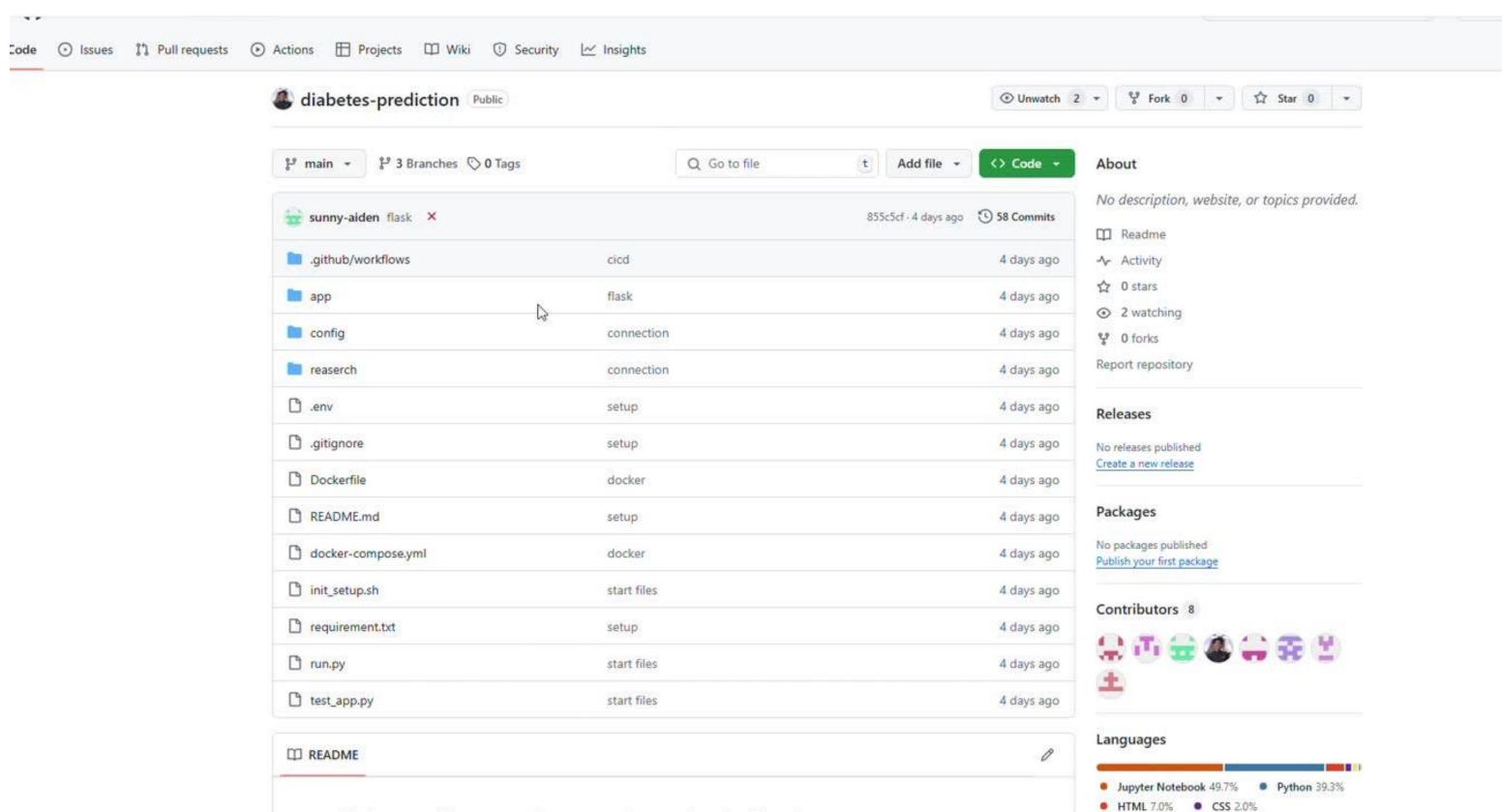
Classification Report:

		precision	recall	t1-score	support
	0	0.97	1.00	0.98	24264
	1	0.98	0.92	0.95	8186
accur	racy			0.98	32450
macro	avg	0.98	0.96	0.97	32450
weighted	avg	0.98	0.98	0.98	32450





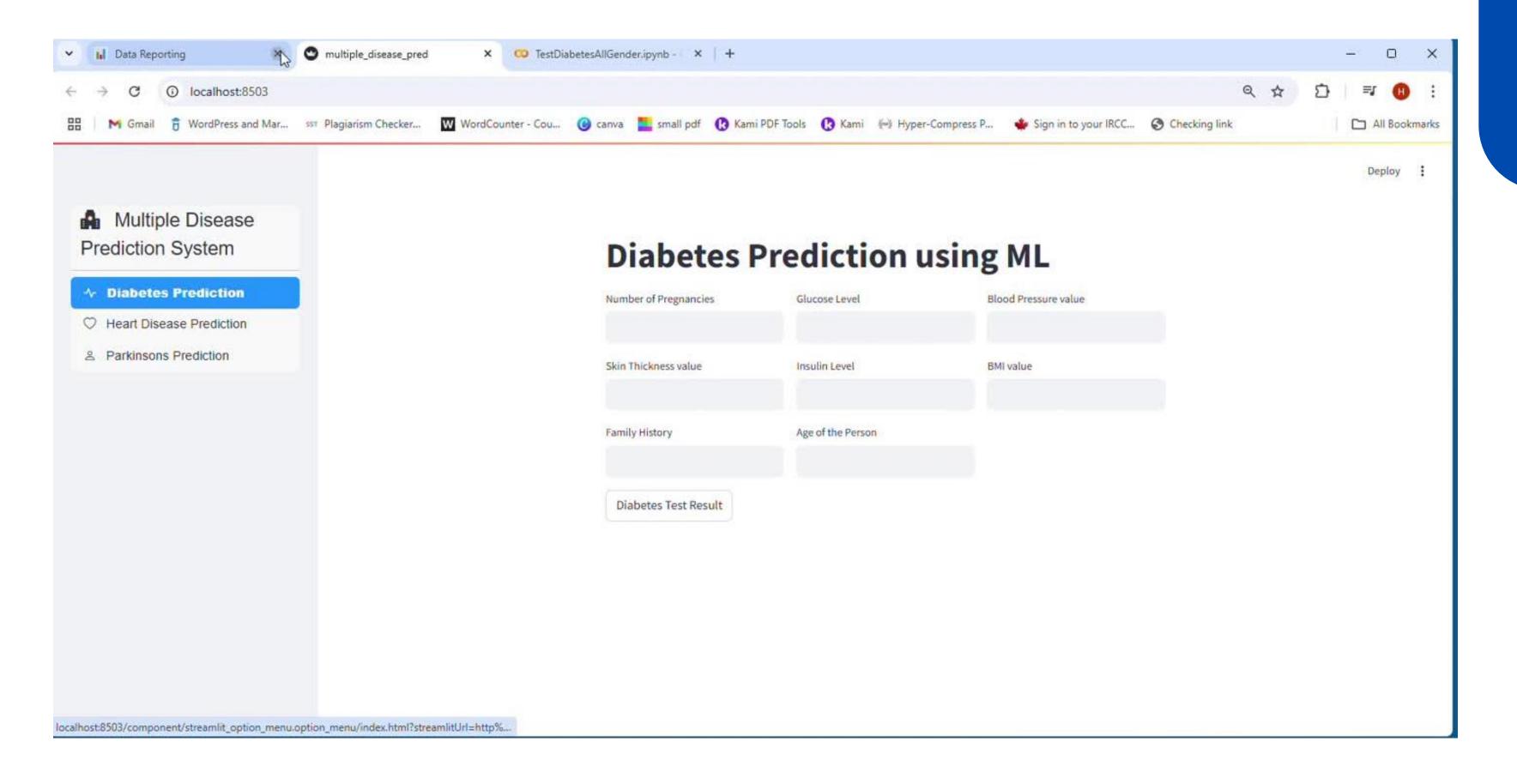
GIT REPOSITORY



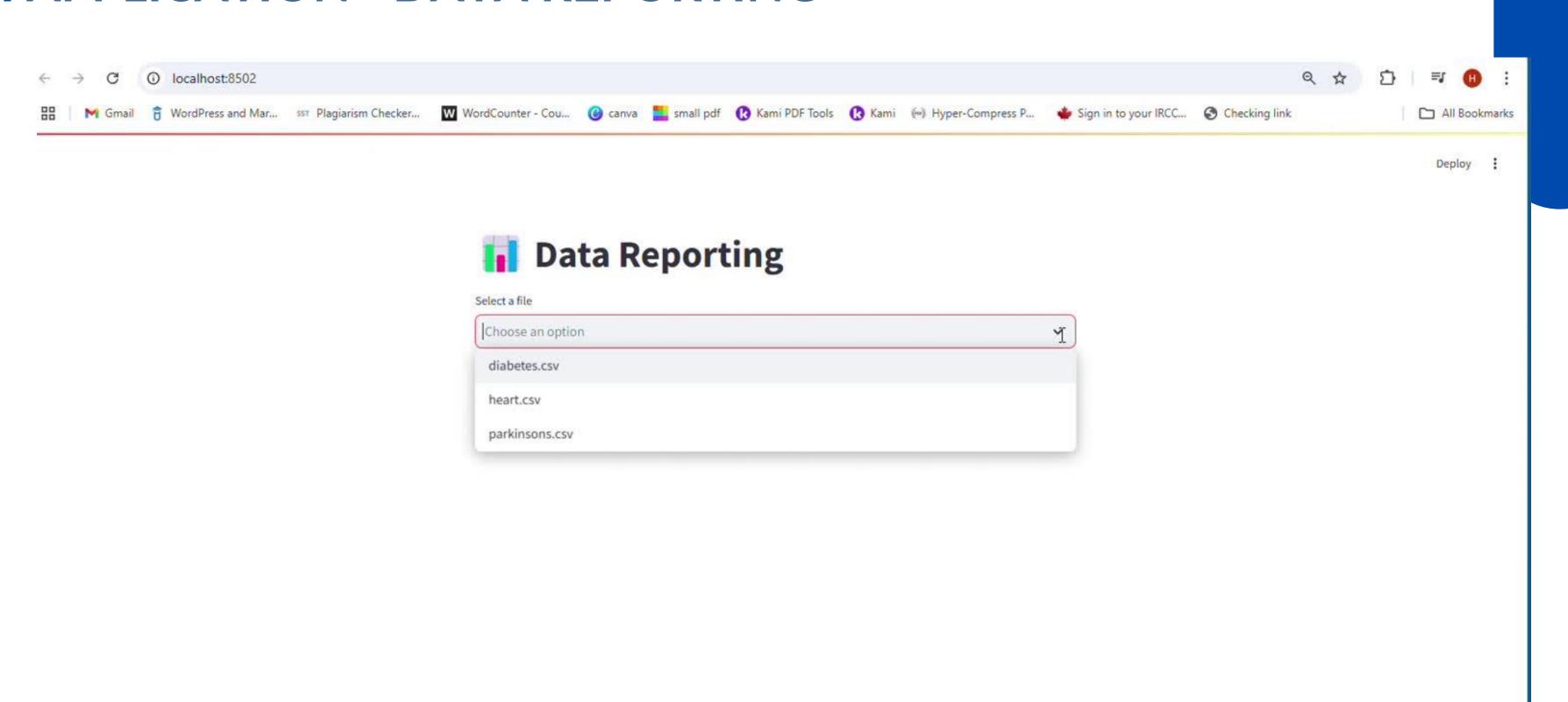
PITCH



UI APPLICATION



UI APPLICATION - DATA REPORTING





FROM: GROUP 6

