

Highlights of HR_project.R outputs:

Data Structures:

data.frame': 14999 obs. of 10 variables:

```
$ satisfaction_level : num 0.38 0.8 0.11 0.72 0.37 0.41 0.1 0.92 0.89 0.42 ...
```

```
$ last_evaluation      : num  0.53 0.86 0.88 0.87 0.52 0.5 0.77 0.85 1 0.53 ...
```

```
$ number_project      : int 2 5 7 5 2 2 6 5 5 2 ...
```

```
$ average_monthly_hours : int 157 262 272 223 159 153 247 259 224 142 ...
```

```
$ time_spend_company : int 3 6 4 5 3 3 4 5 5 3 ...
```

```
$ Work_accident      :int 0 0 0 0 0 0 0 0 0 ...
```

```
$ left      : int 1 1 1 1 1 1 1 1 1 1 ...
```

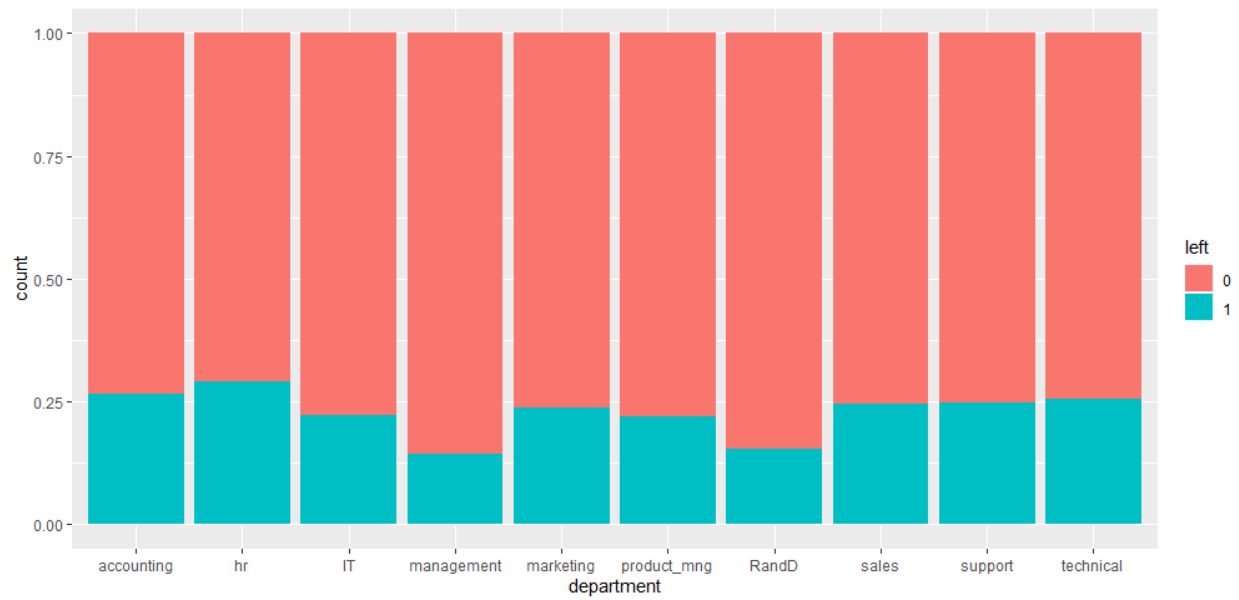
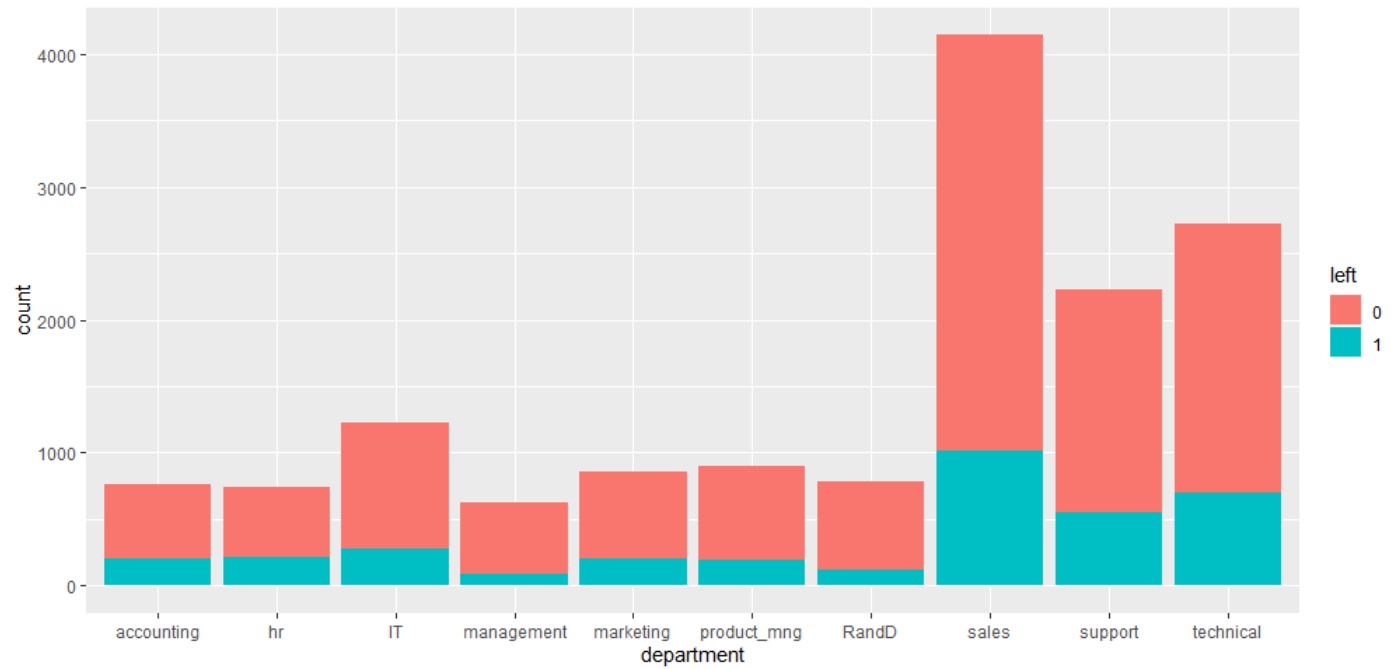
```
$ promotion_last_5years: int 0 0 0 0 0 0 0 0 ...
```

```
$ department      : chr "sales" "sales" "sales" "sales" ...
```

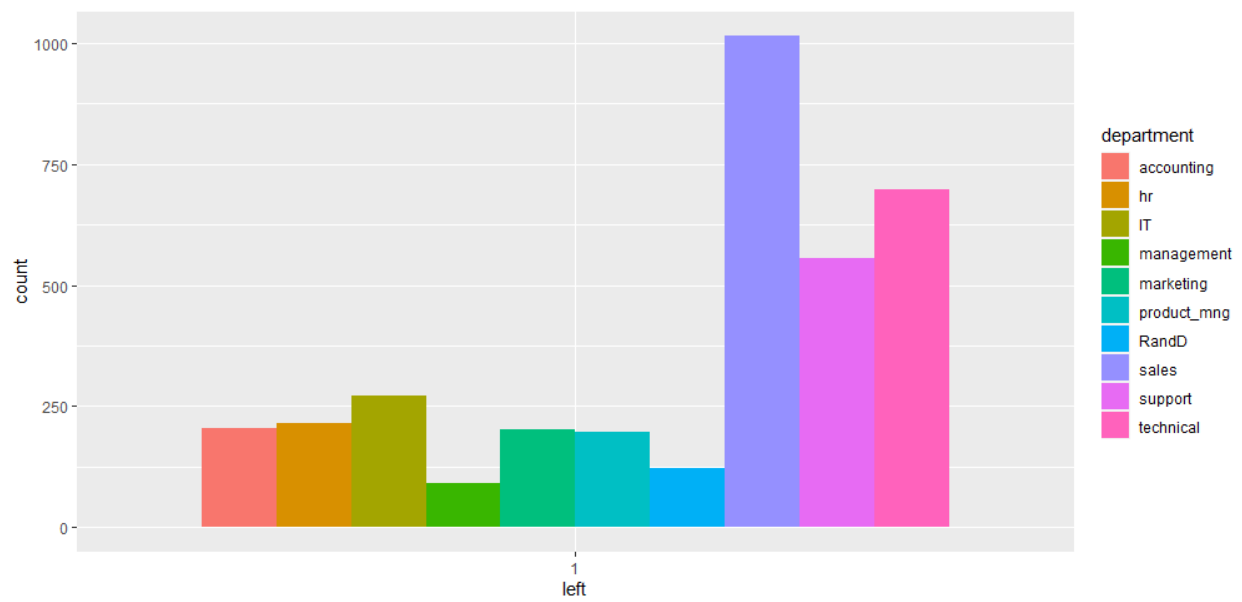
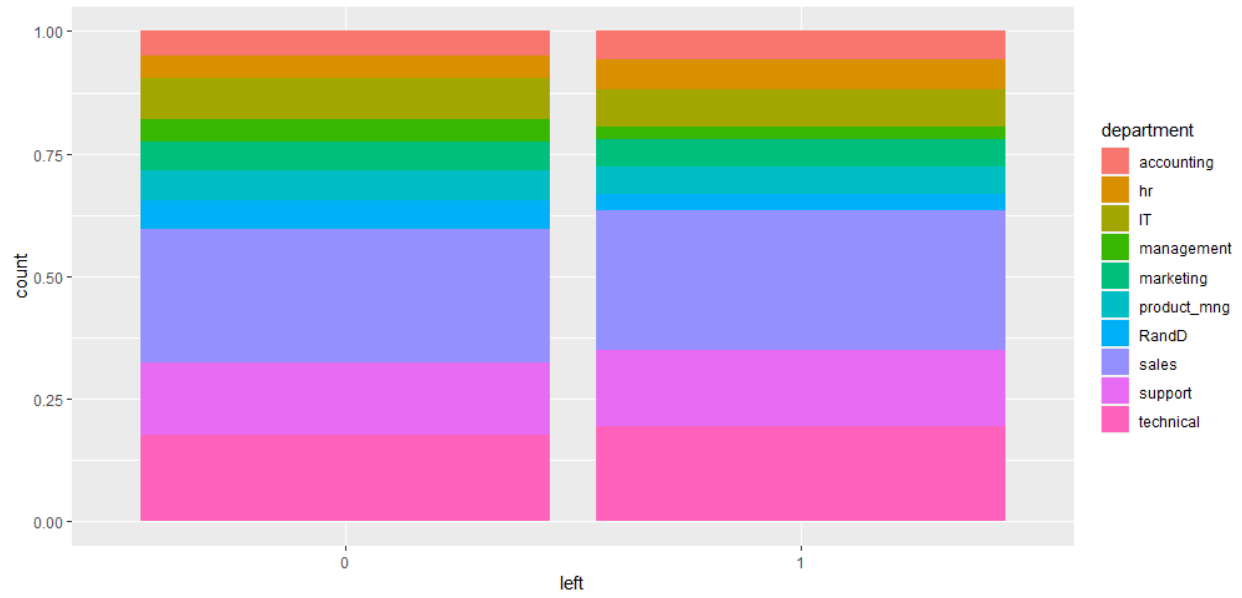
```
$ salary      : chr "low" "medium" "medium" "low" ...
```

Summary of Counts:

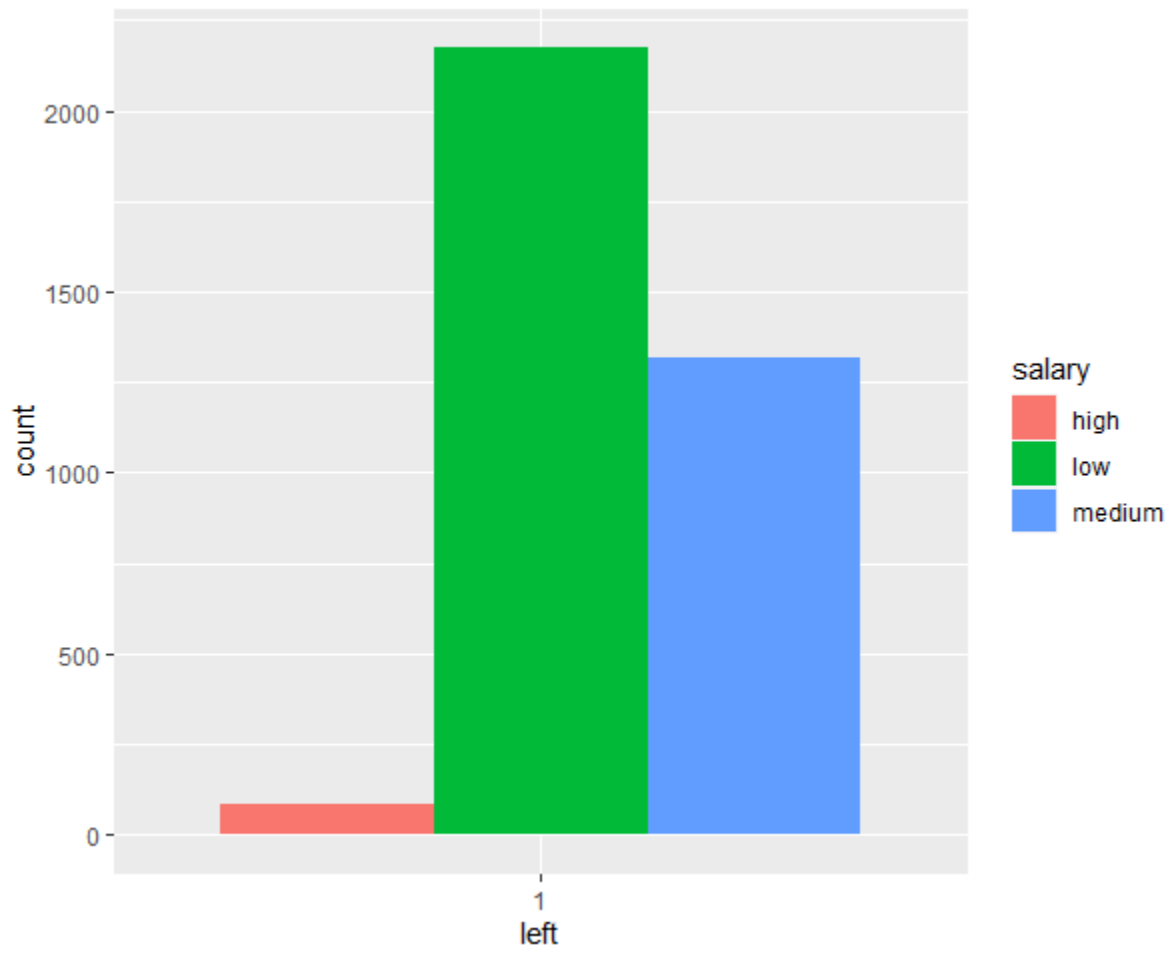
accounting	hr	IT	management	marketing	product_mng	RandD	sales	support
767	739	1227	630	858	902	787	4140	2229
technical								
2720								



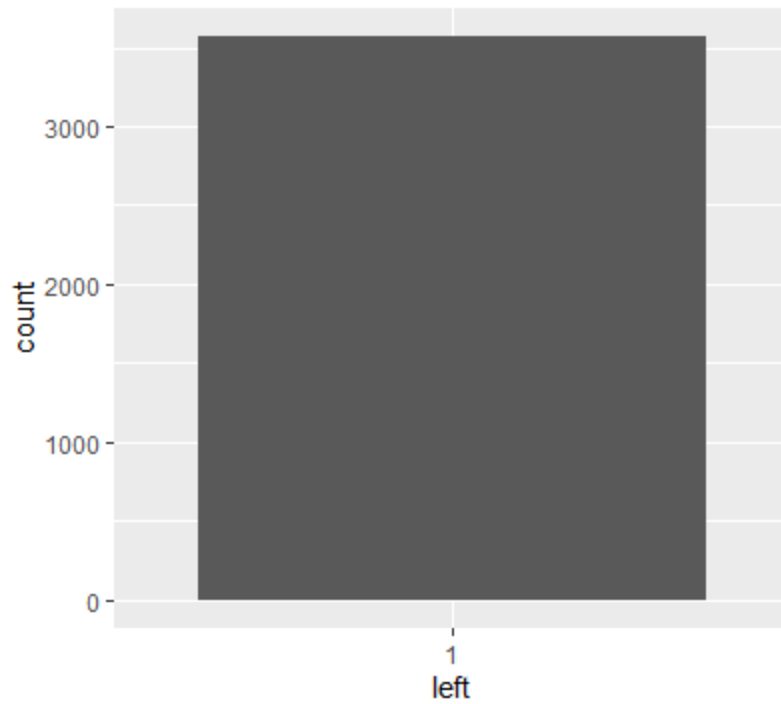
Proportionately, HR employee has highest percentage of people leaving the job.



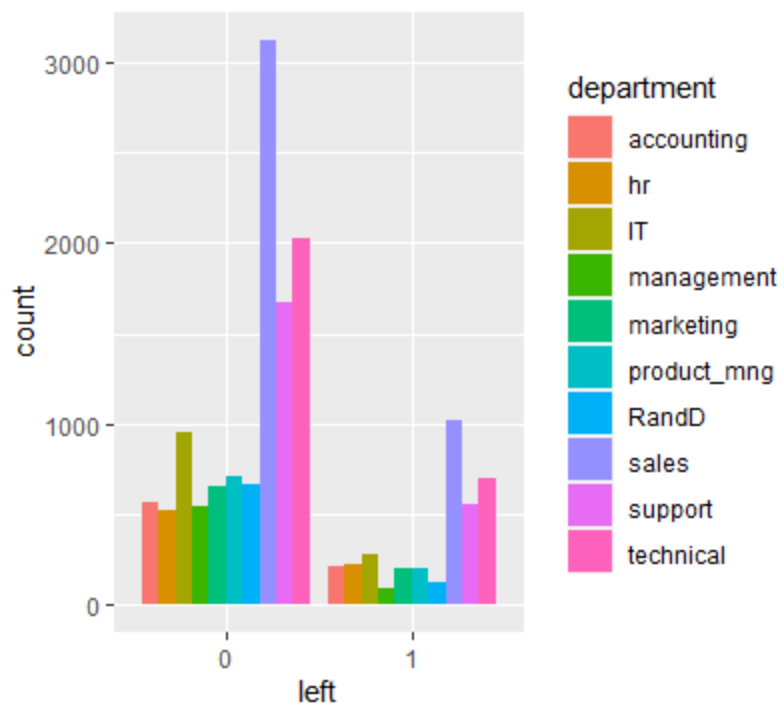
- More employee from Sales, accounting and support left the job.

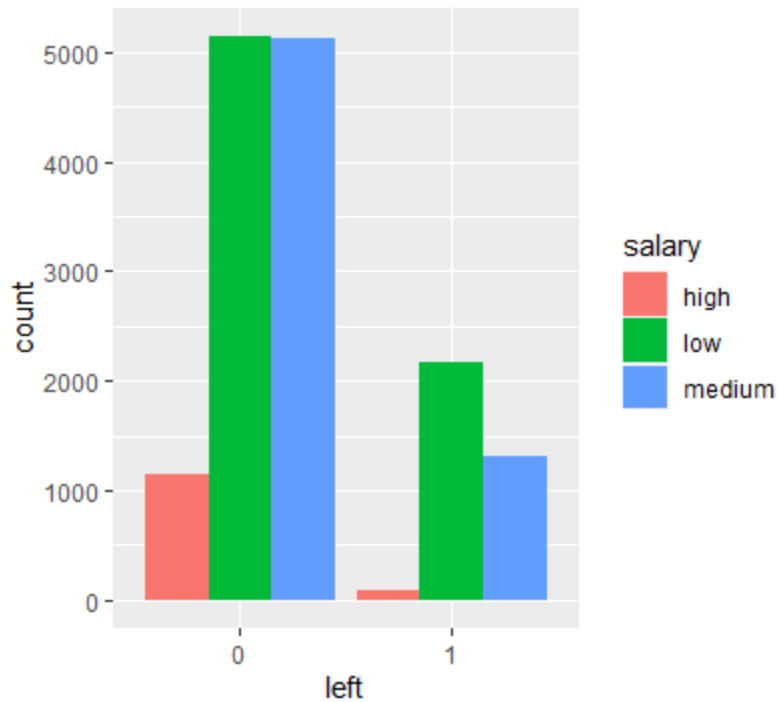


More employees with low salary left the job.



more than 99% who left did not have promotion last 5 years.





Results from logistic Regression Model:

Deviance Residuals:

Min	1Q	Median	3Q	Max
-2.1921	-0.6599	-0.4015	-0.1197	3.0922

Coefficients:

	Estimate	Std. Error	z value	Pr(> z)
(Intercept)	-1.6517677	0.2329999	-7.089	1.35e-12 ***
satisfaction_level	-4.1197436	0.1178068	-34.970	< 2e-16 ***
last_evaluation	0.9042849	0.1782874	5.072	3.94e-07 ***
number_project	-0.3074209	0.0255463	-12.034	< 2e-16 ***
average_monthly_hours	0.0044452	0.0006166	7.210	5.61e-13 ***
time_spend_company	0.2633074	0.0185944	14.161	< 2e-16 ***
Work_accident	-1.5193812	0.1051285	-14.453	< 2e-16 ***
promotion_last_5years1	-1.5411094	0.3089065	-4.989	6.07e-07 ***

```

departmenthr      0.1644849 0.1620927 1.015 0.31022
departmentIT      -0.2068839 0.1482290 -1.396 0.16280
departmentmanagement -0.4988573 0.1945119 -2.565 0.01033 *
departmentmarketing -0.0173623 0.1593772 -0.109 0.91325
departmentproduct_mng -0.0530144 0.1551137 -0.342 0.73252
departmentRandD   -0.4698361 0.1727603 -2.720 0.00654 **
departmentsales    0.0029721 0.1239722 0.024 0.98087
departmentsupport  0.0638583 0.1326189 0.482 0.63015
departmenttechnical 0.1163806 0.1290261 0.902 0.36706
salarylow         1.9675447 0.1526312 12.891 < 2e-16 ***
salarymedium      1.3830973 0.1536912 8.999 < 2e-16 ***
---

```

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

(Dispersion parameter for binomial family taken to be 1)

Null deviance: 11481.4 on 10498 degrees of freedom

Residual deviance: 8963.2 on 10480 degrees of freedom

AIC: 9001.2

Number of Fisher Scoring iterations: 5

Predictedvalues

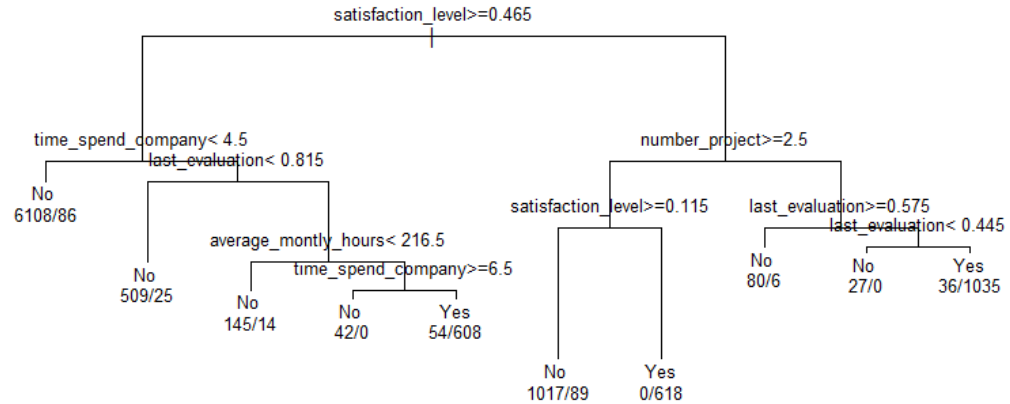
Actualvalues FALSE TRUE

0 3016 394

1 537 553

Model Accuracy = True Positive + True Negative/Total
= 3016+553/(3016+394+537+553) = 79.31%

Results from Decision trees Model:



Confusion Matrix and Statistics

predvalues1 No Yes

No 3376 91

Yes 34 999

Accuracy : 0.9722 95% CI : (0.967, 0.9768)

No Information Rate : 0.7578

P-Value [Acc > NIR] : < 2.2e-16

Kappa : 0.923

Mcnemar's Test P-Value : 5.477e-07

Sensitivity : 0.9900

Specificity : 0.9165

Pos Pred Value : 0.9738

Neg Pred Value : 0.9671

Prevalence : 0.7578

Detection Rate : 0.7502

Detection Prevalence : 0.7704

Balanced Accuracy : 0.9533

'Positive' Class : No

Results from Random Forests Model:

RandomForest(formula = trainset\$left ~ ., data = trainset, ntree = 100)

Type of random forest: classification

Number of trees: 100

No. of variables tried at each split: 3

OOB estimate of error rate: 0.93%

Confusion matrix:

No Yes class.error

No 7946 17 0.002134874

Yes 81 2445 0.032066508

Confusion Matrix and Statistics

predvalues No Yes

No 3457 36

Yes 8 1009

Accuracy : 0.9902

95% CI : (0.9869, 0.9929)

No Information Rate : 0.7683

P-Value [Acc > NIR] : < 2.2e-16

Kappa : 0.9723

McNemar's Test P-Value : 4.693e-05

Sensitivity : 0.9977

Specificity : 0.9656

Pos Pred Value : 0.9897

Neg Pred Value : 0.9921

Prevalence : 0.7683

Detection Rate : 0.7665

Detection Prevalence : 0.7745

Balanced Accuracy : 0.9816

'Positive' Class : No

List of Important Variables for prediction using Random forests Model:

Clearly, you can see that job satisfaction level has greatest impact on making decision whether to continue or leave the job for employees.

Please see the plot in next page.



Results from Naïve Bayes Model:

Confusion Matrix and Statistics

predvalues No Yes

No 3115 346

Yes 350 699

Accuracy : 0.8457

95% CI : (0.8348, 0.8561)

No Information Rate : 0.7683

P-Value [Acc > NIR] : <2e-16

Kappa : 0.5671

McNemar's Test P-Value : 0.9095

Sensitivity : 0.8990

Specificity : 0.6689

Pos Pred Value : 0.9000

Neg Pred Value : 0.6663

Prevalence : 0.7683

Detection Rate : 0.6907

Detection Prevalence : 0.7674

Balanced Accuracy : 0.7839

'Positive' Class : No

Results from Support Vector Machine Model:

Call:

svm(formula = trainset\$left ~ ., data = trainset, kernel = "polynomial", cost = 0.1)

Parameters:

SVM-Type: C-classification

SVM-Kernel: polynomial

cost: 0.1

degree: 3

coef.0: 0

Number of Support Vectors: 3637

(1813 1824)

Number of Classes: 2

Levels:

No Yes

Confusion Matrix and Statistics

predvalues No Yes

No 3369 225

Yes 96 820

Accuracy : 0.9288

95% CI : (0.9209, 0.9362)

No Information Rate : 0.7683

P-Value [Acc > NIR] : < 2.2e-16

Kappa : 0.7911

Mcnemar's Test P-Value : 9.048e-13

Sensitivity : 0.9723

Specificity : 0.7847

Pos Pred Value : 0.9374

Neg Pred Value : 0.8952

Prevalence : 0.7683

Detection Rate : 0.7470

Detection Prevalence : 0.7969

Balanced Accuracy : 0.8785

'Positive' Class : No

You have seen the performance of different results. One can decide to select model for deployment based on the domain knowledge, accuracy, and consulting with Machine Learning engineers and Dev Ops to see which model will do better job at production level.

Thank you.

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