CS422 - HW4

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Part 2.1

```
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(magrittr)
library(knitr)
setwd("-/Desktop")
df_hotel <- read.csv("hotel_bookings.csv", sep=",", header=T)</pre>
```

Part 2.1-A

```
hl_count = sum(df_hotel$hotel == "Resort Hotel")
cat("Number of 'H1' hotels: ", h1_count, "\n")

## Number of 'H1' hotels: 40060

h2_count = sum(df_hotel$hotel == "City Hotel")
cat("Number of 'H2' hotels: ", h2_count, "\n")

## Number of 'H2' hotels: 79330
```

Part 2.1-B

```
cancel_count = sum(df_hotel$is_canceled == 1)
not_canceled_count = sum(df_hotel$is_canceled == 0)

cat("Number of guests who canceled reservation: ", cancel_count, "\n")

## Number of guests who did not cancel the resrvation: ", not_canceled_count, "\n")

## Number of guests who did not cancel the resrvation: 75166
```

Part 2.1-C

```
Contract_count = sum(df_hotel$customer_type == "Contract")
Group_count = sum(df_hotel$customer_type == "Group")
Transient_count = sum(df_hotel$customer_type == "Transient")
type_list_count = c(Contract_count, Group_count, Transient_count)
type_list = c("Contract", "Group", "Transient")
most_common = which.max(type_list_count)
cat(paste0("Customer type with the most reservations is ", type_list[most_common], ", with ", type_list_count[most_common], " reservations."))
```

Customer type with the most reservations is Transient, with 89613 reservations.

Part 2.1-D

```
max_index = which.max(df_hotel$required_car_parking_spaces)
max_parking = df_hotel$required_car_parking[max_index]
count_max_parking = sum(df_hotel$required_car_parking_spaces == max_parking)
cat(paste0(count_max_parking, " customers required the most number of parking spaces (", max_parking, ")."))
```

2 customers required the most number of parking spaces (8).

Part 2.1-E

```
min_index = which.min(df_hotel$required_car_parking_spaces)
min_parking = df_hotel$required_car_parking[min_index]
count_min_parking = sum(df_hotel$required_car_parking_spaces == min_parking)
cat(paste0(count_min_parking, " customers required the least number of parking spaces (", min_parking, ")."))
```

111974 customers required the least number of parking spaces (0).

Part 2.1-F

```
#A B C D E F G H L P
#A B C D E F G H I K L P
#room_type = c("A","B","C","D","E","F","G","H","I","K","L","P")
#df_hotel$reserved_room_type
#df_hotel$reserved_room_type
equal_df <- df_hotel[as.character(df_hotel$reserved_room_type)==as.character(df_hotel$assigned_room_type), ]
percent_assigned = round(100*(nrow(equal_df)/nrow(df_hotel)), digits = 2)

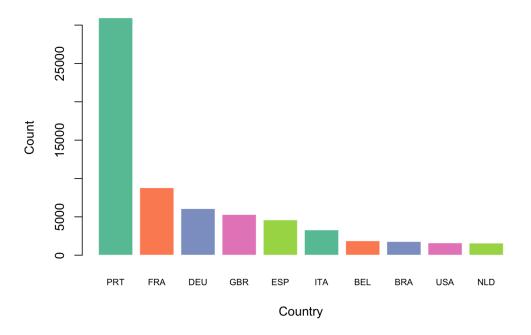
cat(paste0(percent_assigned, "% of the people who expressed a room preference during reservation got the room during check-in."))</pre>
```

87.51% of the people who expressed a room preference during reservation got the room during check-in.

Part 2.1-G

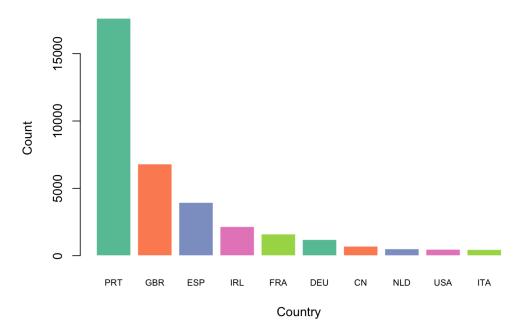
```
library(dplyr)
# City Hotel data
city_df <- filter(df_hotel, hotel == "City Hotel")</pre>
country_cities <- sort(summary(as.factor(city_df$country)), decreasing = TRUE)[1:10]</pre>
# Resort Hotel data
resort_df <- filter(df_hotel, hotel == "Resort Hotel")</pre>
country_resorts <- sort(summary(as.factor(resort_df$country)), decreasing = TRUE)</pre>
resort_names = union(names(country_resorts)[1:9], names(country_resorts)[11])
resort_vals = union(as.vector(country_resorts)[1:9], as.vector(country_resorts)[11])
# Bar charts
library(RColorBrewer)
coul <- brewer.pal(5, "Set2")</pre>
barplot(as.vector(country_cities),
        main = "City Hotels: Top Ten Countries",
        xlab = "Country", ylab = "Count",
        names.arg = names(country_cities), cex.names=.7,
        col=coul, border="white")
```

City Hotels: Top Ten Countries



```
barplot(resort_vals,
    main = "Resort Hotels: Top Ten Countries",
    xlab = "Country", ylab = "Count",
    names.arg = resort_names, cex.names=.7,
    col=coul, border="white")
```

Resort Hotels: Top Ten Countries



Part 2.1-H-i

```
top_country = resort_names[1]
cat(paste0("The code for the country with the most visitors is ", top_country, "."))
```

The code for the country with the most visitors is PRT.

Part 2.1-H-ii

cat("Based on this country code, and assuming the other frequent countries are nearby, I am guessing that this da ta is from Portugal.")

Based on this country code, and assuming the other frequent countries are nearby, I am guessing that this data is from Portugal.

Part 2.2-A-i

```
# Modifying the dataset -- grouping variables into single columns
library(rpart)
library("data.table")

##
## Attaching package: 'data.table'

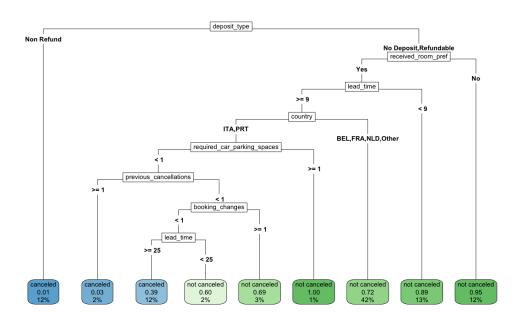
## The following objects are masked from 'package:dplyr':
##
## between, first, last

library("caret")

## Loading required package: lattice
```

Loading required package: ggplot2

```
library(rpart.plot)
library(ROCR)
set.seed(1122)
df_hotel[, "arrival_date_month"] <- sapply(df_hotel[, "arrival_date_month"], as.character)</pre>
df_hotel$arrival_date_month[df_hotel$arrival_date_month %in% c("March","April","May")] <- "spring"
df_hotel$arrival_date_month[df_hotel$arrival_date_month %in% c("December","January","February")] <- "winter"
df_hotel$arrival_date_month[df_hotel$arrival_date_month %in% c("June","July","August")] <- "summer"
df_hotel$arrival_date_month[df_hotel$arrival_date_month %in% c("September", "October", "November")] <- "fall"
df_hotel <- df_hotel %>% rename(season = arrival_date_month)
df_hotel[, "country"] <- sapply(df_hotel[, "country"], as.character)</pre>
df_hotel$country[df_hotel$country %in% c("GBR","IRL","USA")] <- "English-speaking"</pre>
df_hotel$country[df_hotel$country %in% c("BRA", "ESP")] <- "Spanish-speaking"
df_hotel$country[df_hotel$country %in% c("PRT")] <- "PRT"</pre>
df_hotel$country[df_hotel$country %in% c("Other Popular European")] <- "Other Popular European"
`%nin%` = Negate(`%in%`)
df_hotel$country[df_hotel$country %nin% c("BEL", "FRA", "ITA", "NLD", "PRT", "BRA", "ESP", "GBR", "IRL", "USA")] <- "Othe
r"
df_hotel[, "reserved_room_type"] <- sapply(df_hotel[, "reserved_room_type"], as.character)</pre>
df_hotel[, "assigned_room_type"] <- sapply(df_hotel[, "assigned_room_type"], as.character)</pre>
df hotel[df hotel$reserved room type == df hotel$assigned room type, "received room pref"] <- "Yes"</pre>
df_hotel[df_hotel$reserved_room_type != df_hotel$assigned_room_type,"received_room_pref"] <- "No"</pre>
df_hotel$reserved_room_type <- NULL</pre>
df_hotel$assigned_room_type <- NULL</pre>
df_hotel[, "is_canceled"] <- sapply(df_hotel[, "is_canceled"], as.character)</pre>
df_hotel$is_canceled[df_hotel$is_canceled %in% c(1)] <- "canceled"</pre>
df_hotel$is_canceled[df_hotel$is_canceled %in% c(0)] <- "not canceled"</pre>
df_hotel$nights_stayed <- rowSums(df_hotel[,c("stays_in_weekend_nights", "stays_in_week_nights")], na.rm=TRUE)</pre>
df_hotel$stays_in_week_nights <- NULL</pre>
df_hotel$stays_in_weekend_nights <- NULL</pre>
# Plotting the tree
index <- sample(1:nrow(df_hotel), size=0.1*nrow(df_hotel))</pre>
test <- df_hotel[index, ]</pre>
train <- df_hotel[-index, ]</pre>
mytree <- rpart(is_canceled ~ lead_time+</pre>
                   nights_stayed+
                   arrival_date_week_number+
                   is_repeated_guest+
                   country +
                   previous_cancellations+
                   booking_changes+
                   deposit_type+
                   received_room_pref+
                   required_car_parking_spaces,
                 control=rpart.control(minsplit=5, maxdepth =8,cp =0.005),
                 method = "class", parms = list(split = "gini"), data = df_hotel)
rpart.plot(mytree, main = "Hotel Data",
            type = 5, clip.right.labs=T, tweak = 1.2, extra = 106, fallen.leaves = T)
```



Part 2.2-A-i

```
agent_count = sum(df_hotel$customer_type == "Contract")
Group_count = sum(df_hotel$customer_type == "Group")
Transient_count = sum(df_hotel$customer_type == "Transient")
type_list_count = c(Contract_count, Group_count, Transient_count)
type_list = c("Contract", "Group", "Transient")
most_common = which.max(type_list_count)
cat(paste0("Customer type with the most reservations is ", type_list[most_common], ", with ", most_common))
```

Customer type with the most reservations is Transient, with 3

Part 2.2-A-ii

```
var1 <- names(mytree$variable.importance)[1]
var2 <- names(mytree$variable.importance)[2]
var3 <- names(mytree$variable.importance)[3]
var4 <- names(mytree$variable.importance)[4]
var5 <- names(mytree$variable.importance)[5]

score1 <- round(as.vector(mytree$variable.importance)[1], digits = 2)
score2 <- round(as.vector(mytree$variable.importance)[2], digits = 2)
score3 <- round(as.vector(mytree$variable.importance)[3], digits = 2)
score4 <- round(as.vector(mytree$variable.importance)[4], digits = 2)
score5 <- round(as.vector(mytree$variable.importance)[5], digits = 2)

cat(paste0("\n\nThe five most important variables and their 'scores' (as defined by rpart's variable.importance fu nction):\n\n"))</pre>
##
##
##
## The five most important variables and their 'scores' (as defined by rpart's variable.imporance function):
```

```
## 1. deposit_type, 12907.93
```

cat(paste0("1. ", var1, ", ", score1, "\n"))

```
## 2. lead_time, 2459.75
cat(paste0("3. ", var3, ", ", score3, "\n"))
## 3. country, 2223.43
cat(paste0("4. ", var4, ", ", score4, "\n"))
## 4. received room pref, 1904.31
cat(paste0("5. ", var5, ", ", score5, "\n"))
## 5. previous_cancellations, 1617.34
pred <- predict(mytree, test, type="class")</pre>
pred.prob <- predict(mytree, test, type="prob")</pre>
conmat<- confusionMatrix(pred, as.factor(test$is_canceled))</pre>
conmat
   Confusion Matrix and Statistics
##
##
                 Reference
## Prediction
                  canceled not canceled
##
     canceled
                       2570
                                     557
##
     not canceled
                       1954
                                    6858
##
##
                  Accuracy: 0.7897
##
                    95% CI: (0.7823, 0.797)
##
       No Information Rate: 0.6211
       P-Value [Acc > NIR] : < 2.2e-16
##
##
##
                      Kappa: 0.5245
##
##
    Mcnemar's Test P-Value : < 2.2e-16
##
               Sensitivity: 0.5681
##
##
               Specificity: 0.9249
##
            Pos Pred Value: 0.8219
##
            Neg Pred Value: 0.7783
##
                Prevalence: 0.3789
##
            Detection Rate : 0.2153
##
      Detection Prevalence: 0.2619
##
         Balanced Accuracy: 0.7465
##
##
           'Positive' Class : canceled
##
```

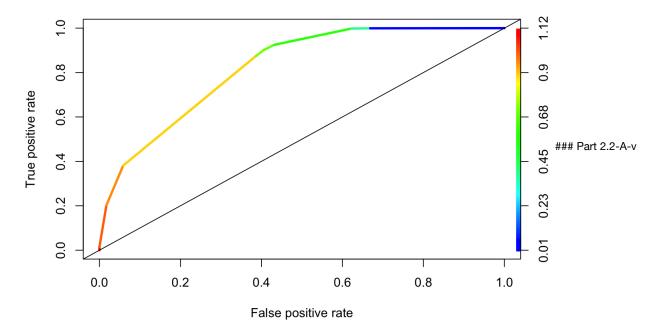
mytree\$variable.importance

```
##
                                                      lead_time
                    deposit_type
##
                      12907.9271
                                                      2459.7484
##
                         country
                                            received room pref
##
                       2223.4332
                                                      1904.3072
        {\tt previous\_cancellations}\ {\tt required\_car\_parking\_spaces}
##
##
                       1617.3407
                                                        804.2539
##
                booking_changes
                                             is_repeated_guest
##
                        391.1062
                                                        179.7804
##
                  nights stayed
                         22.8397
```

```
pred <- predict(mytree, test, type="class")</pre>
pred.prob <- predict(mytree, test, type="prob")</pre>
conmat<- confusionMatrix(pred, as.factor(test$is_canceled))</pre>
acc <- round(conmat$overall[1], digits=4)</pre>
bal_acc <- round(conmat$byClass[11], digits=4)</pre>
spec <- round(conmat$byClass[2], digits=4)</pre>
sens <- round(conmat$byClass[1], digits=4)</pre>
prec <- round(conmat$byClass[5], digits=4)</pre>
cat(paste0("\nAccuracy: ", acc))
## Accuracy: 0.7897
cat(paste0("\nError: ", 1-acc))
##
## Error: 0.2103
cat(paste0("\nBalanced Accuracy: ", bal_acc))
## Balanced Accuracy: 0.7465
cat(paste0("\nSpecificity: ", spec))
## Specificity: 0.9249
cat(paste0("\nSensitivity: ", sens))
## Sensitivity: 0.5681
cat(paste0("\nPrecision: ", prec))
## Precision: 0.8219
cat(paste0("\n"))
```

Part 2.2-A-iv

```
# Calculate AUC and plot ROC
rocr <- predict(mytree, newdata=test, type="prob")[,2]
f.pred <- prediction(rocr, test$is_canceled)
plot(performance(f.pred, "tpr", "fpr"), colorize=T, lwd=3)
abline(0,1)</pre>
```



The area under curve (AUC) for the full tree is 0.821