R Notebook

Here we're try to find our is there a diffence in arr_delay among the different airports

Null Hypothesis (H0): There is no significant difference in the mean "arr_delay" among the different airports.

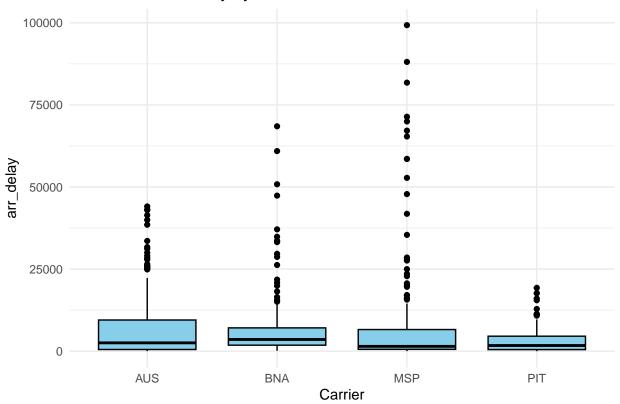
Alternative Hypothesis (H1): There is a significant difference in the mean "arr_delay" among at least some of the airports.

Explanation: H0: mu_1 = mu_2 = mu_3 = ... = mu_k (where mu represents the mean "arr_delay" for each airport) H1: At least one pair of means mu_i and mu_j is different. Here, mu_1, mu_2, ..., mu_k represent the mean "arr_delay" for each airport category. If the p-value is less than the significance level (commonly used in our Stat501 class: 0.05), we reject the null hypothesis and conclude that there is evidence to suggest that at least some of the means are different.

Loading the data set only for 4 Top Airports: AUS, MSP, BNA, PIT

```
library(readr)
raw_top4_airport <- read_csv("~/Documents/Stat501/project/raw_top4_airport.csv")</pre>
## New names:
## Rows: 745 Columns: 22
## -- Column specification
## ------ Delimiter: "," chr
## (4): carrier, carrier_name, airport, airport_name dbl (18): ...1, year, month,
## arr_flights, arr_del15, carrier_ct, weather_ct,...
## i Use `spec()` to retrieve the full column specification for this data. i
## Specify the column types or set `show_col_types = FALSE` to quiet this message.
## * `` -> `...1`
library(ggplot2)
# Create a box plot
ggplot(raw_top4_airport, aes(x = airport, y = arr_delay)) +
 geom_boxplot(fill = "skyblue", color = "black") +
 labs(title = "Box Plot of arr_delay by Carrier",
      x = "Carrier",
      y = "arr_delay") +
 theme minimal()
```

Box Plot of arr_delay by Carrier



Through this box plot, we can see that we have some outliers. So, the we're making ANOVA analysis with and without Outlier.

a) With Outliers, the Anova results are:

```
library(tidyverse)
```

```
## -- Attaching core tidyverse packages ----- tidyverse 2.0.0 --
               1.1.3
                         v stringr
## v dplyr
                                     1.5.0
## v forcats
               1.0.0
                         v tibble
                                     3.2.1
## v lubridate 1.9.3
                         v tidyr
                                     1.3.0
## v purrr
               1.0.2
                               ----- tidyverse_conflicts() --
## -- Conflicts -----
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                    masks stats::lag()
## i Use the conflicted package (<a href="http://conflicted.r-lib.org/">http://conflicted.r-lib.org/</a>) to force all conflicts to become error
anova_result_w_outliers <- aov(arr_delay ~ airport, data = raw_top4_airport)</pre>
print(summary(anova_result_w_outliers))
##
                      Sum Sq Mean Sq F value
                                                 Pr(>F)
## airport
                 3 2.789e+09 929607159
                                        7.144 9.84e-05 ***
## Residuals
               741 9.642e+10 130126503
```

Interpretation:

Df (Degrees of Freedom): There are three degrees of freedom for the factor "airport" and 741 degrees of

Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1

freedom for residuals. Sum Sq (Sum of Squares): This represents the sum of squared differences between the observed values and the mean. For "airport," it is 2.789e+09, and for residuals, it is 9.642e+10. Mean Sq (Mean Square): Mean Squares are calculated by dividing the Sum of Squares by the corresponding degrees of freedom. F value: The F statistic is a ratio of the variance between groups to the variance within groups. Here, it is 7.144. Pr(>F): This is the p-value associated with the F statistic. It is extremely small (9.84e-05), indicating that there is a significant difference in mean "arr—delay" among at least two airports.

Since we are rejecting the Null Hypothesis, we want to investigae fruther. The method used for investigating the pairs is Tukey's post-hoc test:

```
# Perform Tukey's post-hoc test
tukey result w outliers <- TukeyHSD(anova result w outliers)
# Display Tukey's post-hoc results
print(tukey_result_w_outliers)
##
     Tukey multiple comparisons of means
##
       95% family-wise confidence level
##
## Fit: aov(formula = arr_delay ~ airport, data = raw_top4_airport)
##
## $airport
##
                 diff
                            lwr
                                        upr
                                                p adj
            -338.3429 -3380.036
                                 2703.3500 0.9918084
## BNA-AUS
## MSP-AUS
             989.2646 -2052.428
                                 4030.9575 0.8366112
## PIT-AUS -4109.3429 -7151.036 -1067.6500 0.0029908
## MSP-BNA
            1327.6075 -1718.160
                                 4373.3750 0.6758373
## PIT-BNA -3771.0000 -6816.767
                                 -725.2325 0.0081176
## PIT-MSP -5098.6075 -8144.375 -2052.8401 0.0001087
```

diff (Difference): The estimated difference in means between the pairs of airports for "arr_delay." lwr and upr (Lower and Upper Confidence Intervals): The 95% confidence interval for the difference in means. p adj (Adjusted p-value): The p-value adjusted for multiple comparisons (Tukey's correction). Interpretation: BNA-AUS: The difference in mean "arr_delay" between Nashville (BNA) and Austin (AUS) is not statistically significant (p = 0.9918).

MSP-AUS: The difference in mean "arr_delay" between Minneapolis (MSP) and Austin (AUS) is not statistically significant (p = 0.8366).

PIT-AUS: The difference in mean "arr_delay" between Pittsburgh (PIT) and Austin (AUS) is statistically significant (p = 0.00299). The negative difference suggests that Austin has a higher mean delay than Pittsburgh.

MSP-BNA: The difference in mean "arr_delay" between Minneapolis (MSP) and Nashville (BNA) is not statistically significant (p = 0.6758).

PIT-BNA: The difference in mean "arr_delay" between Pittsburgh (PIT) and Nashville (BNA) is statistically significant (p = 0.00812). The negative difference suggests that Nashville has a higher mean delay than Pittsburgh.

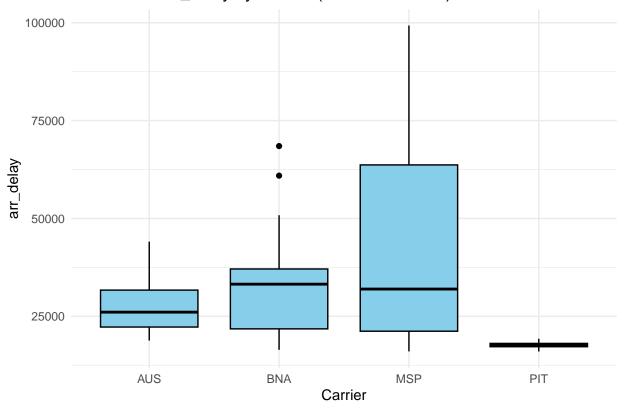
PIT-MSP: The difference in mean "arr_delay" between Pittsburgh (PIT) and Minneapolis (MSP) is statistically significant (p = 0.0001087). The negative difference suggests that Minneapolis has a higher mean delay than Pittsburgh.

In summary, the adjusted p-values indicate whether the differences in mean "arr_delay" are statistically significant after correcting for multiple comparisons.

b) We are eager to know what effect if we remove outliers So, after removing outlier, we performed same analysis again.

```
# Load the required libraries
library(ggplot2)
# Function to remove outliers
remove_outliers <- function(x) {</pre>
  q \leftarrow quantile(x, c(0.25, 0.75))
  iqr \leftarrow q[2] - q[1]
  lower_bound \leftarrow q[1] - 1.5 * iqr
  upper_bound \leftarrow q[2] + 1.5 * iqr
  return(x[x >= lower_bound & x <= upper_bound])</pre>
# Remove outliers from 'arr_delay'
flight_data_no_outliers <- raw_top4_airport %>%
  filter(!arr_delay %in% remove_outliers(raw_top4_airport$arr_delay))
# Create a box plot without outliers
ggplot(flight_data_no_outliers, aes(x = airport, y = arr_delay)) +
  geom_boxplot(fill = "skyblue", color = "black") +
  labs(title = "Box Plot of arr_delay by Carrier (Without Outliers)",
       x = "Carrier",
       y = "arr_delay") +
  theme_minimal()
```

Box Plot of arr_delay by Carrier (Without Outliers)



Load the required libraries
library(tidyverse)

```
# Assuming your data is stored in a dataframe named flight_data_no_outliers
# Perform one-way ANOVA
anova_result_no_outliers <- aov(arr_delay ~ airport, data = flight_data_no_outliers)</pre>
# Display ANOVA results
print(summary(anova_result_no_outliers))
##
               Df
                    Sum Sq
                              Mean Sq F value Pr(>F)
                3 4.03e+09 1.343e+09
                                        4.519 0.00584 **
## airport
## Residuals
               72 2.14e+10 2.972e+08
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
The p-value (0.00584) is less than 0.05, indicating that there is a significant difference in mean "arr_delay"
among at least two airports.
Tukey Multiple Comparisons:
# Perform Tukey's post-hoc test
tukey_result <- TukeyHSD(anova_result_no_outliers)</pre>
# Display Tukey's post-hoc results
print(tukey_result)
##
     Tukey multiple comparisons of means
##
       95% family-wise confidence level
##
## Fit: aov(formula = arr_delay ~ airport, data = flight_data_no_outliers)
##
## $airport
##
                 diff
                              lwr
                                        upr
                                                 p adj
## BNA-AUS
             5540.235 -8310.797 19391.268 0.7195213
```

The p-value for the pair MSP-AUS is 0.0146183 and PIT-MSP, that are less than 0.05. This suggests a significant difference in mean "arr_delay" between Minneapolis (MSP) and Austin (AUS), PIT and MSP respectively .

2158.554 26652.139 0.0146183

8865.111 -5278.157 23008.379 0.3584351

PIT-AUS -11017.500 -35202.977 13167.977 0.6300320

PIT-BNA -16557.735 -41756.652 8641.182 0.3168312 ## PIT-MSP -25422.846 -49776.865 -1068.827 0.0374062

MSP-AUS 14405.346

MSP-BNA