Customer Churn

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## R Markdown

This is an R Markdown document. Markdown is a simple formatting syntax for authoring HTML, PDF, and MS Word documents. For more details on using R Markdown see <http://rmarkdown.rstudio.com>.

When you click the **Knit** button a document will be generated that includes both content as well as the output of any embedded R code chunks within the document. You can embed an R code chunk like this:

#Set working directory  
  
setwd("C:\\BACP\\Module 5 - Predictive Modelling\\customer Churn")  
getwd()

## [1] "C:/BACP/Module 5 - Predictive Modelling/customer Churn"

#libraries ######  
library(knitr)  
library(rmarkdown)  
library(ggplot2)

## Warning: package 'ggplot2' was built under R version 3.5.3

library(dplyr)

##   
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':  
##   
## filter, lag

## The following objects are masked from 'package:base':  
##   
## intersect, setdiff, setequal, union

library("car")

## Warning: package 'car' was built under R version 3.5.2

## Loading required package: carData

## Warning: package 'carData' was built under R version 3.5.2

##   
## Attaching package: 'car'

## The following object is masked from 'package:dplyr':  
##   
## recode

library("caret")

## Warning: package 'caret' was built under R version 3.5.3

## Loading required package: lattice

#read data from excel  
CustChurn = read.csv("Cellphone.csv",2)  
attach(CustChurn)  
  
##Exploratory data analysis   
  
  
#Names of the columns  
names(CustChurn)

## [1] "Churn" "AccountWeeks" "ContractRenewal"  
## [4] "DataPlan" "DataUsage" "CustServCalls"   
## [7] "DayMins" "DayCalls" "MonthlyCharge"   
## [10] "OverageFee" "RoamMins"

#total number of rows and columns  
dim(CustChurn)

## [1] 3333 11

#class of each feature   
str(CustChurn)

## 'data.frame': 3333 obs. of 11 variables:  
## $ Churn : int 0 0 0 0 0 0 0 0 0 0 ...  
## $ AccountWeeks : int 128 107 137 84 75 118 121 147 117 141 ...  
## $ ContractRenewal: int 1 1 1 0 0 0 1 0 1 0 ...  
## $ DataPlan : int 1 1 0 0 0 0 1 0 0 1 ...  
## $ DataUsage : num 2.7 3.7 0 0 0 0 2.03 0 0.19 3.02 ...  
## $ CustServCalls : int 1 1 0 2 3 0 3 0 1 0 ...  
## $ DayMins : num 265 162 243 299 167 ...  
## $ DayCalls : int 110 123 114 71 113 98 88 79 97 84 ...  
## $ MonthlyCharge : num 89 82 52 57 41 57 87.3 36 63.9 93.2 ...  
## $ OverageFee : num 9.87 9.78 6.06 3.1 7.42 ...  
## $ RoamMins : num 10 13.7 12.2 6.6 10.1 6.3 7.5 7.1 8.7 11.2 ...

#top 6 rows   
head(CustChurn)

## Churn AccountWeeks ContractRenewal DataPlan DataUsage CustServCalls  
## 1 0 128 1 1 2.7 1  
## 2 0 107 1 1 3.7 1  
## 3 0 137 1 0 0.0 0  
## 4 0 84 0 0 0.0 2  
## 5 0 75 0 0 0.0 3  
## 6 0 118 0 0 0.0 0  
## DayMins DayCalls MonthlyCharge OverageFee RoamMins  
## 1 265.1 110 89 9.87 10.0  
## 2 161.6 123 82 9.78 13.7  
## 3 243.4 114 52 6.06 12.2  
## 4 299.4 71 57 3.10 6.6  
## 5 166.7 113 41 7.42 10.1  
## 6 223.4 98 57 11.03 6.3

#missing value  
colSums(is.na(CustChurn))

## Churn AccountWeeks ContractRenewal DataPlan   
## 0 0 0 0   
## DataUsage CustServCalls DayMins DayCalls   
## 0 0 0 0   
## MonthlyCharge OverageFee RoamMins   
## 0 0 0

#univariate analysis   
  
#Churn  
unique(Churn)

## [1] 0 1

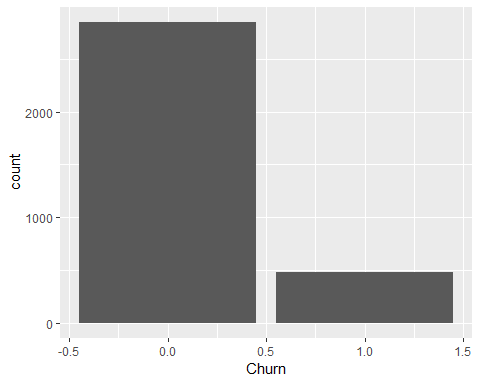
lables=c("not churn", "churn")  
table(Churn)

## Churn  
## 0 1   
## 2850 483

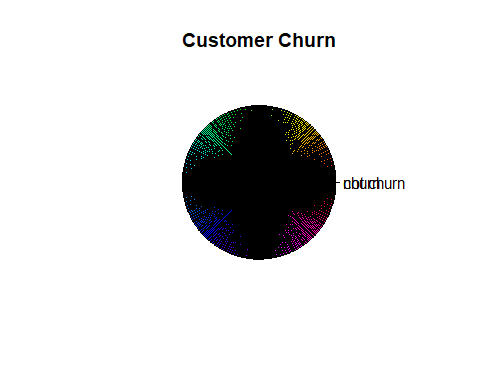
summary(Churn)

## Min. 1st Qu. Median Mean 3rd Qu. Max.   
## 0.0000 0.0000 0.0000 0.1449 0.0000 1.0000

CustChurn %>% ggplot(aes(x=Churn))+  
 geom\_bar(aes(fill=Churn))



pie(as.numeric(Churn),lables,col = rainbow(length(Churn)),main="Customer Churn" )



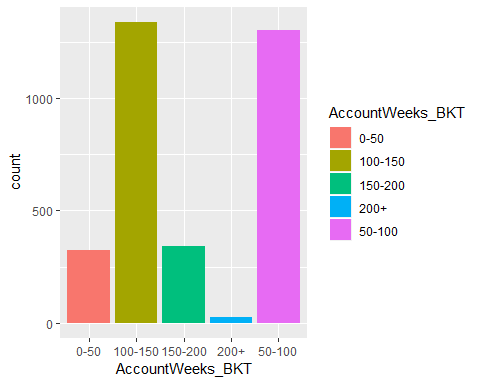
#Accounts active timeperiod  
  
summary(AccountWeeks)

## Min. 1st Qu. Median Mean 3rd Qu. Max.   
## 1.0 74.0 101.0 101.1 127.0 243.0

AccountWeeks\_BKT = ifelse(AccountWeeks < 50, "0-50",  
 ifelse(AccountWeeks < 100 , "50-100",  
 ifelse(AccountWeeks < 150, "100-150",  
 ifelse(AccountWeeks<200,"150-200","200+"  
 ))))  
summary(AccountWeeks\_BKT)

## Length Class Mode   
## 3333 character character

CustChurn %>% ggplot(aes(x=AccountWeeks\_BKT))+  
 geom\_bar(aes(fill=AccountWeeks\_BKT))



#Contracts renewal  
summary(ContractRenewal)

## Min. 1st Qu. Median Mean 3rd Qu. Max.   
## 0.0000 1.0000 1.0000 0.9031 1.0000 1.0000

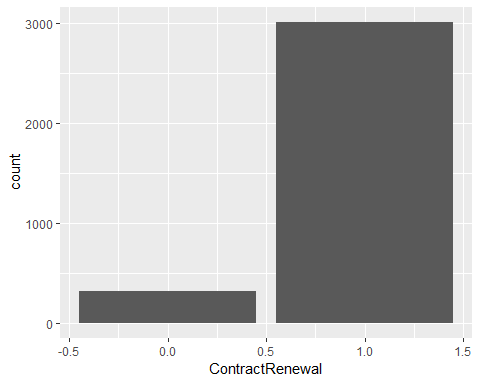
unique(ContractRenewal)

## [1] 1 0

table(ContractRenewal)

## ContractRenewal  
## 0 1   
## 323 3010

#converting to factor variable as contractrenewal has 2 values  
#CustChurn$ContractRenewal = as.factor(ContractRenewal)  
  
  
CustChurn %>% ggplot(aes(x=ContractRenewal))+  
 geom\_bar(aes(fill=ContractRenewal))



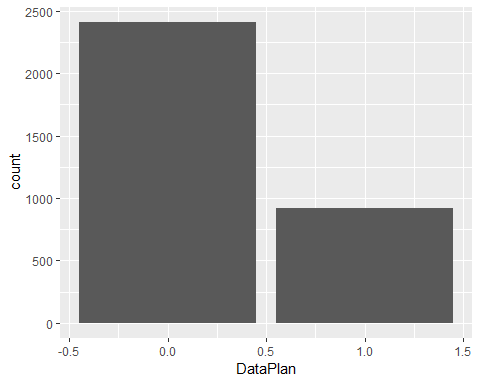
##Data plan  
  
unique(DataPlan)

## [1] 1 0

table(DataPlan)

## DataPlan  
## 0 1   
## 2411 922

#converting to factor variable as contractrenewal has 2 values  
#CustChurn$DataPlan = as.factor(DataPlan)  
  
CustChurn %>% ggplot(aes(x=DataPlan))+  
 geom\_bar(aes(fill=DataPlan))



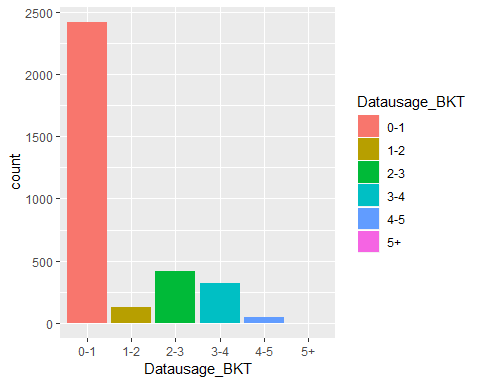
##Data usage  
summary(DataUsage)

## Min. 1st Qu. Median Mean 3rd Qu. Max.   
## 0.0000 0.0000 0.0000 0.8165 1.7800 5.4000

unique(DataUsage)

## [1] 2.70 3.70 0.00 2.03 0.19 3.02 0.29 0.34 0.44 3.73 0.31 0.39 2.57 0.32  
## [15] 0.21 2.24 3.97 3.92 2.84 0.30 3.94 0.38 0.24 2.30 0.35 2.97 0.11 1.57  
## [29] 3.13 3.40 1.67 3.27 0.26 2.65 2.32 2.94 0.17 1.19 2.43 2.73 5.40 1.94  
## [43] 0.40 1.73 1.43 2.75 1.84 3.00 2.59 3.46 2.86 0.14 0.23 2.67 0.27 0.22  
## [57] 0.33 3.54 2.89 3.29 3.59 3.21 0.25 3.19 3.75 0.28 3.81 1.81 0.51 3.08  
## [71] 2.27 1.22 2.16 1.76 0.42 0.13 4.21 2.78 0.20 2.62 2.08 2.05 1.35 2.54  
## [85] 3.48 1.92 3.78 0.18 2.48 3.24 0.43 1.00 0.45 0.36 4.32 2.51 3.05 3.32  
## [99] 1.70 3.86 0.16 1.62 4.64 4.00 1.59 1.78 4.73 2.11 1.46 3.83 2.46 4.16  
## [113] 4.46 3.56 1.97 2.38 1.11 1.30 0.37 4.19 4.40 0.15 2.81 2.00 4.43 3.43  
## [127] 3.62 2.21 4.05 4.10 3.67 4.29 3.35 2.19 4.35 3.16 2.40 2.35 1.49 4.56  
## [141] 1.38 0.47 2.92 4.24 3.65 1.86 3.51 1.05 2.13 0.46 0.41 3.89 3.38 3.11  
## [155] 1.51 1.54 1.89 1.13 0.12 4.08 1.03 1.65 4.75 1.32 4.13 1.27 1.16 4.59  
## [169] 4.02 4.48 0.78 1.40 0.65 0.68

Datausage\_BKT = ifelse(DataUsage < 1, "0-1",  
 ifelse(DataUsage < 2 , "1-2",  
 ifelse(DataUsage <3, "2-3",  
 ifelse(DataUsage < 4,"3-4",  
 ifelse(DataUsage < 5,"4-5",   
 "5+"  
 )))))  
  
CustChurn %>% ggplot(aes(x=Datausage\_BKT))+  
 geom\_bar(aes(fill=Datausage\_BKT))



##Cust service calls   
summary(CustServCalls)

## Min. 1st Qu. Median Mean 3rd Qu. Max.   
## 0.000 1.000 1.000 1.563 2.000 9.000

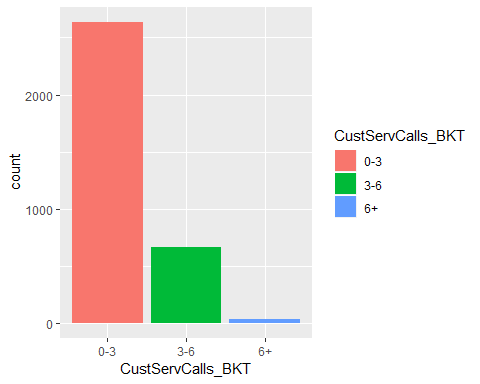
unique(CustServCalls)

## [1] 1 0 2 3 4 5 7 9 6 8

table(CustServCalls)

## CustServCalls  
## 0 1 2 3 4 5 6 7 8 9   
## 697 1181 759 429 166 66 22 9 2 2

#CustChurn$CustServCalls = as.factor(CustServCalls)  
  
CustServCalls\_BKT = ifelse( CustServCalls < 3, "0-3",  
 ifelse(CustServCalls < 6 , "3-6",  
 "6+"  
 ))  
  
CustChurn %>% ggplot(aes(x=CustServCalls\_BKT))+  
 geom\_bar(aes(fill=CustServCalls\_BKT))



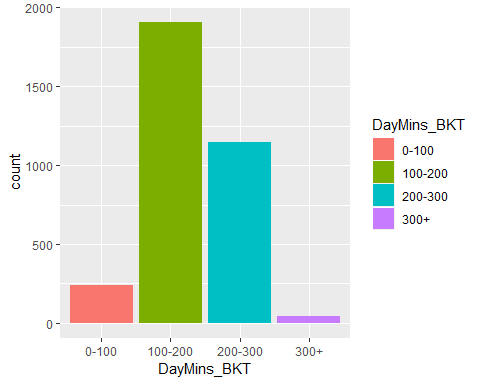
##Average mins per day calls  
summary(DayMins)

## Min. 1st Qu. Median Mean 3rd Qu. Max.   
## 0.0 143.7 179.4 179.8 216.4 350.8

unique(DayMins)

## [1] 265.1 161.6 243.4 299.4 166.7 223.4 218.2 157.0 184.5 258.6 129.1  
## [12] 187.7 128.8 156.6 120.7 332.9 196.4 190.7 189.7 224.4 155.1 62.4  
## [23] 183.0 110.4 81.1 124.3 213.0 134.3 190.0 119.3 84.8 226.1 212.0  
## [34] 249.6 176.8 220.0 146.3 130.8 203.9 140.4 126.3 173.1 124.8 85.8  
## [45] 154.0 120.9 211.3 187.0 159.1 133.2 191.9 220.6 186.1 160.2 151.0  
## [56] 175.5 126.9 198.4 148.8 229.3 192.1 268.6 193.7 180.7 131.2 148.1  
## [67] 251.5 125.2 211.6 178.9 241.8 224.9 248.6 203.4 235.8 157.1 300.3  
## [78] 61.6 214.1 170.2 201.1 215.4 165.6 249.5 210.6 179.3 157.9 214.3  
## [89] 154.1 237.9 143.9 252.9 179.1 278.4 160.1 198.2 212.1 251.8 161.2  
## [100] 178.3 151.7 135.0 170.5 238.1 281.4 117.9 148.6 229.8 165.0 185.0  
## [111] 161.0 126.7 58.9 196.8 162.6 282.5 113.7 239.8 210.2 213.8 170.9  
## [122] 154.2 201.4 70.7 187.5 91.7 214.2 145.5 166.3 231.0 200.3 197.0  
## [133] 129.9 175.8 203.1 183.2 205.0 148.5 192.6 246.5 167.1 231.9 146.7  
## [144] 271.5 181.5 257.7 193.8 102.8 187.9 226.0 260.4 178.7 337.4 157.6  
## [155] 183.6 142.1 136.3 217.1 98.9 206.3 243.1 189.8 202.0 170.1 230.9  
## [166] 237.1 182.1 116.8 219.2 252.6 147.1 202.1 173.5 232.1 197.1 58.2  
## [177] 115.6 259.9 158.7 271.6 160.6 232.4 133.8 176.9 209.9 137.5 289.5  
## [188] 198.1 149.7 326.5 292.9 83.0 145.7 182.3 218.0 140.6 152.7 106.7  
## [199] 243.8 194.4 213.9 217.2 241.1 203.5 155.2 167.6 226.7 151.4 180.0  
## [210] 250.2 223.0 166.0 136.1 149.3 65.4 213.4 206.9 186.2 280.2 196.6  
## [221] 312.0 199.0 168.8 134.4 202.6 74.5 83.6 192.2 220.2 135.1 253.4  
## [232] 225.0 198.5 110.3 60.0 214.8 181.8 157.4 207.9 207.0 119.0 143.7  
## [243] 165.9 138.6 84.7 62.6 164.9 134.5 143.3 168.3 262.4 206.2 225.8  
## [254] 138.3 94.4 160.0 206.6 134.7 214.4 192.8 151.1 221.4 218.9 192.7  
## [265] 204.4 172.3 211.7 221.6 197.9 147.5 206.4 205.9 207.6 303.9 230.6  
## [276] 99.5 177.1 172.7 204.2 85.7 215.5 171.7 266.6 170.4 158.0 92.0  
## [287] 234.0 272.1 296.4 227.2 248.7 236.3 205.6 94.1 60.4 121.0 117.8  
## [298] 223.5 176.3 138.7 86.3 58.8 68.7 239.2 198.3 205.2 272.6 128.3  
## [309] 169.6 201.3 214.7 169.2 194.1 233.8 225.1 183.9 221.8 64.6 154.6  
## [320] 260.2 155.9 107.0 182.5 220.1 152.2 236.2 166.1 244.6 134.2 150.1  
## [331] 257.1 124.4 141.7 230.0 162.3 350.8 193.3 78.2 83.4 195.6 201.8  
## [342] 164.8 179.2 214.0 205.7 165.5 221.0 242.1 151.6 176.2 196.0 159.5  
## [353] 230.2 210.5 102.0 126.0 168.4 105.6 206.5 229.6 278.3 234.4 167.3  
## [364] 221.1 145.8 222.8 183.4 264.3 146.0 127.3 178.8 97.2 259.8 256.5  
## [375] 169.5 239.7 171.5 239.9 142.3 184.1 203.8 248.8 192.9 122.4 104.9  
## [386] 173.2 119.4 250.3 155.0 288.7 240.4 190.3 278.0 153.5 273.4 155.3  
## [397] 133.1 246.8 165.4 59.5 286.7 117.3 127.9 225.5 149.0 198.9 256.4  
## [408] 264.8 98.2 159.8 190.6 184.0 261.8 147.9 106.4 133.7 193.5 178.2  
## [419] 226.2 70.9 240.3 75.0 69.1 96.6 214.6 258.1 149.8 190.4 181.4  
## [430] 155.7 149.9 222.3 149.4 242.9 150.4 208.9 130.7 119.6 273.6 156.1  
## [441] 177.5 175.2 114.3 251.4 216.9 159.3 143.1 186.6 170.8 124.0 172.8  
## [452] 217.4 265.9 93.6 168.2 202.9 261.4 73.3 253.7 45.0 231.3 47.4  
## [463] 227.4 40.9 68.5 163.5 163.0 213.7 310.4 48.4 171.2 166.5 216.6  
## [474] 107.8 141.3 237.5 234.5 103.1 129.5 279.8 136.8 100.1 224.5 288.1  
## [485] 148.7 194.6 194.5 174.1 131.8 146.8 200.7 145.6 229.4 211.0 121.5  
## [496] 216.0 293.0 74.3 62.3 228.6 228.1 309.9 201.9 183.8 186.7 209.4  
## [507] 223.2 164.2 150.5 234.2 55.3 89.7 80.2 125.7 207.2 157.5 160.4  
## [518] 159.0 102.6 159.7 202.8 57.5 169.9 335.5 139.5 187.8 146.2 231.8  
## [529] 156.4 220.7 172.0 128.2 130.2 195.4 293.3 191.3 209.6 215.7 161.4  
## [540] 144.2 256.2 112.7 299.5 194.8 100.8 82.5 146.4 177.9 150.7 180.1  
## [551] 265.3 128.6 161.5 165.3 195.0 205.5 235.6 192.0 261.7 235.5 263.8  
## [562] 175.6 242.5 138.1 264.7 282.3 211.2 205.3 252.0 231.2 200.1 266.7  
## [573] 118.1 175.3 125.1 241.9 241.2 222.4 189.5 123.1 256.7 30.9 187.4  
## [584] 315.6 277.5 147.2 185.8 155.4 97.6 206.0 216.8 103.3 139.4 191.2  
## [595] 221.7 62.9 215.6 94.7 203.2 195.3 114.4 175.9 249.9 210.7 87.2  
## [606] 137.4 224.8 261.2 196.5 271.2 300.4 57.1 162.1 145.0 34.0 193.4  
## [617] 191.7 161.3 150.6 184.6 121.1 109.6 167.5 115.8 276.6 179.4 187.3  
## [628] 201.2 189.6 186.8 187.6 244.9 187.1 170.7 161.1 169.4 254.4 127.7  
## [639] 219.1 273.5 161.9 241.7 62.8 281.1 228.2 209.8 265.6 214.9 110.5  
## [650] 137.8 112.8 180.4 153.7 261.3 246.2 191.0 208.3 253.0 202.3 174.4  
## [661] 127.1 143.5 186.9 194.0 234.8 123.7 173.9 130.9 314.6 227.9 95.5  
## [672] 185.3 105.8 178.0 172.1 169.3 119.1 194.2 198.8 167.7 202.2 322.5  
## [683] 216.2 76.4 72.7 210.4 127.2 219.5 99.3 224.7 176.6 283.9 180.6  
## [694] 125.9 237.6 274.3 199.6 217.7 212.7 256.3 267.9 163.6 180.9 105.0  
## [705] 271.4 206.7 166.8 204.9 127.0 267.4 281.0 270.8 124.1 162.8 254.8  
## [716] 254.9 107.7 158.8 182.9 178.4 110.9 166.9 244.8 120.8 215.9 140.1  
## [727] 139.8 321.6 166.6 260.0 190.2 82.2 163.8 267.8 287.3 101.2 109.1  
## [738] 110.1 111.0 144.8 135.4 84.2 209.1 130.1 136.7 67.7 200.4 125.8  
## [749] 226.3 120.5 91.1 167.9 257.4 237.2 103.0 153.8 205.1 175.7 154.4  
## [760] 209.7 150.0 199.2 217.6 175.4 152.0 174.9 176.4 160.9 228.7 144.0  
## [771] 135.9 334.3 130.5 105.4 188.9 111.8 212.4 346.8 113.9 171.4 275.4  
## [782] 197.2 116.1 217.3 207.7 277.3 125.3 216.7 97.4 246.4 143.4 156.2  
## [793] 114.8 232.5 143.6 176.7 263.4 167.8 142.5 133.0 95.0 198.6 142.6  
## [804] 111.9 122.8 189.3 93.5 158.6 243.2 220.9 144.4 212.3 147.0 96.2  
## [815] 12.5 178.1 123.0 208.0 193.0 174.5 116.7 93.8 239.5 167.4 143.2  
## [826] 232.8 162.0 25.9 322.3 191.5 291.1 208.8 255.9 252.7 132.1 217.0  
## [837] 101.9 211.5 153.4 185.2 104.6 245.2 274.4 98.4 279.9 187.2 276.2  
## [848] 217.8 190.5 179.9 235.9 144.6 189.0 101.0 165.1 189.1 131.5 166.4  
## [859] 87.7 35.1 246.6 78.5 251.6 270.3 177.3 262.2 173.6 106.6 209.5  
## [870] 95.4 131.6 112.2 172.5 194.3 307.1 118.2 155.5 125.6 199.3 222.2  
## [881] 92.8 193.2 113.2 166.2 207.8 245.4 287.1 192.3 141.9 220.5 156.0  
## [892] 235.1 188.4 247.8 221.2 118.5 83.5 183.3 236.8 134.0 191.4 174.8  
## [903] 275.2 174.0 107.9 221.3 141.1 178.6 139.0 181.6 84.9 217.9 270.9  
## [914] 243.0 150.9 219.9 168.0 256.8 182.8 117.6 145.4 169.1 186.4 76.1  
## [925] 260.8 211.8 162.7 121.7 67.4 229.7 176.0 247.7 115.4 139.6 217.5  
## [936] 196.3 253.2 98.0 249.4 129.6 87.6 203.6 213.6 266.3 115.0 270.5  
## [947] 61.9 189.2 171.6 78.6 200.9 185.1 254.3 185.4 197.8 153.1 96.8  
## [958] 247.0 321.3 243.7 236.9 148.2 254.7 284.4 0.0 151.8 141.4 285.7  
## [969] 58.4 90.4 147.7 302.7 169.7 124.2 132.9 245.0 89.5 186.0 223.9  
## [980] 179.5 112.0 245.7 142.8 202.4 236.1 51.9 81.3 115.7 157.2 269.7  
## [991] 132.0 82.6 125.5 82.3 183.1 165.7 176.1 177.6 83.2 235.0 105.7  
## [1002] 160.3 95.9 140.7 119.7 99.9 250.9 200.6 198.0 164.5 112.6 226.4  
## [1013] 152.6 274.9 195.7 204.3 222.5 174.3 219.7 144.9 236.5 109.5 81.6  
## [1024] 133.4 137.1 39.5 199.5 156.8 132.4 63.2 181.1 117.5 218.7 207.3  
## [1035] 273.3 266.1 104.7 168.6 174.7 87.0 204.5 226.5 234.1 133.3 133.9  
## [1046] 72.8 196.1 219.6 222.9 115.9 154.7 136.4 272.4 210.0 153.9 252.4  
## [1057] 152.4 237.4 197.3 199.1 233.7 207.1 139.7 177.2 169.8 159.9 115.1  
## [1068] 92.2 243.9 117.1 223.3 154.8 46.5 242.2 259.4 69.4 156.5 61.2  
## [1079] 102.3 219.4 137.2 271.1 103.4 52.2 235.7 103.7 148.4 191.1 218.5  
## [1090] 97.5 128.7 236.6 85.9 141.2 216.4 118.7 209.2 244.3 197.4 185.6  
## [1101] 137.6 273.9 242.3 254.1 115.5 132.7 236.4 179.8 119.2 224.0 19.5  
## [1112] 184.8 122.5 226.9 204.8 158.1 225.2 159.4 54.8 283.1 291.8 222.7  
## [1123] 68.4 273.0 225.3 283.2 131.4 105.9 247.3 193.1 241.0 134.8 163.1  
## [1134] 329.8 131.9 99.7 37.8 94.8 269.0 268.3 198.7 201.7 293.7 120.3  
## [1145] 278.5 273.8 131.1 197.7 129.7 200.0 152.8 268.4 188.5 170.6 75.3  
## [1156] 131.7 101.4 107.5 157.7 286.4 173.0 268.7 255.3 41.9 239.4 113.1  
## [1167] 182.7 202.7 190.8 132.6 122.0 91.5 153.6 244.7 172.4 157.3 135.8  
## [1178] 160.7 202.5 191.6 138.9 286.6 164.6 141.6 163.2 254.2 109.7 277.0  
## [1189] 139.2 121.6 270.4 203.3 215.1 301.7 152.3 208.7 190.1 54.2 230.3  
## [1200] 240.8 276.1 179.7 165.8 144.1 199.8 171.8 245.8 195.1 81.9 239.0  
## [1211] 152.5 295.4 272.7 236.7 111.4 153.0 218.8 205.4 225.4 275.8 142.9  
## [1222] 210.3 225.7 80.3 231.7 188.8 163.7 70.8 101.7 258.4 242.4 188.0  
## [1233] 250.6 260.1 281.3 128.5 172.2 230.4 129.3 238.0 211.1 212.8 191.8  
## [1244] 108.0 174.6 150.3 157.8 237.8 204.0 118.0 272.5 118.9 7.9 150.2  
## [1255] 144.5 220.8 216.3 266.0 96.7 82.7 204.6 253.1 130.0 261.9 240.2  
## [1266] 154.5 328.1 145.9 139.1 240.1 83.8 269.8 88.1 184.2 149.2 204.7  
## [1277] 213.2 269.6 140.2 136.2 88.5 215.3 269.2 160.5 228.9 224.2 148.3  
## [1288] 138.5 109.0 210.8 142.4 193.6 192.4 233.2 126.1 290.4 60.6 298.1  
## [1299] 222.1 136.6 289.8 260.9 196.2 172.9 249.8 268.8 106.1 27.0 196.7  
## [1310] 149.6 206.1 199.9 213.1 252.3 111.1 96.5 156.9 123.3 197.6 270.0  
## [1321] 47.7 182.6 231.5 251.3 177.4 47.8 121.8 101.1 92.3 168.9 146.5  
## [1332] 190.9 123.8 96.0 93.4 90.6 152.9 257.9 85.2 152.1 278.9 303.2  
## [1343] 238.9 92.7 137.3 203.7 88.8 137.9 224.3 268.1 267.1 37.7 239.3  
## [1354] 134.9 239.1 92.6 17.6 276.5 313.8 288.5 210.9 64.9 243.5 313.2  
## [1365] 75.8 195.9 171.9 228.4 227.1 271.7 245.5 245.3 134.1 92.4 159.6  
## [1376] 49.9 116.9 270.7 145.3 230.7 151.5 146.1 256.0 200.2 212.9 230.5  
## [1387] 253.5 98.8 129.0 86.0 193.9 109.4 195.5 264.4 141.5 133.5 273.2  
## [1398] 224.6 104.0 116.4 129.4 161.8 147.8 262.3 259.7 51.8 164.3 154.3  
## [1409] 122.9 297.9 125.4 247.5 294.9 126.8 143.0 91.9 86.5 109.9 326.3  
## [1420] 110.0 105.3 111.7 81.7 128.1 55.6 232.6 102.7 263.1 201.5 251.0  
## [1431] 109.8 279.5 173.4 96.1 109.2 183.5 227.8 305.2 197.5 181.3 262.9  
## [1442] 160.8 141.8 50.6 252.1 230.1 73.8 145.1 135.2 124.7 144.3 235.2  
## [1453] 218.6 265.2 184.7 115.3 113.0 294.2 71.2 94.9 215.8 139.9 153.2  
## [1464] 103.5 182.2 185.7 222.6 108.3 247.2 118.4 317.8 123.2 164.1 345.3  
## [1475] 264.9 208.4 162.4 281.2 232.9 234.7 240.0 298.4 111.6 207.5 258.8  
## [1486] 156.7 150.8 322.4 180.5 274.7 142.0 232.7 288.0 216.1 227.0 245.9  
## [1497] 257.3 301.5 233.9 99.6 116.2 140.5 277.9 308.6 242.6 213.5 240.7  
## [1508] 314.1 255.1 49.2 40.4 291.2 186.5 163.3 295.3 114.1 279.1 255.8  
## [1519] 169.0 2.6 181.9 274.0 229.9 139.3 7.8 140.0 237.3 51.5 116.0  
## [1530] 106.5 218.4 227.5 185.9 111.2 244.1 127.4 54.7 283.4 258.0 90.5  
## [1541] 54.0 264.0 220.4 221.9 263.7 61.3 324.7 129.2 257.2 124.6 175.1  
## [1552] 78.7 211.9 63.7 237.7 225.9 137.0 220.3 308.0 58.0 90.0 86.1  
## [1563] 296.0 146.6 260.5 124.5 77.6 138.8 164.0 90.7 108.6 89.8 279.3  
## [1574] 210.1 113.6 127.8 99.4 276.9 163.4 287.4 158.4 288.8 102.1 177.7  
## [1585] 250.8 233.3 180.2 234.9 233.5 135.7 122.2 153.3 122.3 259.3 194.9  
## [1596] 44.9 262.8 171.1 178.5 203.0 242.8 182.0 118.6 161.7 248.9 158.9  
## [1607] 93.3 18.9 130.6 94.2 189.4 222.0 271.8 100.0 305.1 72.5 105.2  
## [1618] 86.8 78.3 97.1 291.6 247.6 113.3 146.9 96.3 280.4 173.7 113.8  
## [1629] 184.4 223.8 143.8 29.9 276.7 181.2 247.4 107.2 294.7 306.2 238.8  
## [1640] 251.9 264.5 141.0 140.8 125.0 103.2 138.4 274.6 286.2 268.0 142.2  
## [1651] 97.8 266.9 289.1 180.3 295.0 240.9 107.3 238.4 51.1 227.7 78.1  
## [1662] 280.0 224.1 124.9 321.1 231.1 180.8

DayMins\_BKT = ifelse(DayMins < 100, "0-100",  
 ifelse(DayMins < 200 , "100-200",  
 ifelse(DayMins <300, "200-300",  
 "300+"  
 )))  
  
CustChurn %>% ggplot(aes(x=DayMins\_BKT))+  
 geom\_bar(aes(fill=DayMins\_BKT))



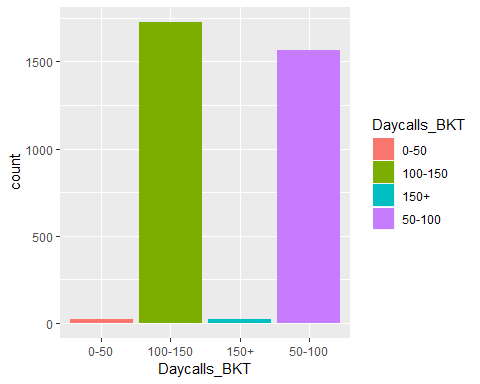
## number of calls in a day   
  
summary(DayCalls)

## Min. 1st Qu. Median Mean 3rd Qu. Max.   
## 0.0 87.0 101.0 100.4 114.0 165.0

unique(DayCalls)

## [1] 110 123 114 71 113 98 88 79 97 84 137 127 96 70 67 139 66  
## [18] 90 117 89 112 103 86 76 115 73 109 95 105 121 118 94 80 128  
## [35] 64 106 102 85 82 77 120 133 135 108 57 83 129 91 92 74 93  
## [52] 101 146 72 99 104 125 61 100 87 131 65 124 119 52 68 107 47  
## [69] 116 151 126 122 111 145 78 136 140 148 81 55 69 158 134 130 63  
## [86] 53 75 141 163 59 132 138 54 58 62 144 143 147 36 40 150 56  
## [103] 51 165 30 48 60 42 0 45 160 149 152 142 156 35 49 157 44

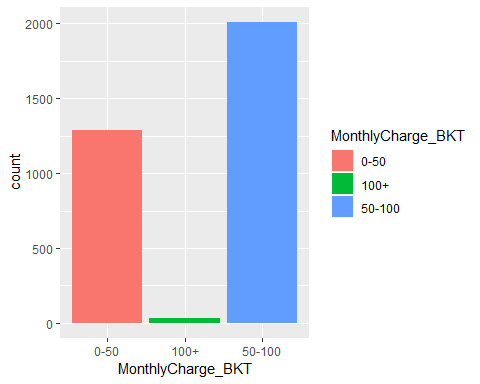
Daycalls\_BKT = ifelse(DayCalls < 50, "0-50",  
 ifelse(DayCalls < 100 , "50-100",  
 ifelse(DayCalls <150, "100-150",  
 "150+"  
 )))  
  
  
CustChurn %>% ggplot(aes(x=Daycalls\_BKT))+  
 geom\_bar(aes(fill=Daycalls\_BKT))



## monthly bill  
summary(MonthlyCharge)

## Min. 1st Qu. Median Mean 3rd Qu. Max.   
## 14.00 45.00 53.50 56.31 66.20 111.30

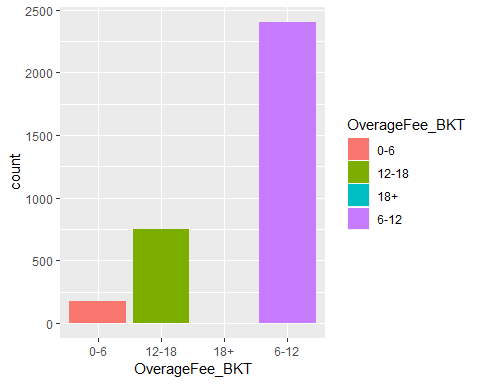
MonthlyCharge\_BKT = ifelse(MonthlyCharge < 50, "0-50",  
 ifelse(MonthlyCharge < 100 , "50-100",  
 "100+"  
 ))  
CustChurn %>% ggplot(aes(x=MonthlyCharge\_BKT))+  
 geom\_bar(aes(fill=MonthlyCharge\_BKT))



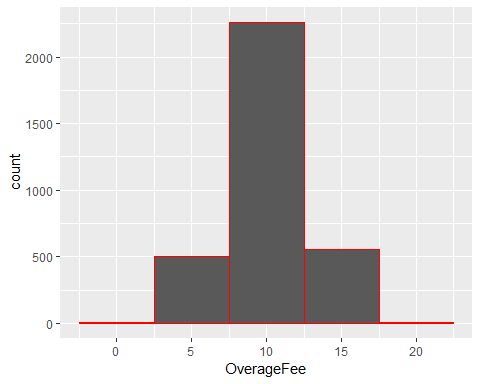
## overage charges  
  
summary(OverageFee)

## Min. 1st Qu. Median Mean 3rd Qu. Max.   
## 0.00 8.33 10.07 10.05 11.77 18.19

OverageFee\_BKT = ifelse(OverageFee < 6, "0-6",  
 ifelse(OverageFee < 12 , "6-12",  
 ifelse(OverageFee < 18 , "12-18",  
 "18+"  
 )))  
   
CustChurn %>% ggplot(aes(x=OverageFee\_BKT))+  
 geom\_bar(aes(fill=OverageFee\_BKT))



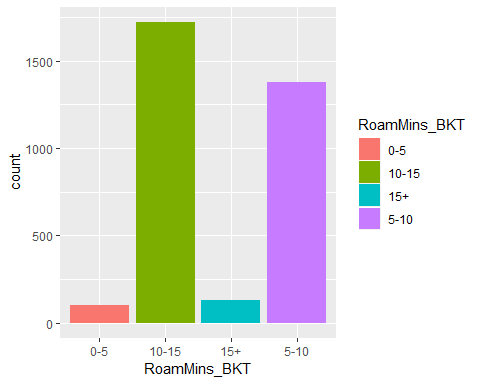
ggplot(CustChurn, aes(x=OverageFee)) +  
 geom\_histogram(binwidth = 5, colour='red' )



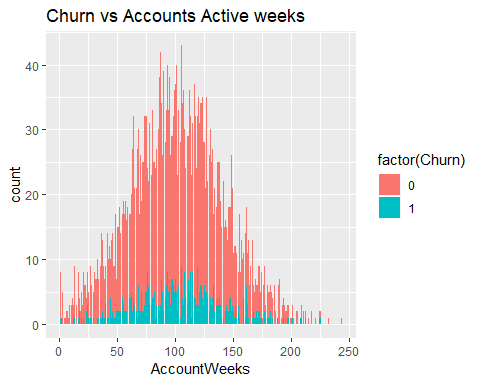
## Roaming mins   
  
  
summary(RoamMins)

## Min. 1st Qu. Median Mean 3rd Qu. Max.   
## 0.00 8.50 10.30 10.24 12.10 20.00

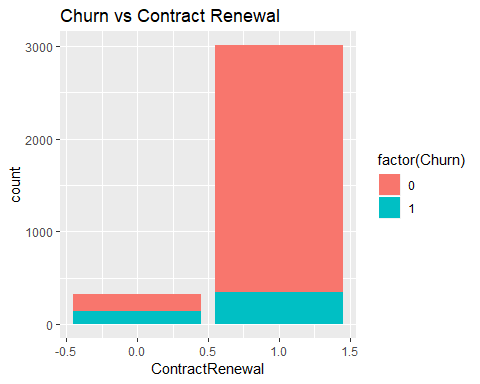
RoamMins\_BKT = ifelse(RoamMins < 5,"0-5",  
 ifelse(RoamMins < 10 , "5-10",  
 ifelse(RoamMins < 15 , "10-15",  
 "15+"  
 )))  
   
CustChurn %>% ggplot(aes(x=RoamMins\_BKT))+  
 geom\_bar(aes(fill=RoamMins\_BKT))



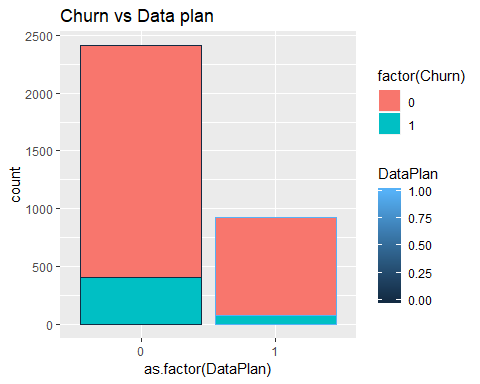
#ggplot(CustChurn, aes(x=RoamMins)) +  
 # geom\_histogram(binwidth = 4, colour='red' )  
  
  
### Bi-variate analysis   
  
##Churn and Accounts week  
#ggplot(CustChurn,aes(x=AccountWeeks, fill=Churn)) + geom\_bar() +  
 # labs(title = "Churn vs ActiveAcconts")  
  
ggplot(CustChurn,aes(x=AccountWeeks, fill=factor(Churn),colour=AccountWeeks)) + geom\_bar() +labs(title = "Churn vs Accounts Active weeks ")



#plot(Churn~AccountWeeks)  
  
## Churn and COntract renewal  
  
ggplot(CustChurn,aes(x=ContractRenewal, fill=factor(Churn),colour=ContractRenewal)) + geom\_bar() +labs(title = "Churn vs Contract Renewal")



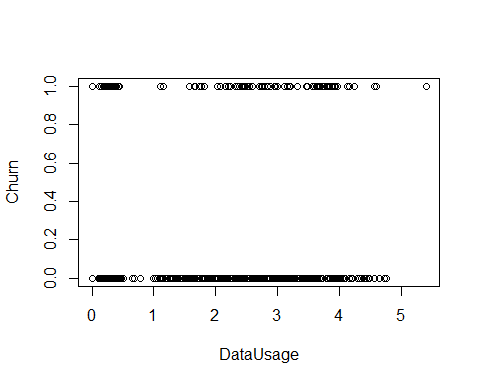
# (Churn~ContractRenewal)  
## Churn and data plan  
  
ggplot(CustChurn,aes(x=as.factor(DataPlan) , fill=factor(Churn),colour=DataPlan)) + geom\_bar() +labs(title = "Churn vs Data plan")



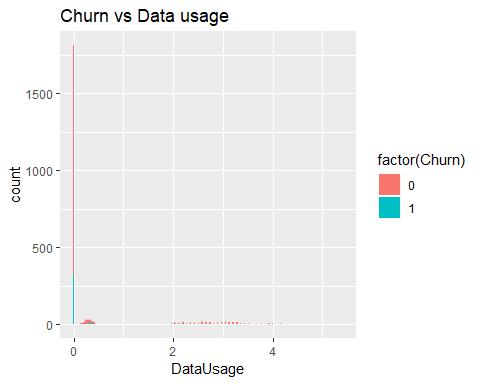
CustChurn %>%  
 group\_by(DataPlan,Churn) %>% tally()

## # A tibble: 4 x 3  
## # Groups: DataPlan [?]  
## DataPlan Churn n  
## <int> <int> <int>  
## 1 0 0 2008  
## 2 0 1 403  
## 3 1 0 842  
## 4 1 1 80

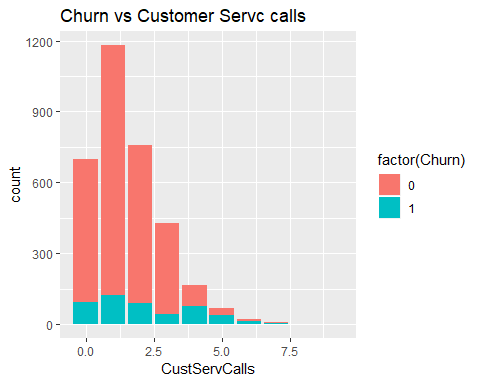
## Churn and data usage  
  
plot(Churn ~ DataUsage,CustChurn)



ggplot(CustChurn,aes(x=DataUsage , fill=factor(Churn),colour=DataUsage)) + geom\_bar() +labs(title = "Churn vs Data usage")



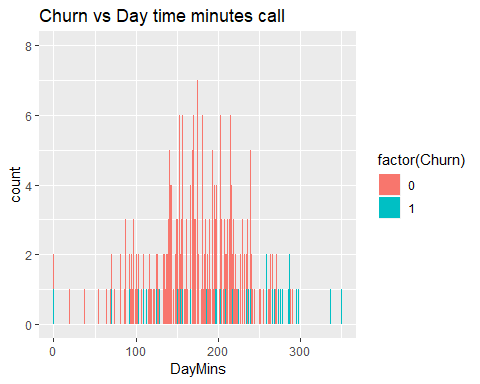
#CustChurn %>%  
 # group\_by(Churn,DataUsage) %>% tally()  
  
  
## Churn and cust service calls   
  
ggplot(CustChurn,aes(x=CustServCalls , fill=factor(Churn),colur=CustServCalls)) + geom\_bar() +labs(title = "Churn vs Customer Servc calls")



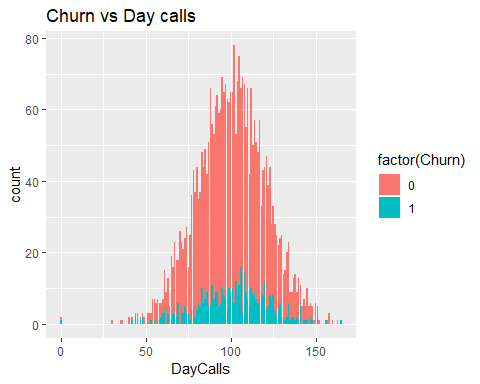
CustChurn %>%  
 group\_by(CustServCalls,Churn) %>% tally()

## # A tibble: 19 x 3  
## # Groups: CustServCalls [?]  
## CustServCalls Churn n  
## <int> <int> <int>  
## 1 0 0 605  
## 2 0 1 92  
## 3 1 0 1059  
## 4 1 1 122  
## 5 2 0 672  
## 6 2 1 87  
## 7 3 0 385  
## 8 3 1 44  
## 9 4 0 90  
## 10 4 1 76  
## 11 5 0 26  
## 12 5 1 40  
## 13 6 0 8  
## 14 6 1 14  
## 15 7 0 4  
## 16 7 1 5  
## 17 8 0 1  
## 18 8 1 1  
## 19 9 1 2

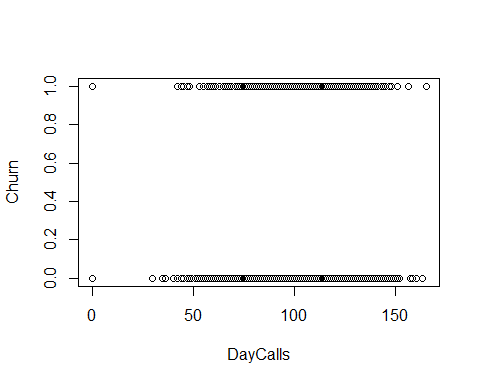
## Churn and dat time minutes calls   
  
ggplot(CustChurn,aes(x=DayMins , fill=factor(Churn),colour=DayMins)) + geom\_bar() +  
labs(title = "Churn vs Day time minutes call")



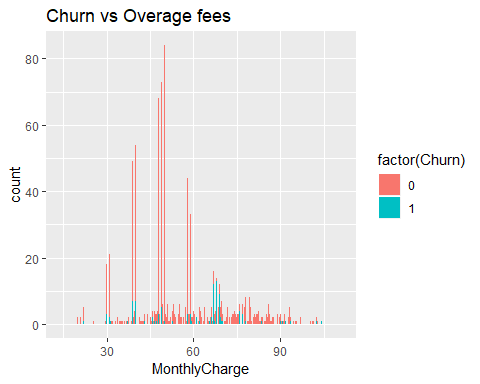
#plot(Churn~DayMins,CustChurn)  
  
#CustChurn %>%  
# group\_by(DayMins,Churn) %>% tally()  
## Churn and day calls   
  
ggplot(CustChurn,aes(x=DayCalls , fill=factor(Churn),colour=DayCalls)) + geom\_bar() +labs(title = "Churn vs Day calls")



plot(Churn~DayCalls,CustChurn)

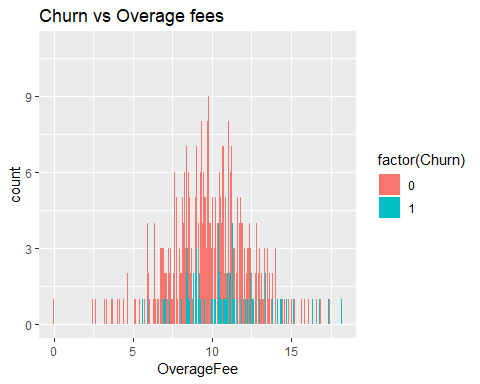


## Churn and monthcharge   
  
ggplot(CustChurn,aes(x=MonthlyCharge, fill=factor(Churn),colour=MonthlyCharge)) + geom\_bar() +labs(title = "Churn vs Overage fees")



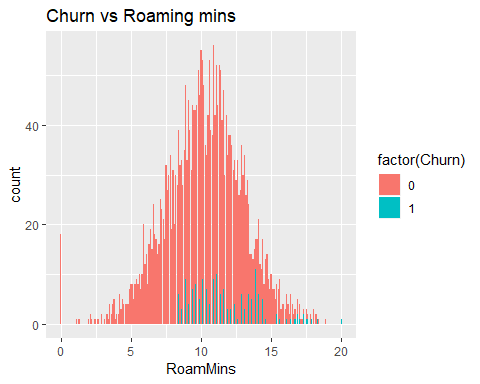
#plot(Churn~MonthlyCharge,CustChurn)  
  
  
## Churn and overage fees   
  
ggplot(CustChurn,aes(x=OverageFee , fill=factor(Churn),colour=OverageFee)) + geom\_bar() +labs(title = "Churn vs Overage fees")

## Warning: position\_stack requires non-overlapping x intervals

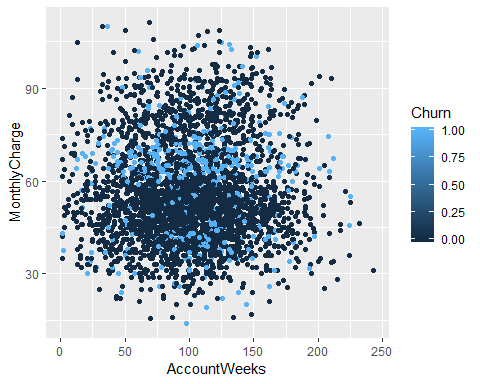


#plot(Churn~OverageFee,CustChurn)  
  
  
## Churn and roaming mins  
  
ggplot(CustChurn,aes(x=RoamMins , fill=factor(Churn),colour=RoamMins)) + geom\_bar() + labs(title = "Churn vs Roaming mins")

## Warning: position\_stack requires non-overlapping x intervals



## plot for Overage fees and Month charge and Churm  
  
qplot(AccountWeeks,MonthlyCharge,colour=Churn ,data=CustChurn)



#plot(Churn~RoamMins,CustChurn)  
  
## Dividind the data into test and training data set   
  
set.seed(123)  
  
 ind = sample(2,nrow(CustChurn),replace = TRUE,prob = c(.7,.3))  
 dev\_sample = CustChurn[ind==1,]   
 test\_sample = CustChurn[ind==2,]  
 table(CustChurn$Churn )

##   
## 0 1   
## 2850 483

table(dev\_sample$Churn)

##   
## 0 1   
## 1994 338

table(test\_sample$Churn)

##   
## 0 1   
## 856 145

# Run the logistic model   
   
   
   
 model1 = glm(formula = Churn ~ AccountWeeks + ContractRenewal + DataPlan + DataUsage + CustServCalls + DayMins+DayCalls + MonthlyCharge + OverageFee + RoamMins,family = "binomial" ,data=dev\_sample )  
  
 summary(model1)

##   
## Call:  
## glm(formula = Churn ~ AccountWeeks + ContractRenewal + DataPlan +   
## DataUsage + CustServCalls + DayMins + DayCalls + MonthlyCharge +   
## OverageFee + RoamMins, family = "binomial", data = dev\_sample)  
##   
## Deviance Residuals:   
## Min 1Q Median 3Q Max   
## -1.9668 -0.5202 -0.3512 -0.2116 2.9745   
##   
## Coefficients:  
## Estimate Std. Error z value Pr(>|z|)   
## (Intercept) -5.895755 0.653676 -9.019 < 2e-16 \*\*\*  
## AccountWeeks 0.001117 0.001647 0.678 0.49760   
## ContractRenewal -1.935344 0.174340 -11.101 < 2e-16 \*\*\*  
## DataPlan -1.100625 0.646462 -1.703 0.08866 .   
## DataUsage 1.913574 2.306805 0.830 0.40680   
## CustServCalls 0.488415 0.046601 10.481 < 2e-16 \*\*\*  
## DayMins 0.045392 0.038951 1.165 0.24387   
## DayCalls 0.003432 0.003278 1.047 0.29514   
## MonthlyCharge -0.187026 0.228794 -0.817 0.41368   
## OverageFee 0.453788 0.389956 1.164 0.24455   
## RoamMins 0.066855 0.025675 2.604 0.00922 \*\*   
## ---  
## Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1  
##   
## (Dispersion parameter for binomial family taken to be 1)  
##   
## Null deviance: 1930.1 on 2331 degrees of freedom  
## Residual deviance: 1537.3 on 2321 degrees of freedom  
## AIC: 1559.3  
##   
## Number of Fisher Scoring iterations: 5

vif(model1)

## AccountWeeks ContractRenewal DataPlan DataUsage   
## 1.003991 1.056485 13.900207 1582.255665   
## CustServCalls DayMins DayCalls MonthlyCharge   
## 1.085483 945.525019 1.009814 2824.386789   
## OverageFee RoamMins   
## 206.703087 1.185983

#Predict the test sample   
   
 #pred2 = predict(model1,newdata = dev\_sample, type = "response")  
 #Churn\_pred\_num1 = ifelse(pred2 >.5,1,0)  
 #churn\_pred1 = factor(Churn\_pred\_num1,levels = c(0,1))   
 #churn\_act1 = dev\_sample$Churn  
 #confusionMatrix(churn\_pred1,churn\_act1)  
   
 # Run the logistic model by removing Accountweek as its insignificant   
 model2 = glm(formula = Churn ~ ContractRenewal + DataPlan + DataUsage + CustServCalls + DayMins+DayCalls + MonthlyCharge + OverageFee + RoamMins,family = "binomial" ,data=dev\_sample )  
  
 summary(model2)

##   
## Call:  
## glm(formula = Churn ~ ContractRenewal + DataPlan + DataUsage +   
## CustServCalls + DayMins + DayCalls + MonthlyCharge + OverageFee +   
## RoamMins, family = "binomial", data = dev\_sample)  
##   
## Deviance Residuals:   
## Min 1Q Median 3Q Max   
## -1.9696 -0.5152 -0.3541 -0.2108 2.9735   
##   
## Coefficients:  
## Estimate Std. Error z value Pr(>|z|)   
## (Intercept) -5.781490 0.630878 -9.164 <2e-16 \*\*\*  
## ContractRenewal -1.937053 0.174299 -11.113 <2e-16 \*\*\*  
## DataPlan -1.106444 0.646227 -1.712 0.0869 .   
## DataUsage 1.955342 2.305215 0.848 0.3963   
## CustServCalls 0.489284 0.046592 10.501 <2e-16 \*\*\*  
## DayMins 0.046077 0.038926 1.184 0.2365   
## DayCalls 0.003511 0.003274 1.073 0.2834   
## MonthlyCharge -0.190995 0.228641 -0.835 0.4035   
## OverageFee 0.460001 0.389721 1.180 0.2379   
## RoamMins 0.066629 0.025655 2.597 0.0094 \*\*   
## ---  
## Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1  
##   
## (Dispersion parameter for binomial family taken to be 1)  
##   
## Null deviance: 1930.1 on 2331 degrees of freedom  
## Residual deviance: 1537.8 on 2322 degrees of freedom  
## AIC: 1557.8  
##   
## Number of Fisher Scoring iterations: 5

vif(model2)

## ContractRenewal DataPlan DataUsage CustServCalls   
## 1.056622 13.885780 1579.677485 1.085563   
## DayMins DayCalls MonthlyCharge OverageFee   
## 945.340012 1.008396 2819.916729 206.379352   
## RoamMins   
## 1.185670

# Run the logistic model by removing Dataplan as its insignific  
 model3 = glm(formula = Churn ~ ContractRenewal + DataUsage + CustServCalls + DayMins+DayCalls + MonthlyCharge + OverageFee + RoamMins,family = "binomial" ,data=dev\_sample )  
  
 summary(model3)

##   
## Call:  
## glm(formula = Churn ~ ContractRenewal + DataUsage + CustServCalls +   
## DayMins + DayCalls + MonthlyCharge + OverageFee + RoamMins,   
## family = "binomial", data = dev\_sample)  
##   
## Deviance Residuals:   
## Min 1Q Median 3Q Max   
## -1.9852 -0.5191 -0.3524 -0.2157 2.8992   
##   
## Coefficients:  
## Estimate Std. Error z value Pr(>|z|)   
## (Intercept) -5.894484 0.627488 -9.394 < 2e-16 \*\*\*  
## ContractRenewal -1.948386 0.174204 -11.184 < 2e-16 \*\*\*  
## DataUsage 1.444688 2.286187 0.632 0.527439   
## CustServCalls 0.486528 0.046556 10.450 < 2e-16 \*\*\*  
## DayMins 0.043517 0.038897 1.119 0.263242   
## DayCalls 0.003329 0.003266 1.019 0.308148   
## MonthlyCharge -0.176478 0.228507 -0.772 0.439933   
## OverageFee 0.434748 0.389439 1.116 0.264275   
## RoamMins 0.083277 0.023971 3.474 0.000513 \*\*\*  
## ---  
## Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1  
##   
## (Dispersion parameter for binomial family taken to be 1)  
##   
## Null deviance: 1930.1 on 2331 degrees of freedom  
## Residual deviance: 1540.8 on 2323 degrees of freedom  
## AIC: 1558.8  
##   
## Number of Fisher Scoring iterations: 5

vif(model3)

## ContractRenewal DataUsage CustServCalls DayMins   
## 1.055011 1506.898522 1.082501 948.021057   
## DayCalls MonthlyCharge OverageFee RoamMins   
## 1.007522 2775.111344 206.682070 1.022187

# Run the logistic model by removing Data usage as its insignific  
 model4 = glm(formula = Churn ~ ContractRenewal + CustServCalls + DayMins+DayCalls + MonthlyCharge + OverageFee + RoamMins,family = "binomial" ,data=dev\_sample )  
  
 summary(model4)

##   
## Call:  
## glm(formula = Churn ~ ContractRenewal + CustServCalls + DayMins +   
## DayCalls + MonthlyCharge + OverageFee + RoamMins, family = "binomial",   
## data = dev\_sample)  
##   
## Deviance Residuals:   
## Min 1Q Median 3Q Max   
## -1.9892 -0.5184 -0.3521 -0.2137 2.9093   
##   
## Coefficients:  
## Estimate Std. Error z value Pr(>|z|)   
## (Intercept) -5.959657 0.619501 -9.620 < 2e-16 \*\*\*  
## ContractRenewal -1.952574 0.174128 -11.213 < 2e-16 \*\*\*  
## CustServCalls 0.486941 0.046539 10.463 < 2e-16 \*\*\*  
## DayMins 0.018965 0.001687 11.240 < 2e-16 \*\*\*  
## DayCalls 0.003305 0.003264 1.013 0.311220   
## MonthlyCharge -0.032136 0.005971 -5.382 7.37e-08 \*\*\*  
## OverageFee 0.189421 0.029905 6.334 2.39e-10 \*\*\*  
## RoamMins 0.083632 0.023973 3.489 0.000486 \*\*\*  
## ---  
## Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1  
##   
## (Dispersion parameter for binomial family taken to be 1)  
##   
## Null deviance: 1930.1 on 2331 degrees of freedom  
## Residual deviance: 1541.2 on 2324 degrees of freedom  
## AIC: 1557.2  
##   
## Number of Fisher Scoring iterations: 5

##calculate VIF for multicolinearity   
 vif(model4)

## ContractRenewal CustServCalls DayMins DayCalls   
## 1.054128 1.082623 1.784465 1.007298   
## MonthlyCharge OverageFee RoamMins   
## 1.894342 1.219067 1.021895

# Run the logistic model by removing day calls as its insignific  
 model5 = glm(formula = Churn ~ ContractRenewal + CustServCalls + DayMins + MonthlyCharge + OverageFee + RoamMins,family = "binomial" ,data=dev\_sample )  
  
 summary(model5)

##   
## Call:  
## glm(formula = Churn ~ ContractRenewal + CustServCalls + DayMins +   
## MonthlyCharge + OverageFee + RoamMins, family = "binomial",   
## data = dev\_sample)  
##   
## Deviance Residuals:   
## Min 1Q Median 3Q Max   
## -1.9723 -0.5213 -0.3538 -0.2161 2.9359   
##   
## Coefficients:  
## Estimate Std. Error z value Pr(>|z|)   
## (Intercept) -5.617183 0.516196 -10.882 < 2e-16 \*\*\*  
## ContractRenewal -1.952575 0.174162 -11.211 < 2e-16 \*\*\*  
## CustServCalls 0.485537 0.046462 10.450 < 2e-16 \*\*\*  
## DayMins 0.019000 0.001687 11.263 < 2e-16 \*\*\*  
## MonthlyCharge -0.032181 0.005968 -5.392 6.95e-08 \*\*\*  
## OverageFee 0.187678 0.029852 6.287 3.24e-10 \*\*\*  
## RoamMins 0.084364 0.023968 3.520 0.000432 \*\*\*  
## ---  
## Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1  
##   
## (Dispersion parameter for binomial family taken to be 1)  
##   
## Null deviance: 1930.1 on 2331 degrees of freedom  
## Residual deviance: 1542.2 on 2325 degrees of freedom  
## AIC: 1556.2  
##   
## Number of Fisher Scoring iterations: 5

##calculate VIF for multicolinearity   
   
 vif(model5)

## ContractRenewal CustServCalls DayMins MonthlyCharge   
## 1.054101 1.080490 1.782955 1.893563   
## OverageFee RoamMins   
## 1.213727 1.021074

pred1 = predict(model5,newdata = test\_sample, type = "response")  
   
 Churn\_pred\_num = ifelse(pred1 >.5,1,0)  
 churn\_pred = factor(Churn\_pred\_num,levels = c(0,1))   
 churn\_act = test\_sample$Churn  
   
   
 confusionMatrix(churn\_pred,as.factor(churn\_act))

## Confusion Matrix and Statistics  
##   
## Reference  
## Prediction 0 1  
## 0 835 119  
## 1 21 26  
##   
## Accuracy : 0.8601   
## 95% CI : (0.8371, 0.881)  
## No Information Rate : 0.8551   
## P-Value [Acc > NIR] : 0.3464   
##   
## Kappa : 0.2152   
##   
## Mcnemar's Test P-Value : 2.444e-16   
##   
## Sensitivity : 0.9755   
## Specificity : 0.1793   
## Pos Pred Value : 0.8753   
## Neg Pred Value : 0.5532   
## Prevalence : 0.8551   
## Detection Rate : 0.8342   
## Detection Prevalence : 0.9530   
## Balanced Accuracy : 0.5774   
##   
## 'Positive' Class : 0   
##

mean(churn\_pred == churn\_act) ##accuracy of 84.7%%

## [1] 0.8601399

## Including Plots

You can also embed plots, for example:



Note that the echo = FALSE parameter was added to the code chunk to prevent printing of the R code that generated the plot.