# Hotel Bookings Demand:

Data Insight



## INTRODUCTION

## **Objective:**

 To gain insights about the demand bookings between two hotels and create visuals to indicate these.

#### Some questions to answer in this analysis:

- See which month has the highest number of bookings for families with children and without children;
- See which type of hotel requires more parking spaces.

#### Dataset:

- For this project, the dataset available has 119390 entries and 32 columns.
- The dataset was taken from Kaggle: <a href="https://www.kaggle.com/jessemostipak/hotel-booking-demand">https://www.kaggle.com/jessemostipak/hotel-booking-demand</a>
- Columns:
  - Hotel: H1 = Resort Hotel or H2 = City Hotel
  - is\_canceled: value indicating if the booking was canceled (1) or not (0)
  - lead\_time: Number of days that elapsed between the entering date of the booking into the PMS and the arrival date
  - Arrival\_date\_year: year of arrival date
  - Arrival date month: month of arrival date
  - Arrival\_date\_week: day of arrival date
  - Stays\_in\_weekend\_nights: number of weekend nights the guest stayed or booked to stay at the hotel
  - Stays\_in\_week\_nights: number of week nights the guest stayed or booked to stay at the hotel
  - Adults: number of adults
  - Children: number of children
  - Babies: number of babies
  - Meal: type of meal booked
  - Country: country of origin

## **Dataset**

- Market\_segment: market segment designation. In categories. The term "TA" means "Travel Agents" and "TO" means "Tour Operators"
- Distribution\_channel: booking distribution channel.
- Is\_repeated\_guest: value indicating if the booking name was from a repeated guest (1) or not (0)
- Previous\_bookings\_not\_canceled: # of previous bookings not canceled by the customer prior to the current booking
- Reserved\_room\_type: code of room type reserved. Code is presented instead of designation for anonymity reasons.
- Assigned\_room\_type: code for the type of room assigned to the booking. Sometimes the assigned room type differs from the reserved room type due to reasons
- Booking\_changes: # of changes made to the booking from the moment the booking was entered on the PMS
- Deposit\_type: indication on if the customer made a deposit to guarantee the booking.
- Agent: ID of the travel agency that made the booking
- Company: ID of the company that made the booking
- Days\_in\_waiting\_list: # of days the booking was in the waiting list before it was confirmed to the customer
- Customer\_type: type of booking, assuming one of the four type = contract, transient, transient-party, group
- Adr: average daily rate as defined by dividing the sum of all lodging transactions by the total number of staying nights
- Required\_car\_parking\_spaces: # of car parking spaces required by the customer
- Total\_of\_special\_requests: # of special requests made by the customer
- Reservation\_status: reservation last status, assuming one of the categories = check-out, canceled, no-show
- Reservation\_status\_date: date at which the last status was set.

### LIBRARIES:

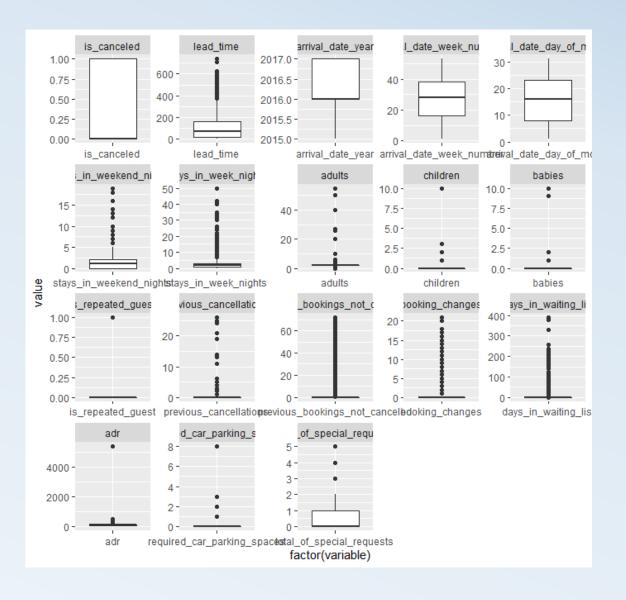
For this project, the following libraries were used:

- dplyr: for data manipulation
- ggplot2: for data visualization
- tidyr: to tidy up the data
- DT: provides an R interface to the JavaScript library
- reshape2: makes it easy to transform data between wide and long formats

#### DATASET SUMMARY

```
arrival_date_year arrival_date_month arrival_date_week_number arrival_date_day_of_month
         hote1
                     is_canceled
                                       lead time
City Hotel :79330
                                     Min. : 0
                                                                     August :13877
                                                                                        Min. : 1.00
                                                                                                                 Min. : 1.0
                    Min. :0.0000
                                                   Min.
                                                        :2015
Resort Hotel:40060
                    1st Qu.:0.0000
                                     1st Qu.: 18
                                                   1st Qu.:2016
                                                                     July :12661
                                                                                        1st Qu.:16.00
                                                                                                                 1st Qu.: 8.0
                                                                                                                 Median:16.0
                    Median :0.0000
                                     Median: 69
                                                   Median:2016
                                                                            :11791
                                                                                        Median :28.00
                                                   Mean :2016
                                                                     October:11160
                    Mean :0.3704
                                     Mean :104
                                                                                        Mean :27.17
                                                                                                                 Mean :15.8
                                     3rd Qu.:160
                     3rd Qu.:1.0000
                                                   3rd Qu.:2017
                                                                     April :11089
                                                                                        3rd Qu.:38.00
                                                                                                                 3rd Qu.:23.0
                           :1.0000
                                     Max.
                                            :737
                                                   Max.
                                                          :2017
                                                                     June :10939
                                                                                              :53.00
                                                                                                                       :31.0
                                                                                        Max.
                                                                                                                 Max.
                                                                     (other):47873
                                                adults
stays_in_weekend_nights stays_in_week_nights
                                                                children
                                                                                   babies
                                                                                                          meal
                                                                                                                        country
                                                                   : 0.0000
Min. : 0.0000
                       Min. : 0.0
                                            Min.
                                                  : 0.000
                                                             Min.
                                                                               Min.
                                                                                      : 0.000000
                                                                                                            :92310
                                                                                                                    PRT
                                                                                                                            :48590
1st Qu.: 0.0000
                       1st Qu.: 1.0
                                            1st Qu.: 2.000
                                                             1st Qu.: 0.0000
                                                                               1st Qu.: 0.000000
                                                                                                   FΒ
                                                                                                            : 798
                                                                                                                    GBR
                                                                                                                            :12129
Median : 1.0000
                       Median: 2.0
                                            Median : 2.000
                                                             Median : 0.0000
                                                                               Median : 0.000000
                                                                                                            :14463
                                                                                                                            :10415
Mean : 0.9276
                       Mean : 2.5
                                            Mean : 1.856
                                                             Mean : 0.1039
                                                                               Mean : 0.007949
                                                                                                   SC
                                                                                                            :10650
                                                                                                                    ESP
                                                                                                                            : 8568
                       3rd Ou.: 3.0
                                            3rd Qu.: 2.000
3rd Qu.: 2.0000
                                                             3rd ou.: 0.0000
                                                                               3rd ou.: 0.000000
                                                                                                   Undefined: 1169
                                                                                                                    DEU
                                                                                                                           : 7287
Max. :19.0000
                       Max.
                             :50.0
                                            Max.
                                                  :55.000
                                                             Max.
                                                                    :10.0000
                                                                               мах.
                                                                                      :10.000000
                                                                                                                     ITA
                                                                                                                           : 3766
                                                                    : 4
                                                             NA's
                                                                                                                     (Other):28635
                     distribution_channel is_repeated_quest previous_cancellations previous_bookings_not_canceled reserved_room_type
      market segment
Online TA
             :56477
                                          Min. :0.00000
                                                            Min. : 0.00000
                                                                                   Min. : 0.0000
                     Corporate: 6677
                                                                                                                         :85994
offline TA/TO:24219
                     Direct :14645
                                          1st Qu.:0.00000
                                                            1st Qu.: 0.00000
                                                                                   1st Qu.: 0.0000
                                                                                                                         :19201
                                          Median :0.00000
             :19811
                     GDS
                              : 193
                                                            Median : 0.00000
                                                                                   Median : 0.0000
                                                                                                                         : 6535
Groups
             :12606
                     TA/T0
                              :97870
                                                 :0.03191
                                                            Mean : 0.08712
                                                                                   Mean : 0.1371
                                                                                                                         : 2897
Direct
                                          Mean
                     Undefined:
            : 5295
                                          3rd Qu.:0.00000
                                                            3rd Qu.: 0.00000
                                                                                   3rd Qu.: 0.0000
                                                                                                                         : 2094
Corporate
Complementary: 743
                                                 :1.00000
                                                                                         :72.0000
                                                                                                                         : 1118
                                          мах.
                                                            Max.
                                                                   :26.00000
                                                                                   мах.
            : 239
(Other)
                                                                                                                  (other): 1551
assigned_room_type booking_changes
                                        deposit_type
                                                            agent
                                                                           company
                                                                                         days_in_waiting_list
                                                                                                                      customer_type
       :74053
                  Min. : 0.0000
                                    No Deposit:104641
                                                        9
                                                               :31961
                                                                        NULL
                                                                              :112593
                                                                                         Min. : 0.000
                                                                                                                             : 4076
                                                                                                              Contract
       :25322
                  1st Qu.: 0.0000
                                    Non Refund: 14587
                                                        NULL
                                                               :16340
                                                                        40
                                                                                   927
                                                                                         1st Qu.: 0.000
                                                                                                              Group
                                                                                                                             : 577
      : 7806
                  Median : 0.0000
                                    Refundable:
                                                        240
                                                               :13922
                                                                        223
                                                                                   784
                                                                                         Median : 0.000
                                                                                                              Transient
                                                162
                                                                                                                             :89613
                                                               : 7191
       : 3751
                  Mean : 0.2211
                                                                        67
                                                                                   267
                                                                                         Mean : 2.321
                                                                                                              Transient-Party:25124
       : 2553
                  3rd Qu.: 0.0000
                                                        14
                                                               : 3640
                                                                        45
                                                                                   250
                                                                                         3rd Qu.: 0.000
       : 2375
                                                               : 3539
                                                                        153
                                                                                   215
                                                                                         мах.
                                                                                              :391.000
                  Max. :21.0000
(Other): 3530
                                                        (Other):42797
                                                                        (Other): 4354
                 required_car_parking_spaces total_of_special_requests reservation_status reservation_status_date
     adr
Min. : -6.38
                 Min. :0.00000
                                             Min. :0.0000
                                                                       canceled:43017
                                                                                          2015-10-21: 1461
1st Qu.: 69.29
                 1st Qu.:0.00000
                                             1st Qu.:0.0000
                                                                       check-out:75166
                                                                                          2015-07-06:
                                                                                                       805
                                             Median :0.0000
Median : 94.58
                 Median :0.00000
                                                                       No-Show : 1207
                                                                                          2016-11-25:
                                                                                                       790
Mean : 101.83
                       :0.06252
                                                   :0.5714
                                                                                          2015-01-01:
                                                                                                       763
                 Mean
                                             Mean
3rd Qu.: 126.00
                 3rd Qu.:0.00000
                                             3rd Qu.:1.0000
                                                                                          2016-01-18:
                                                                                                        625
                        :8.00000
                                                    :5.0000
                                                                                                        469
      :5400.00
                                                                                          2015-07-02:
Max.
                 Max.
                                             Max.
                                                                                          (Other) :114477
```

## Column Boxplots

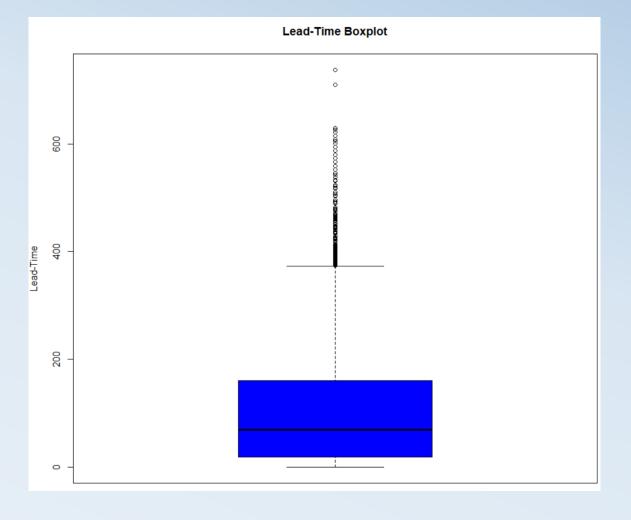


- The graph on the left contains the boxplot of the columns with the exception of some attributes that contains non-finite values like arrival\_date\_month and deposit\_type.
- Most of the columns have outliers with the exception of "is\_canceled", "arrival\_date\_year", "arrival\_date\_week\_number", and "arrival\_date\_day\_of\_month".
- For this analysis, we will mainly focus on "lead\_time", "stays\_in\_weekend\_nights", and "total\_of\_special\_requests" as these are included on most of the project.

# Outlier Detection and Visualization:

- Before any analysis was done, the whole dataset was checked for any NULL values. After confirming there are no NULL values, attributes were then checked for outliers that could influence results.
- First is the "Lead\_Time" attribute. This is the number of days that elapsed between the entering date of the booking into the PMS and the arrival date. Looking at the summary, the maximum value it contains was 737 days.
- There are 3005 outliers in this column. This makes up about 2.5% of the total number of values.

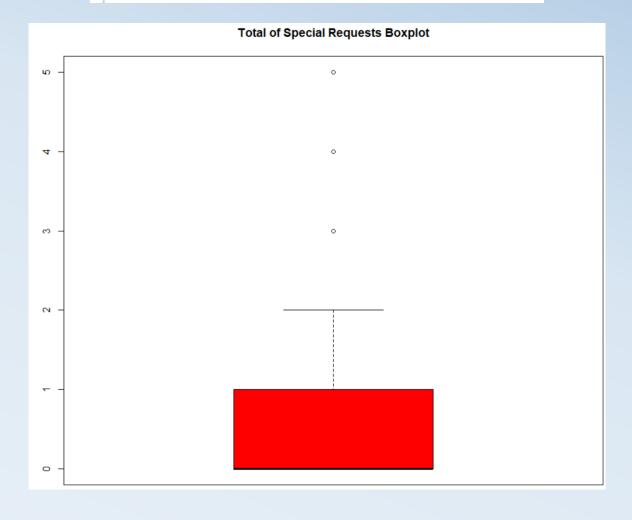




## **Outlier Detection**

- The "total\_of\_special\_requests" column have a total of 2887 outlier values.
- This is the number of special requests made by the customer (e.g. twin bed or high floor).
- This makes up about 2.4% of the total number of values.

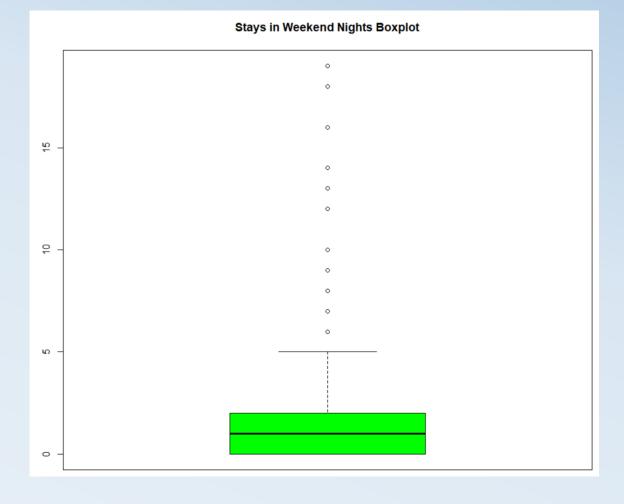
Min. 1st Qu. Median Mean 3rd Qu. Max. 0.0000 0.0000 0.0000 0.5714 1.0000 5.0000



## **Outlier Detection**

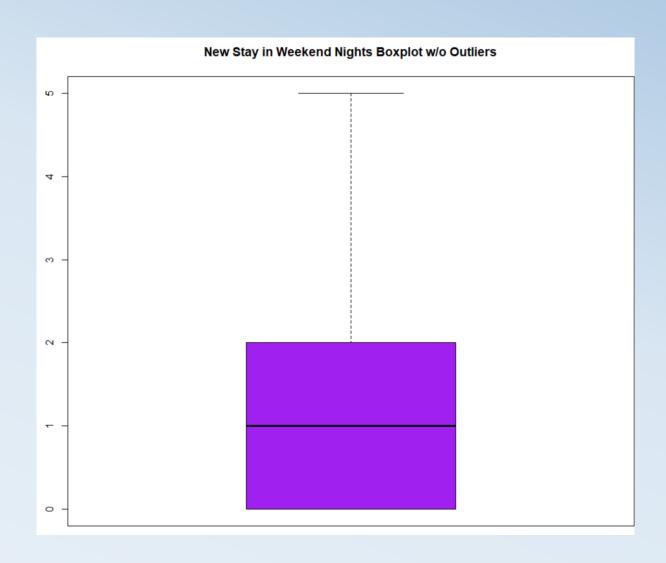
- The "stays\_in\_weekend\_nights" attribute has a total of 265 number of outliers.
- This is the number of weekend nights (Saturday or Sunday) the guest stayed or booked to stay at the hotel.
- This is about 0.2% of its total number.
- As this is the only one with low number of outliers, we can therefore drop the rows corresponding to the outliers.

Min. 1st Qu. Median Mean 3rd Qu. Max. 0.0000 0.0000 1.0000 0.9276 2.0000 19.0000

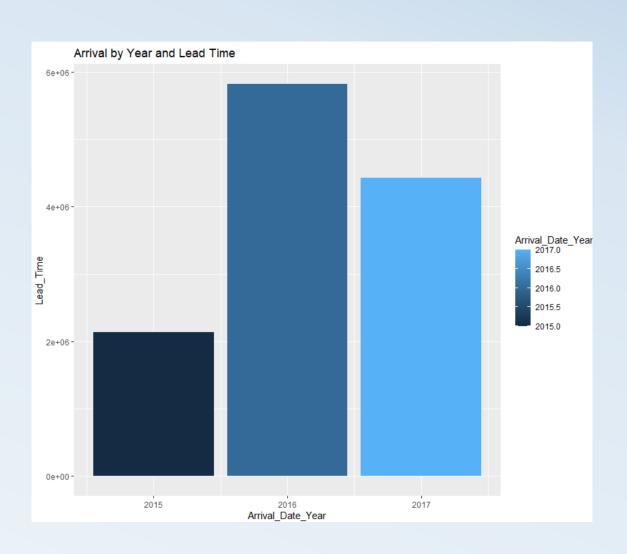


#### **New Dataset**

- After deleting the rows corresponding to the outliers of the "stays\_in\_weekend\_nights" column, the new dataset has 119125 entries and still 32 attributes.
- The boxplot on the right is the new boxplot of the column without the outliers.



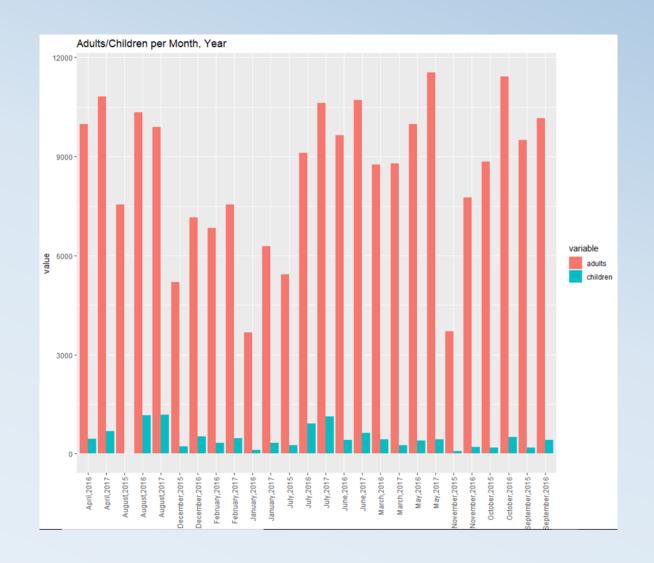
# How much in advance are the customers booking before their arrival?



- Looking at the graph, 2015 had the lowest number of days that elapsed between the entering date in the PMS and the arrival date.
- However, there is a big gap between 2015 and 2016. In 2016, guests were booking their reservations more than twice in advance than in 2015.
- Guests are still booking in advance in 2017, though not as early as in 2016, but still more than 2015.

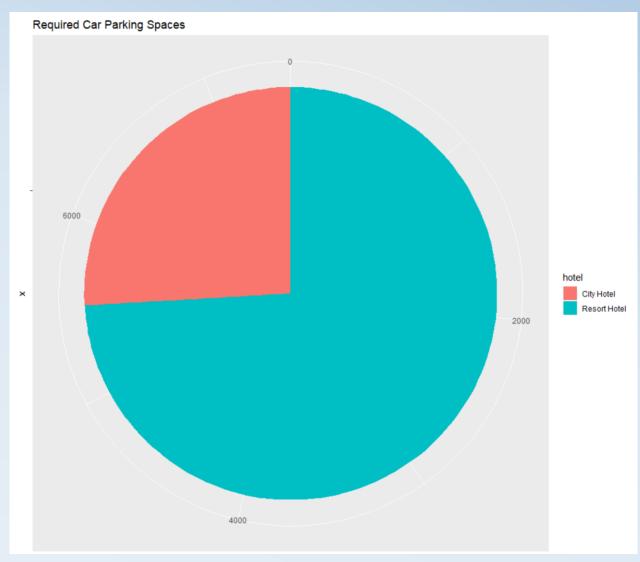
# What month is more popular for bookings?

- Looking at the graph, it is obvious that adults are expected to make up most of the guest type any hotel will have.
- May 2017 had the most amount of adult guests from 2015- 2017.
- August 2015 had no children guests present.
- Regardless of the year, there seem to be an increase of the number of guests starting from the month of March. The number of guests start to decrease more at the month of October.

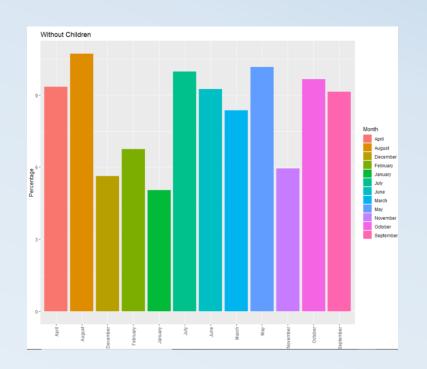


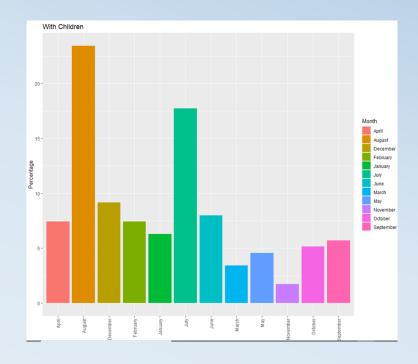
# Which hotel requires more parking space?

The graph shows that Resort Hotels require more parking space to accommodate for their guests. City Hotels have only a sum of greater than 2000 parking spaces required by their customers. While Resort Hotels have in total required greater than 5000 parking spaces.



# Contrast the arrival timings of adults with children or babies with the that of adults without children or babies:

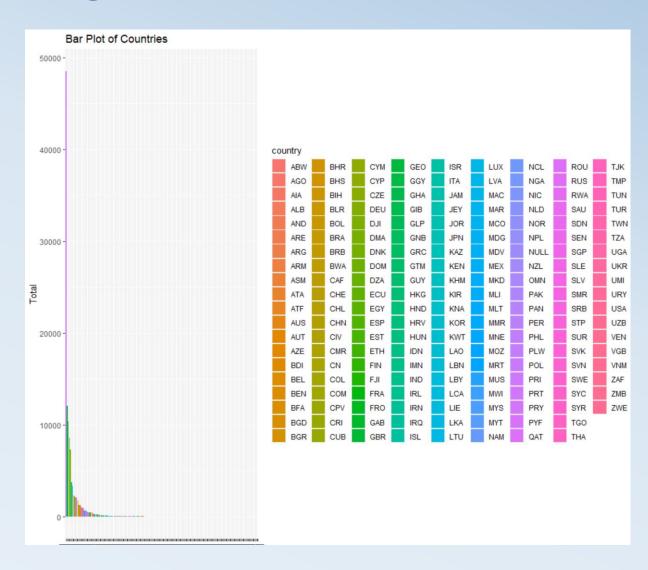




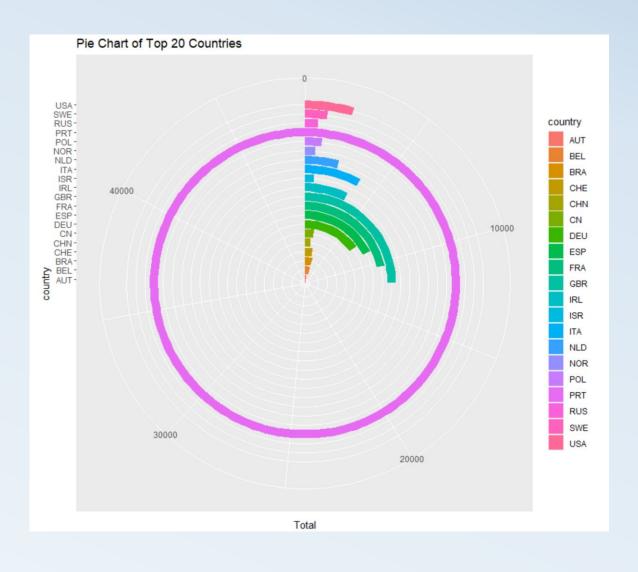
Comparing the two graphs, it is obvious that adults without any children were more likely to make a hotel reservation for any month. Both graphs showed a similarity wherein both have August as the highest number of arrival timings. This make sense as it is during summer when there is no school.

# The number of guests arriving from different countries

- This is a bar plot of the countries where the guests arrived from based on the number of reservations. PRT, or Portugal, comprised of the highest number of guests with more than 40,000 hotel reservations made.
- Since this bar plot is hard to look at, a pie chart of the top 20 countries were made.



## Top 20 Countries



- Again, Portugal made up most of the reservations made.
- Next is GBR, or the United Kingdom, with more than 10,000 reservations.
- In order of top 10:
  - Portugal
  - United Kingdom
  - France
  - Spain
  - Germany
  - Italy
  - Ireland
  - Belgium
  - Brazil
  - Netherlands

# The mean of lead\_time bookings that have been canceled

