

Model Optimization and Tuning Phase Report

Date	25 July 2025
Team ID	NONE
Project Title	Employee Performance Prediction using Machine Learning

Model Optimization and Tuning Phase

The Model Optimization and Tuning Phase focuses on improving the performance of the Random Forest model, which was identified as the best-performing algorithm in the initial evaluation ($R^2 \approx 0.46$). Hyperparameter tuning was performed using GridSearchCV to find the optimal combination of parameters such as `n_estimators`, `max_depth`, `min_samples_split`, and `min_samples_leaf`. The tuned model was re-evaluated on the test set to measure improvement in R^2 score. This phase ensures that the final model achieves maximum predictive accuracy and generalization, making it suitable for deployment in real-world workforce management scenarios.

Hyperparameter Tuning Documentation:

Model	Tuned Hyperparameters	Optimal Values
Linear Regression	- No specific hyperparameters (default settings) <pre>lr = LinearRegression() lr.fit(X_train, y_train) lr_pred = lr.predict(X_test) lr_r2 = r2_score(y_test, lr_pred) print("Linear Regression R² Score:", lr_r2)</pre>	NONE
Random Forest	<code>n_estimators</code> : [50, 100, 200] <code>max_depth</code> : [None, 10, 20, 30] <code>min_samples_split</code> : [2, 5, 10] <code>min_samples_leaf</code> : [1, 2, 4] <code>random_state</code> : 42 <code>n_jobs</code> : -1 <code>n_estimators</code> : 100 <code>max_depth</code> : None <code>min_samples_split</code> : 5 <code>min_samples_leaf</code> : 1	100,42
XGBoost	<code>n_estimators</code> : [50, 100, 200] <code>learning_rate</code> : [0.01, 0.1, 0.2] <code>max_depth</code> : [3, 6, 9] <code>subsample</code> : [0.8, 1.0] <code>colsample_bytree</code> : [0.8, 1.0] <code>random_state</code> : 42	100,42

Performance Metrics Comparison Report:

Model	Optimized Metric
Linear Regression	<pre> • (base) PS C:\Users\vansh\OneDrive\Desktop\employee_performance_ml> 8 Linear Regression R² Score: 0.1681682566306545 Random Forest R² Score: 0.44671974539154335 XGBoost R² Score: 0.3538597397101051 Best model saved to model/best_model.pkl ○ (base) PS C:\Users\vansh\OneDrive\Desktop\employee_performance_ml> </pre>
Random Forest	<pre> • (base) PS C:\Users\vansh\OneDrive\Desktop\employee_performance_ml> 8 Linear Regression R² Score: 0.1681682566306545 Random Forest R² Score: 0.44671974539154335 XGBoost R² Score: 0.3538597397101051 Best model saved to model/best_model.pkl ○ (base) PS C:\Users\vansh\OneDrive\Desktop\employee_performance_ml> </pre>
XGBoost	<pre> • (base) PS C:\Users\vansh\OneDrive\Desktop\employee_performance_ml> 8 Linear Regression R² Score: 0.1681682566306545 Random Forest R² Score: 0.44671974539154335 XGBoost R² Score: 0.3538597397101051 Best model saved to model/best_model.pkl ○ (base) PS C:\Users\vansh\OneDrive\Desktop\employee_performance_ml> </pre>

Final Model Selection Justification

Final Model	Reasoning
Random Forest	The Random Forest model was selected as the final model due to its superior performance during hyperparameter tuning, achieving an R^2 score of approximately