

# **Capstone Project – 1 Hotel Booking Analysis**

**Team Members** 

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## Introduction

Businesses around the world are waking up to the importance of data analytics. Getting the right insights gives you an advantage in a competitive business environment.

#### Why....?

- Introduce better hotel pricing strategies
- Managing Hotel Booking Channels
- Demand Forecasting
- Enhancing productivity
- Marketing strategy



## **Data Summary**

hotel: There are only two types of hotels Resort hotel and City hotel

market\_segment: We have eight unique market segments from where customers are coming
i.e. 'Direct', 'Corporate', 'Online TA', 'Offline TA/TO', 'Complementary', 'Groups', 'Undefined',
'Aviation'

**meal:** These are the four types of meal in the given data:

- SC: self-catering (no meals are included).
- BB: bed and breakfast.
- HB: half board.
- FB: full board.

**country:** We have data of 177 countries coded in short form.

**Lead\_time:** At a hotel, the time taken between when a customer makes a reservation and their actual arrival is called the Lead Time.



## Data Summary (continued)

is canceled: It contains only two values 1 and 0.

- 1: booking has cancelled
- 0: booking is currently active

**Stays\_in\_weekend\_nights:** We are getting two unique values for column 'stays\_in\_weekend\_nights' i.e. 1 and 2, that means someone booked for one weekend night(saturday or sunday) and some booked for two weekend nights(saturday and sunday).

**Stays\_in\_week\_nights:** We are getting five unique values for column 'stays\_in\_weekend\_nights' i.e. 1 to 5, that means someone booked for at least one week night to maximum five week nights.

Adr: Average daily rate for individual order.

**required\_car\_parking\_spaces:** this column contains number of car parking spaces required as per customer demand.

## **NaN value Handling**

- Total no. of rows / data = 119390
- Here we can observe that four columns have some null values:
  - Children 119390 119386 = 4 null values.
  - Country: 119390 118902 = 488 null values.
  - Agent: 119390 103050 = 16340 null values.
  - o Company: 119390 6797 = 112593 null values.
- Here we can observe that in 'company' column 94.3% values are null.

```
sum([True for idx,row in hotel_df.iterrows() if any(row.isnull())])
16496
```

Total rows which has null values = 16496

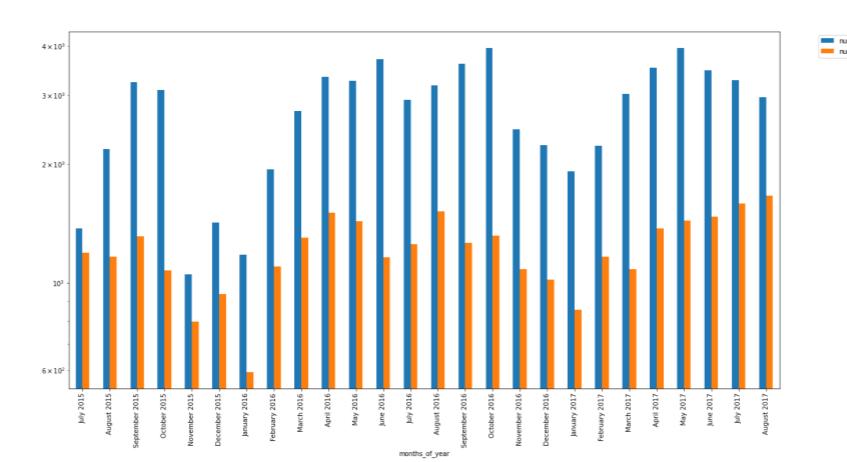
Total percentage of rows which has null values = 13.6 %



hotel				
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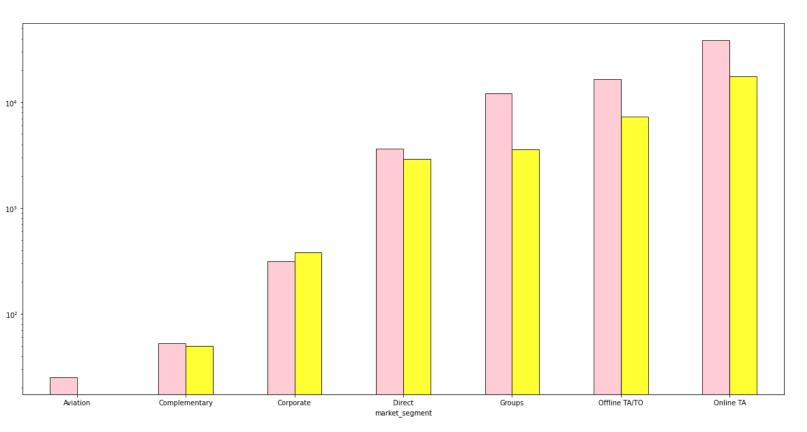


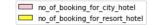
#### **Total number of bookings**



#### **Bookings from different market segments**

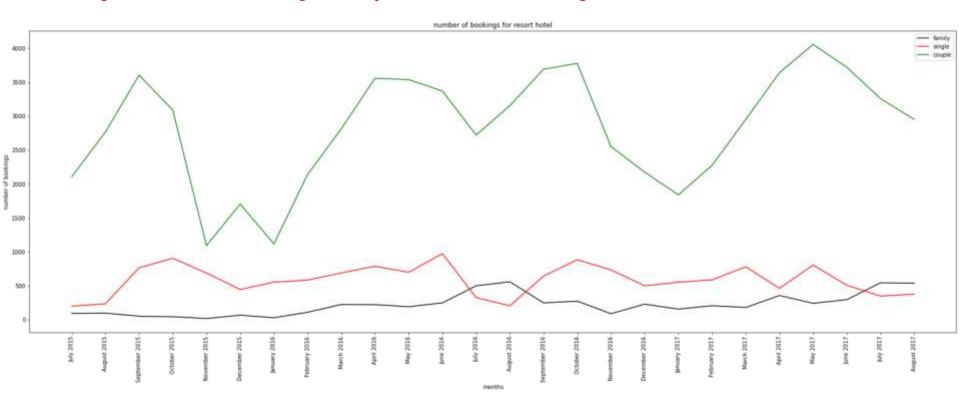






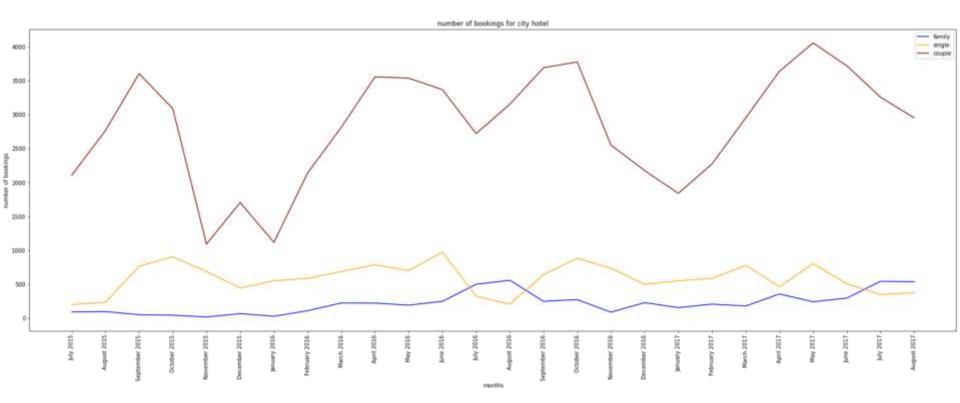


#### Average number of booking of couples, families and single for resort hotel



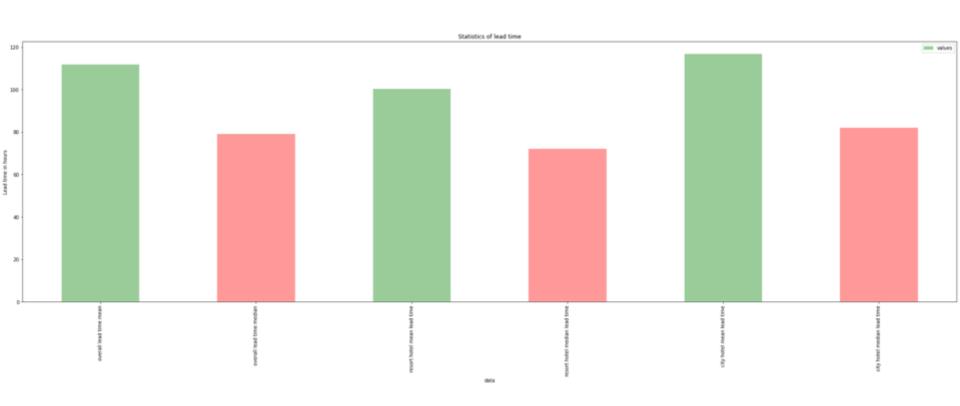


#### Average number of booking of couples, families and single for city hotel



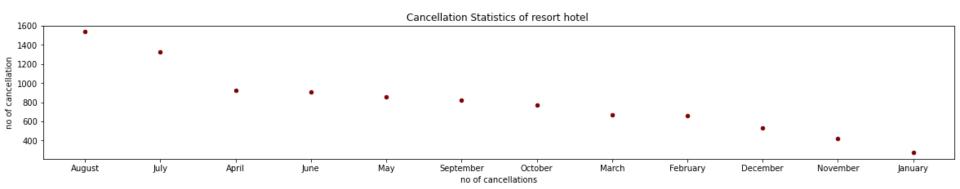


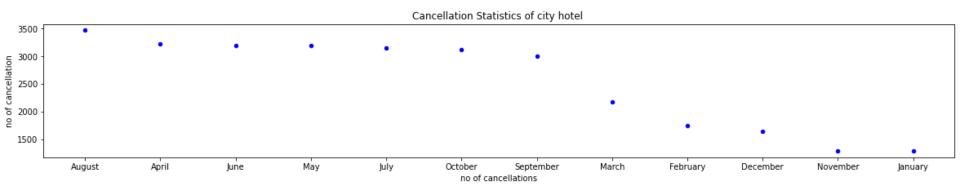
#### **Statistics of lead time**





#### **Cancellation statistics**

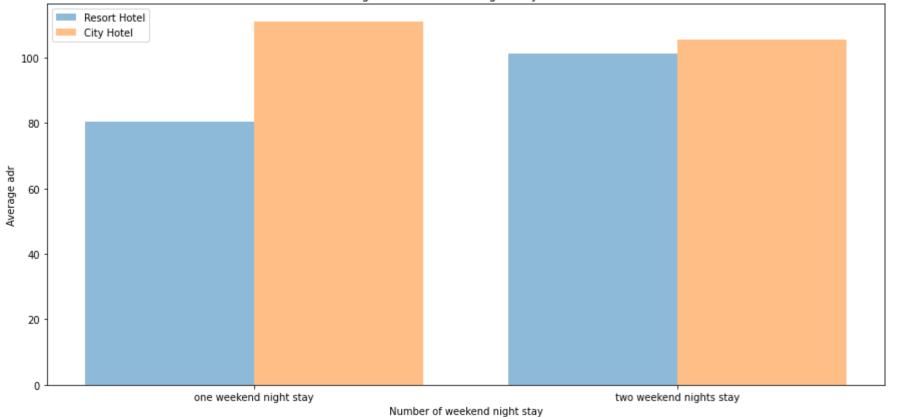






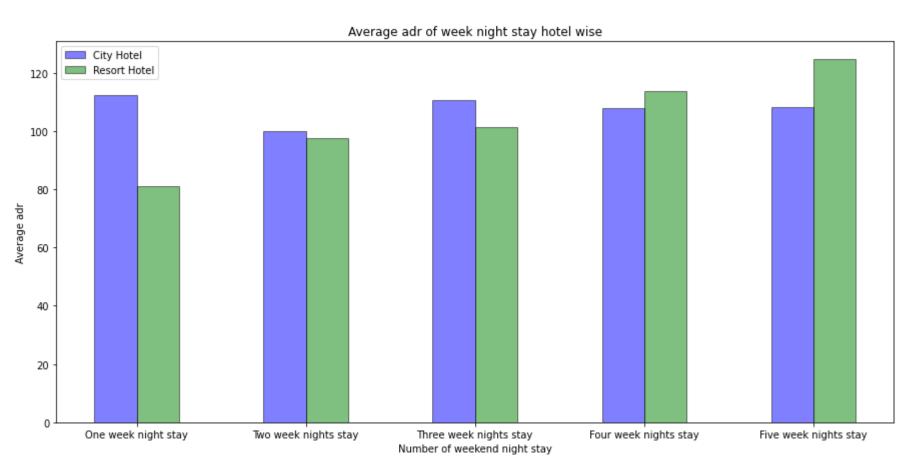
#### Adr for weekend nights





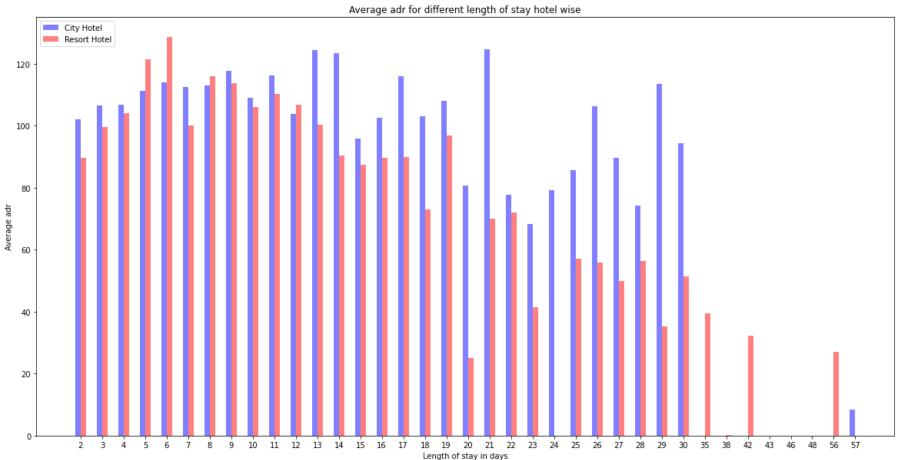






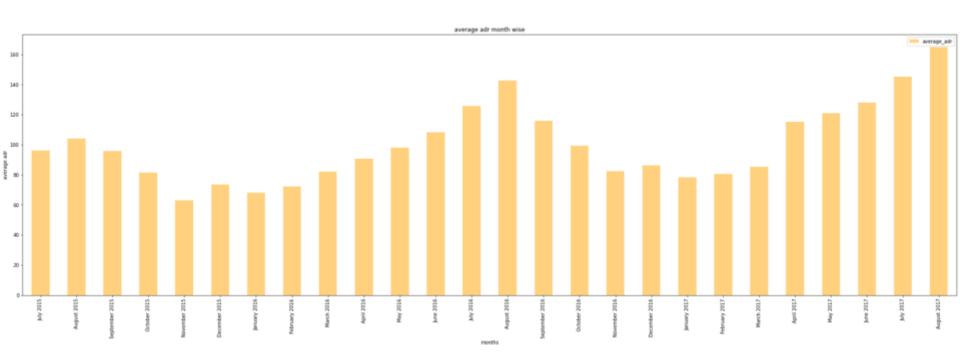
#### Adr vs. length of stay





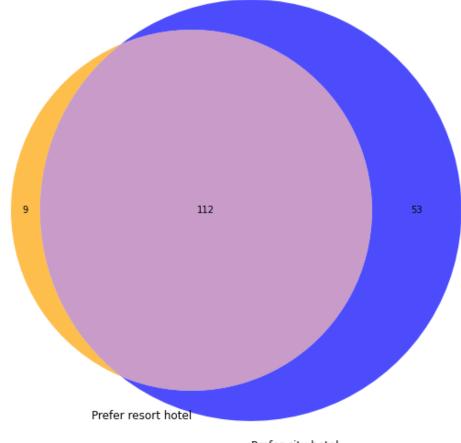


#### Variation of adr with time



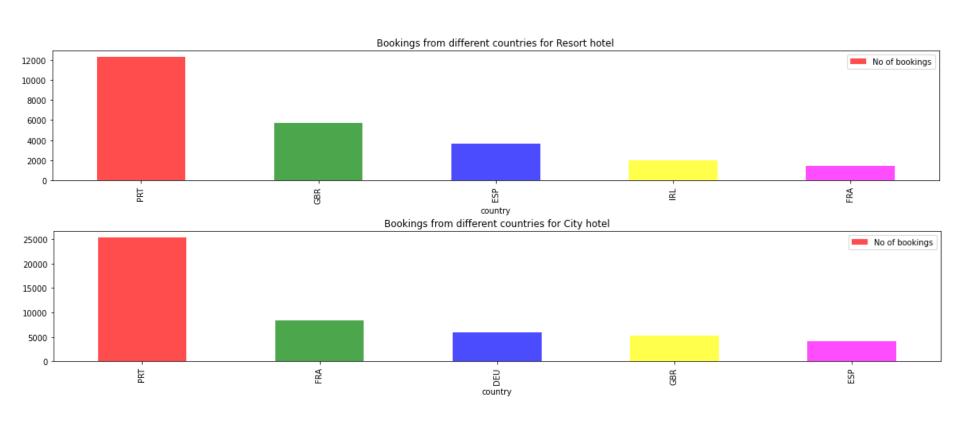


#### Choice of hotel from people of different countries



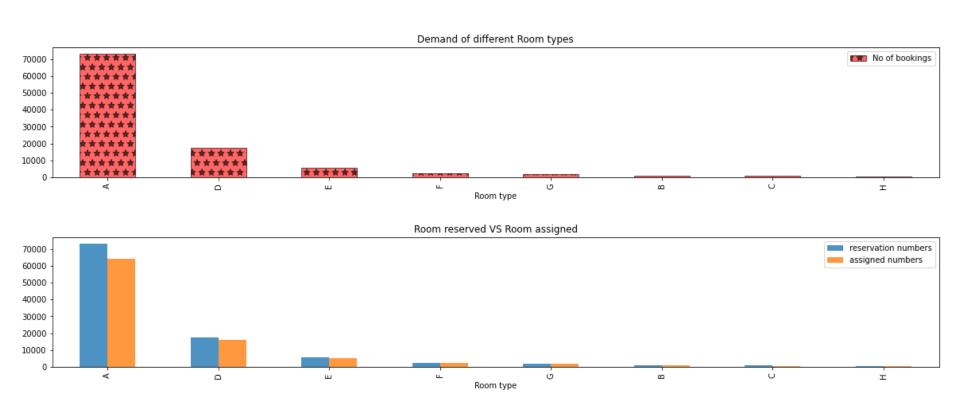


#### **Bookings from different countries**



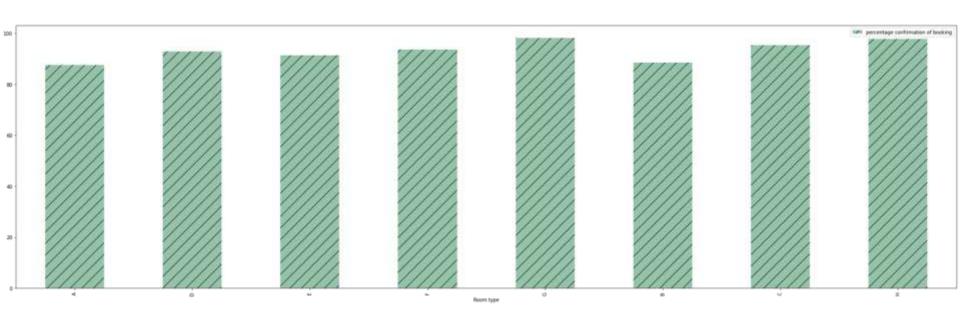


#### **Demand of different Room type**

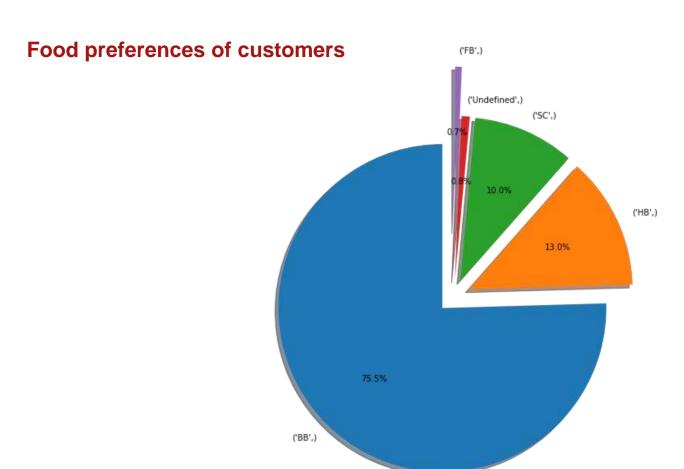




#### Percentage of confirmed booking for various room types

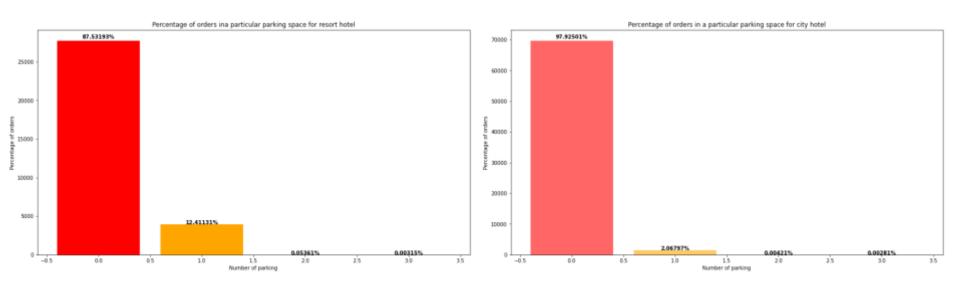








#### Parking space demand analysis





# Challenges

- Data Cleaning
- More Data or Better Data
- Understanding the business problem
- Team coordination
- Lack of clarity in data



## Conclusion

- Comparing the magnitude of booking we see that city hotel has always scored higher booking counts.
- Number of booking start increasing from spring to summer season and then decrease till winter season.
- TA(travel agents) are the major contributors of booking
- The most number of cancelled booking is in the month of August.
- Adr starts decreasing from month of september and it gets its minimum value in between november and january, after that adr starts increasing and it gets its peak in august.
- BB is most preferred and FB is the least preferred meal.
- Demand of type A room is highest followed by type D room.



