Machine Learning II: Employee Attrition Prediction

Group B

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Executive Summary

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Goal:

Predict the attrition of employees



Feature Engineering: *Label encoding and Creating New Variables*



Model Deployment:

Iterative sampling, Model Selection



Final Model:
Random Forest Classifier and XGBoost



Business Insights and Strategies:

Benefits and Employee Retention Strategies

Feature Engineering

Feature Engineering

Creating New Features

Aggregating existing features

Dealing with Categorical Features

Label encoding



Dropping Unnecessary Features

Features with one single value in all rows

Dealing with Numerical Features

Not removing outliers nor applying scaling

Deciding Final Features

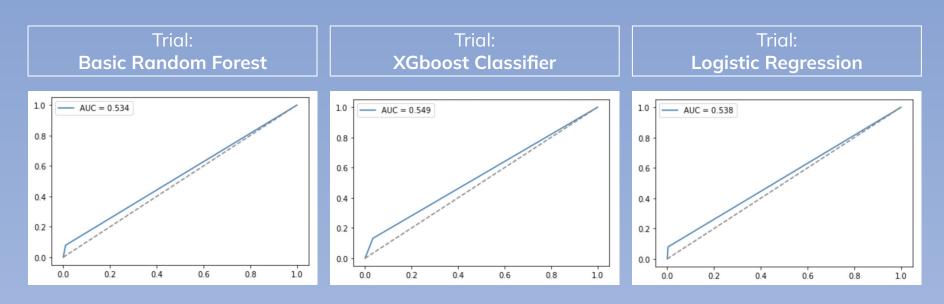
Dropping variables that have been aggregated and highly correlated ones

Feature Engineering: Creating New Variables

New Variable Name	Description		
Age_group	categorizing 'Age' into 5 different groups ('18-30', '31-40', '41-50', '51-60', '61-70')		
Distance_group	categorizing 'DistanceFromHome' into 3 different groups ('Short', 'Medium', 'Long')		
Satisfaction_level	'EnvironmentSatisfaction' + 'RelationshipSatisfaction'		
Job_Title	'JobRole' + ' - ' + 'Department'		
Experience_Factor	'TotalWorkingYears' * 'JobLevel'		

Model Deployment

Models Deployment



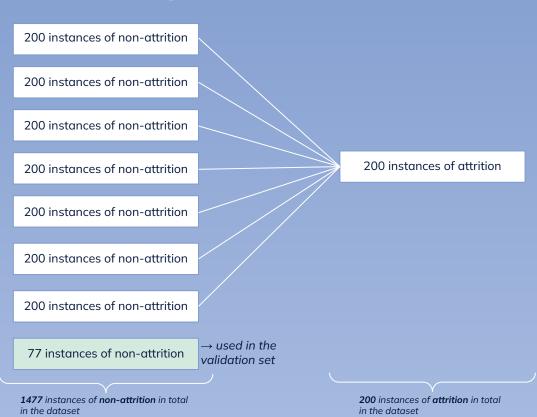
Problem: Hugely imbalanced dataset (attrition: non-attrition ≈ 1:10)

Models Deployment: Handling Imbalanced Data -

Iterative Sampling:

similar with **Bagging**, but instead of running in parallel, its run iteratively, storing all predictions made instead of discarding the worst ones.

The benefit is that it generates synthetic data points that are similar to the minority class, reducing bias and improving the model's ability to generalize





Final Predictive Model

Final Model Choice

Benefits	XGBoost	Random Forest	Combination
Better prediction accuracy	V	V	Increased accuracy
Improved generalization	V	V	Reduces the risk of overfitting and improves generalization.
Enhanced feature importance	V	V	Better understanding of important features
Faster training time	V	V	Faster training, without sacrificing performance.
Better interpretability	X	V	More interpretable model
Robustness to outliers	X	V	Robust model that is less affected by outliers.

Combination of XGboost & Random Forest



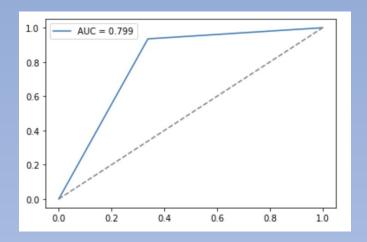
How:

Calculate the mean of each iteration of XGboost & Random Forest and round it to a binary value



Result:

AUC score on Kaggle: 0.76 for Private and .82 for Public.



Benefits of Model's Predictions

Benefits of Model's Prediction

According to the U.S. Bureau of Labor,

the average employee turnover rate in 2021 was 47.2%.

The turnover rate includes employees who voluntarily quit, layoffs, retirements and discharges.

Benefits of Model's Prediction



Managers can take preventative measures with employees who are predicted to be at risk of leaving

 Ex: Meetings to talk about job satisfaction, goal setting, and general feedback



Better understanding of employee behavior and the factors that contribute to retention

 Ability to make informed decisions to enhance performance and gain a competitive advantage

Benefits of Model's Prediction



Less energy and time spent by the human resources team in the recruitment process

- No need to constantly replace lost talent
- More resources to be used for career development



Decreased onboarding and training costs

More time for managers and senior employees to focus on projects



Employee Retention Strategies

Employee Retention Strategies



Sending quarterly surveys to all employees, adding emphasis to those who are predicted as leaving.

- Gather feedback for what factors are causing dissatisfaction
- Create an environment of trust



Sending invitations for focus groups to those who responded to the survey

 Get more in depth information about their current job satisfaction and also ideas for how to improve the employee experience.

Employee Retention Strategies



Providing benefits or salary increases to those employees who are predicted as leaving

- Have the highest performance rating
- Employees who have not been promoted in 4 years or more.



Implementing career development programs for entry-level employees

- Keep employees engaged and increase performance
- Keep employees in track for promotions/salary increases

Conclusion