

## PRICE MODELING FOR BIG MOUNTAIN RESORT'S TICKET PRICE



## PROBLEM STATEMENT

- Big Mountain has installed a new chairlift
- Operational cost of the new chairlift= \$1.54M
- Find a pricing model to find the best value for Big Mountain Resort's ticket price
- Increase the revenue by at least \$1.54M to compensate for the additional operating cost
- Timeframe: less than one year



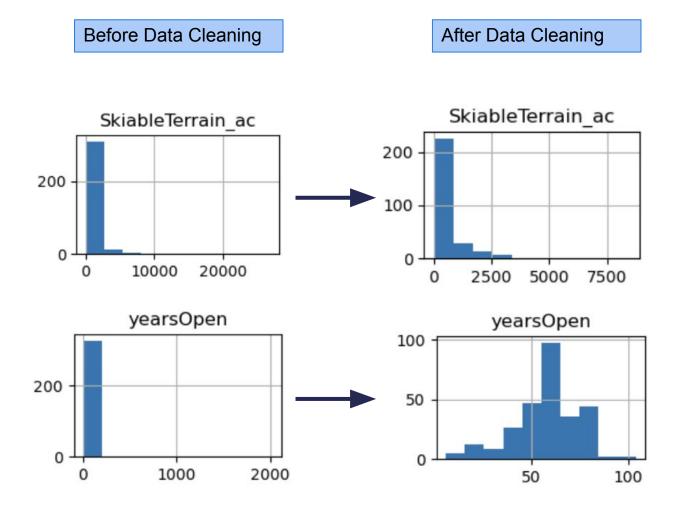
#### PRICING RECOMMENDATION

- Add a run, increase the vertical drop by 150 ft, and install an additional chair lift.
- Increase price per ticket by \$1.99.
- Potentially an additional of about \$3.5M in revenue.
- Estimated operational cost of the newly installed chairlift ~ \$1.5M
- Adding another chairlift will double the operating cost ~ \$3M
- There will be about \$0.5M increase in revenue at the end.



## **DATA WRANGLING**

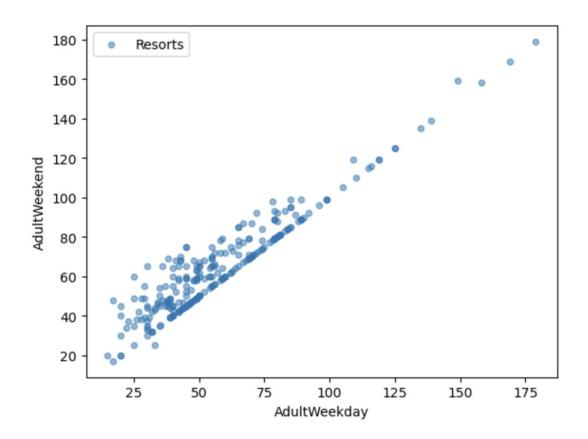
- Two types of ticket price were found:
  - adult weekday price
  - adult weekend price
- Resorts' missing values:
  - 82% no missing price information
  - o 3% missing one value
  - 14% missing both price values
    - ☐ dropped from the dataframe
- Example of suspicious values:
  - SkiableTerrain- ac
    - One resort had a very large value which was replaced with the correct number obtained and verified through online search
  - YearsOpen
    - ☐ A resort reported that it has been open for 2019 years. It was dropped from the dataframe



## **DATA WRANGLING**

#### Key Takeaways:

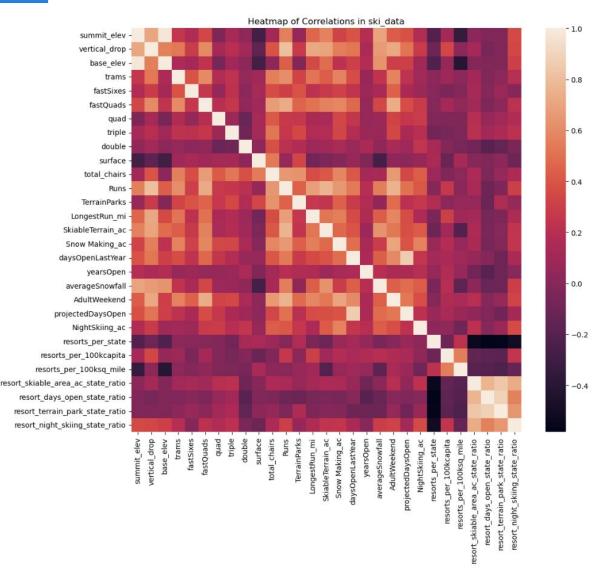
- Once the weekday price approached \$100 from below, weekend and weekday prices were typically the same.
- The current weekday and weekend prices for Big Mountain resort were seen to be equal, at \$81.
- The equality between weekend and weekday prices was seen for all resorts in Montana.
- There were a few more weekend prices than weekday prices in the dataset:
  - ☐ weekday prices were dropped
  - weekend prices were chosen as the target ticket price





## **EXPLORATORY DATA ANALYSIS**

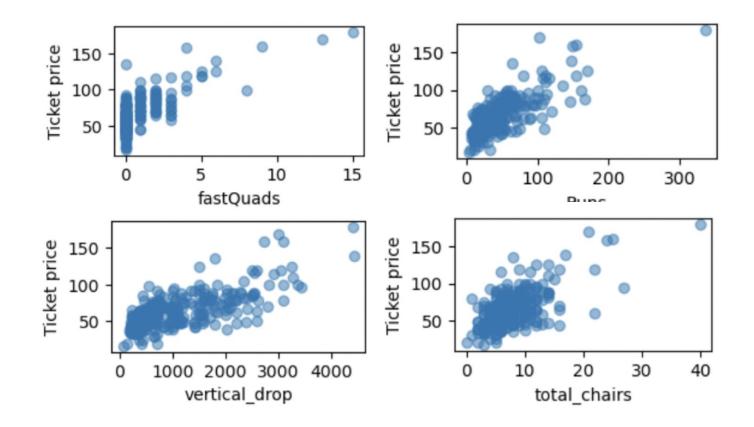
- Principal Component Analysis (PCA)
  - No clear pattern suggestive of a relationship between state and ticket price
  - Outlier states:
    - ☐ Vermont, New Hampshire, New York, and California
- Seaborn correlation heatmap
  - Most important features:
    - ☐ FastQuads
    - Runs
    - ☐ Vertical Drop
    - ☐ Total Chairs
  - Secondary important features:
    - ☐ Longest Run
    - ☐ Skiable Acres
    - ☐ Snowmaking Acres



## **EXPLORATORY DATA ANALYSIS**

#### Features used in modeling

- FastQuads
  - captures both snow making acres and night skiing
- o Runs
  - ☐ Similar to Skiable Acres
- Vertical Drop
  - ☐ Captures longest run
- Total Chairs





#### **MODEL PREPROCESSING**

#### Imputing

o Imputing the missing values using either the mean or the median did not seem to significantly change the results.

#### Algorithms

- Linear Model
- Random Forest Model

#### Measure of Errors:

- R-squared
- Mean Absolute Error (MAE)

Dataset (excluding Big Mountain Data)





Training Set

**Testing Set** 

## **MODEL PREPROCESSING**

#### **Linear Regression Model**

- Dominant top four features:
  - vertical\_drop, Snow Making\_ac, total chairs, fastQuads
- MAE on the test set ~ 11.79
- std on the test set ~ 1.62
- MAE for CV ~ 10.50

#### **Random Forest Model**

- Dominant top four features:
  - fastQuads, Runs, Snow Making\_ac, vertical\_drop.
- MAE on the test set ~ 9.53
- std on the test set ~ 1.35
- MAE for CV ~ 9.64

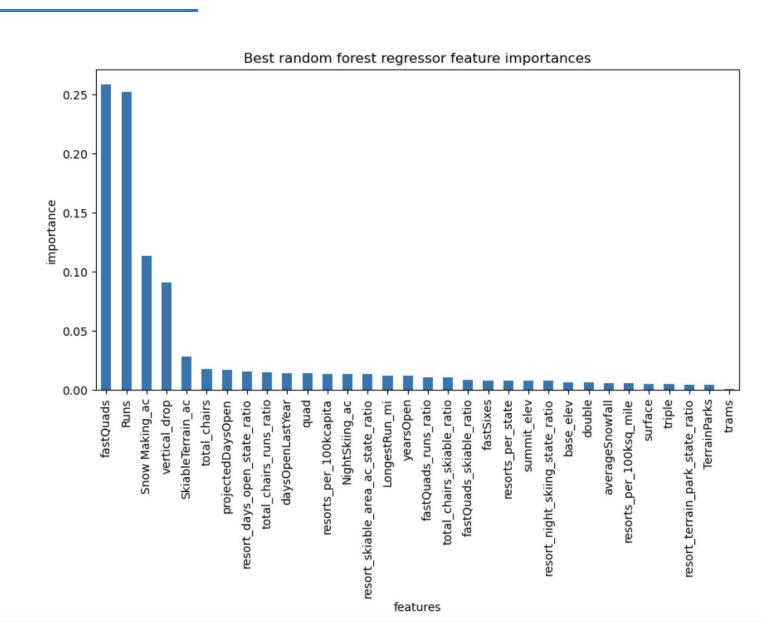
## RECOMMENDED MODEL

#### Random Forrest Model

- mean absolute errors had a lower standard deviation.
- MAE on the test set was within less than one standard deviation from the mean of the cross validation MAEs
- consistently producing a noticeably lower mean absolute error than the linear regression model.

#### Dominant top four features:

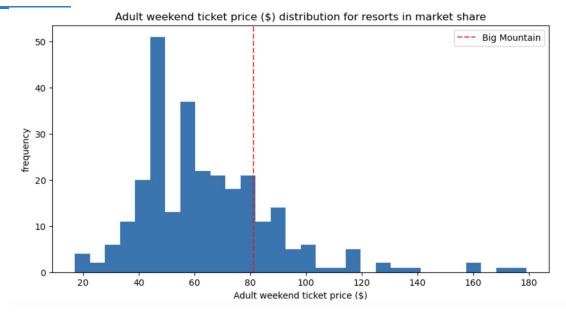
- o fastQuads
- o Runs
- Snow Making\_ac
- vertical\_drop.

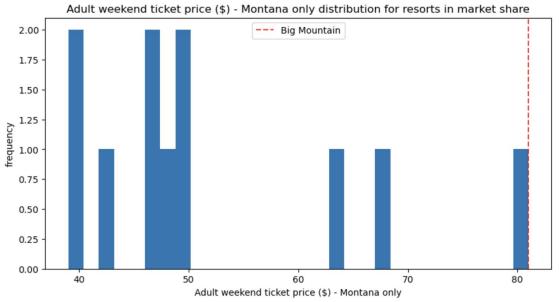


## **RESULTS OF MODELING**

#### Big Mountain

- Modeled Price= \$95.87
- Actual Price= \$81.00
- Overall Big Mountain is charging more than many of the other resorts but there are quite a few resorts with higher ticket prices.
- Among the other resorts in Montana, Big Mountain is charging at the upper end of the ticket prices with \$81 per ticket.
- Modeling Assumptions:
  - 350,000 visitors per season
  - 5 tickets per visitor



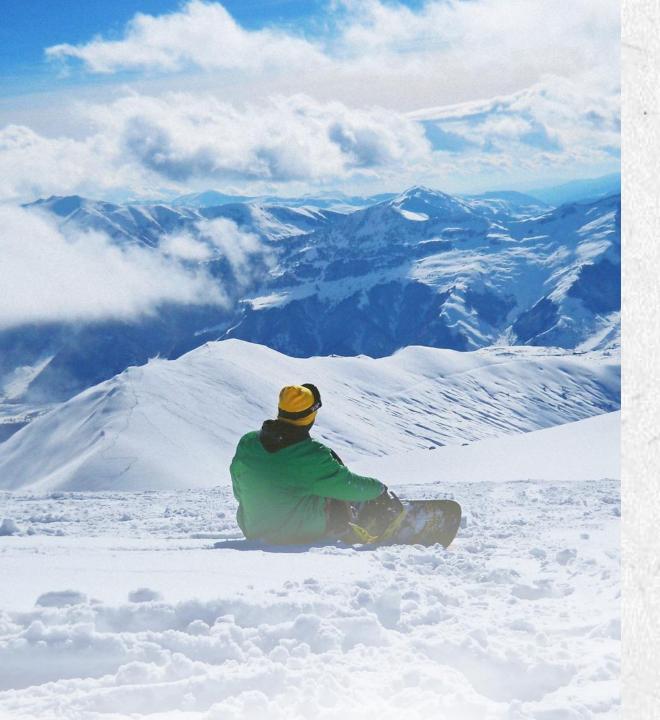


## **MODELING SCENARIOS**

- 1. Permanently close up to 10 of the least used runs.
  - closing one run makes no difference.
  - closing 2 and 3 runs reduces support for ticket price and revenue.
  - from 3 runs to 5 runs there is no further loss in ticket price or revenue.
  - closing more than 5 runs will drastically reduce the ticket price and revenue.
- 2. Adding a run, increasing the vertical drop by 150 ft, and installing an additional chair lift.
  - increases support for ticket price by \$1.99.
  - up to approximately \$3.5 M increase in revenue.
- 3. Adding a run, increasing the vertical drop by 150 ft, installing an additional chair lift, and adding 2 acres of snow making
  - not a significant difference compared to Scenario 2
  - increase support for ticket price by \$1.99.
- 4. Increases the longest run by 0.2 miles and guaranteeing its snow coverage by adding 4 acres of snow making capabilities
  - no increase in the support for ticket price as all.

## PRICING RECOMMENDATION

- Take a closer look at Scenario 2
- Add a run, increase the vertical drop by 150 ft, and install an additional chair lift.
- Increase price per ticket by \$1.99.
- Potentially an additional of about \$3.5M in revenue.
- Estimated operational cost of the newly installed chairlift ~ \$1.5M
- Adding another chairlift will double the operating cost ~ \$3M
- There will be about \$0.5M increase in revenue at the end.



# THANK YOU