



Airbnbs in the Netherlands

DS-210 Final Project

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Presentation Outline

- ♦ Introduce the Data
 - ♦ Background Information
 - ♦ Research Question
- ♦ Exploratory Data Analysis & Visualizations
- ♦ Models & Statistics
 - ♦ Beginning Model & Statistics
 - ♦ Transformation Time
 - ♦ Final Model & Statistics
 - ♦ Answers to Research Questions
- ♦ Conclusion
 - ♦ Future Research



Introducing the Data

- ♦ Found data set on data.world
- ♦ Created 2 years ago
- ♦ 6,334 Airbnb locations in the Netherlands, majority in Amsterdam
- ♦ Variables included basic information about the locations
 - ♦ Some variables relating to the rating of the Airbnb
- ♦ 33 columns
- ♦ 7,833 observations
- ♦ Each row / observation represents an individual stay at an Airbnb location.

Background Information

- ♦ Airbnb: a place to stay that is rented out by the owner of the house, apartment, etc.
- ♦ Can rent out anything from a single room to the whole house / apartment
- ♦ Each property is unique
- ♦ Website is used to post locations you want to rent or to rent locations

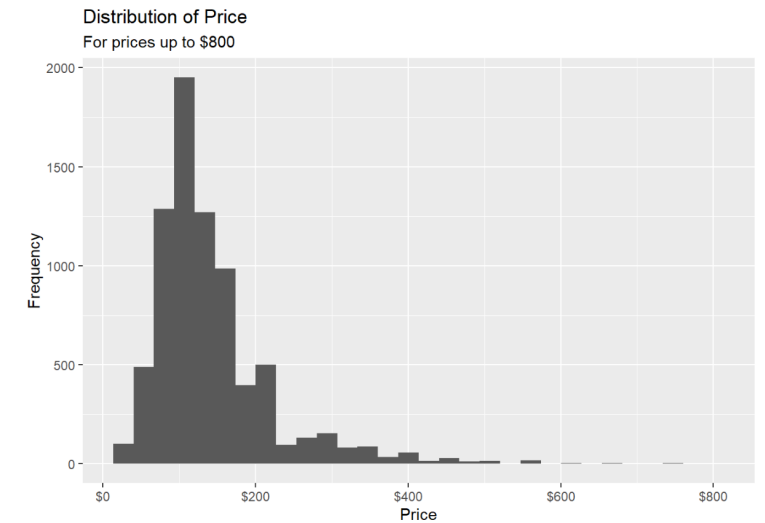
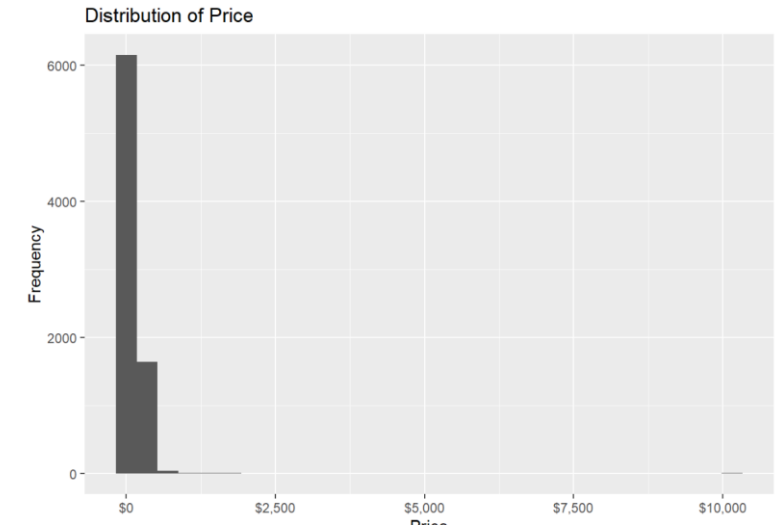


Research Question

- ♦ What factors have an impact on the price of an Airbnb?
- ♦ Is there a combination of factors that have a strong effect on price?
- ♦ The factors in consideration are:
 - ♦ number of bedrooms
 - ♦ number of bathrooms
 - ♦ room type
 - ♦ minimum nights of stay
 - ♦ overall rating
 - ♦ property type
 - ♦ number of people the Airbnb accommodates.

Exploratory Data Analysis & Visualizations

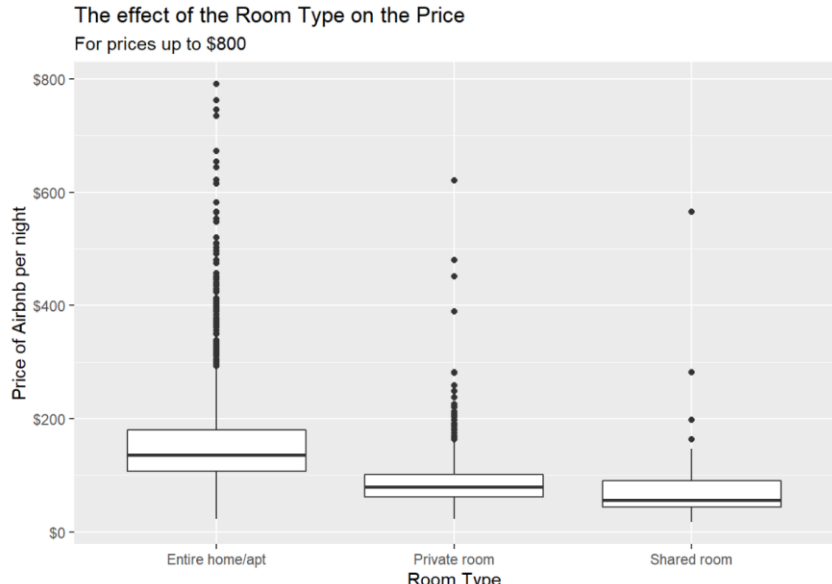
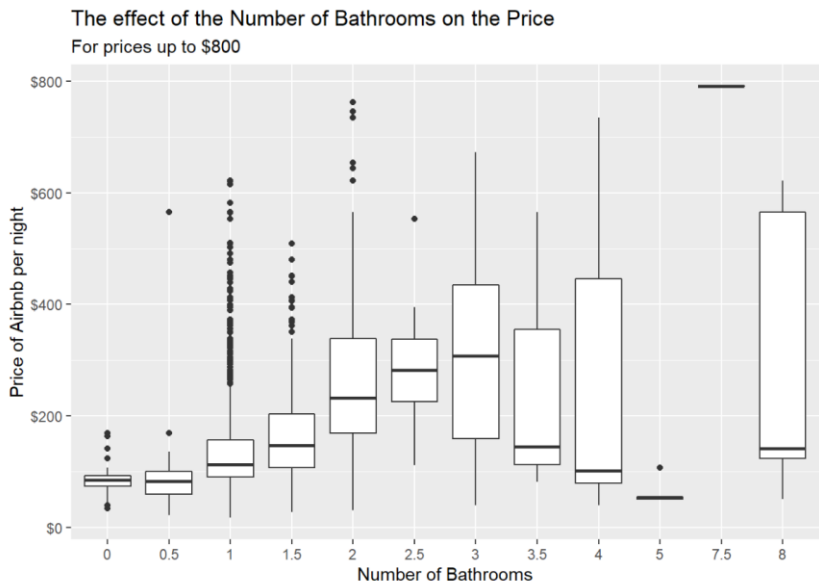
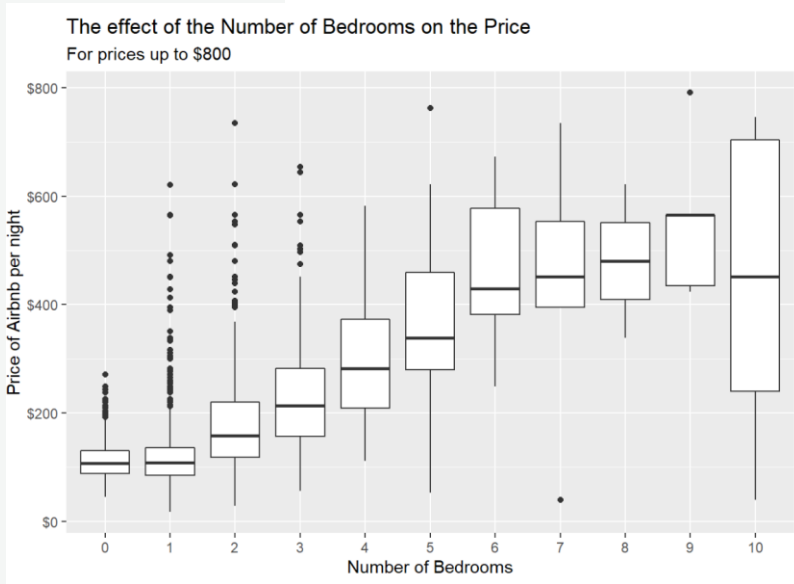
- ♦ Data Wrangling
 - ♦ Converting price (euros) to dollars
 - ♦ Filtering outliers for price variable
 - ♦ Changed variable types for important variables
 - ♦ Filter out “NA” values for some variables



Exploratory Data Analysis & Visualizations

- ♦ EDA
 - ♦ Created boxplots for each individual variable
 - ♦ Produced some linear regression models for some variables
 - ♦ Noted the r-squared values

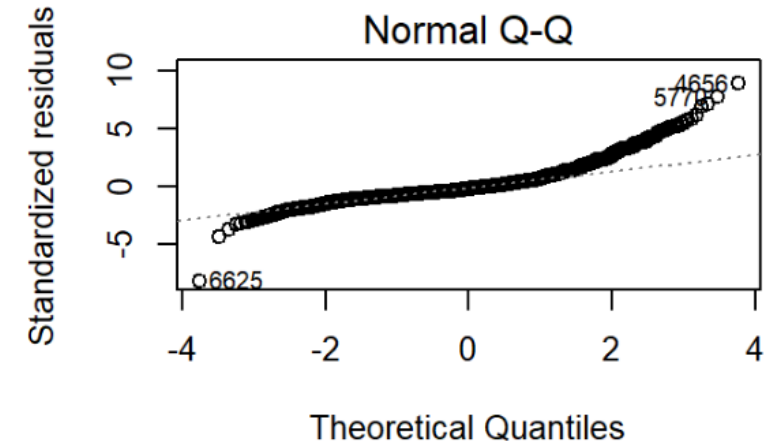
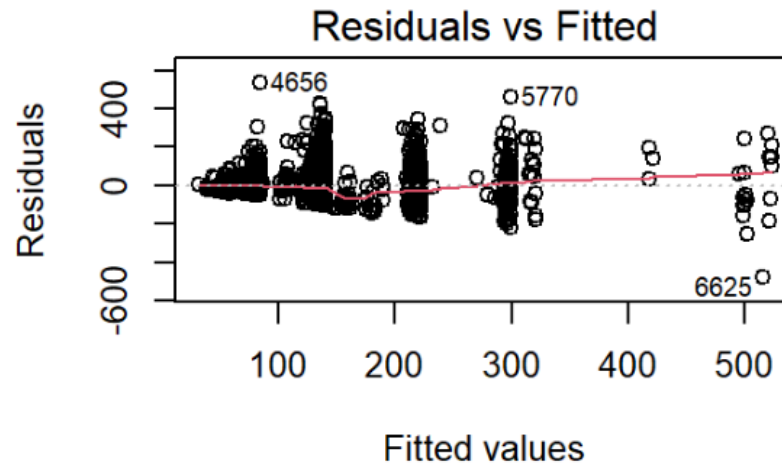
| Variable | R-squared |
|----------------|-----------|
| Bedrooms | 0.347 |
| Bathrooms | 0.168 |
| Overall Rating | 0.008 |



Beginning Model & Statistics

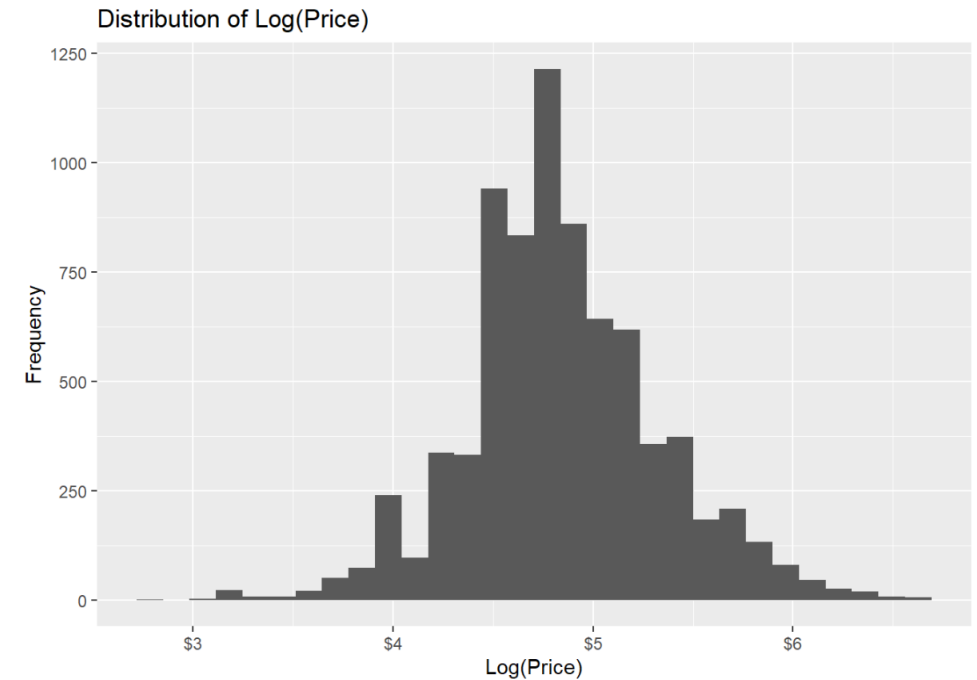
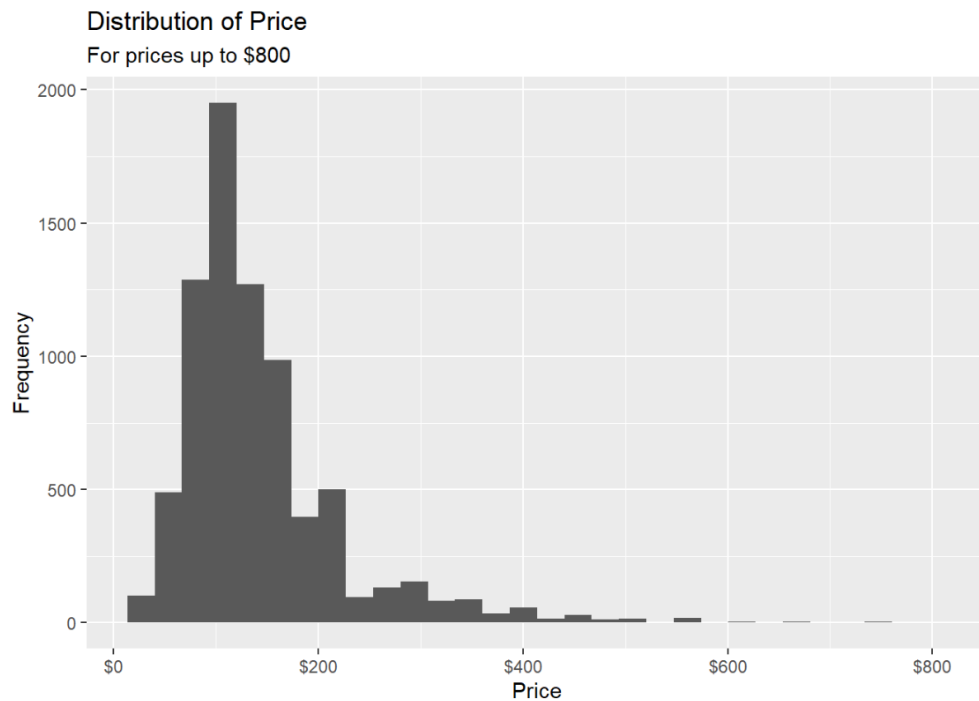
- ♦ Model #1
 - ♦ Create levels within variables
 - ♦ 5 variables included
 - ♦ Backwards Elimination
 - ♦ Adjusted R-squared = 0.379
 - ♦ Problem with variance and normality

```
## # A tibble: 11 x 3
##   term                estimate p.value
##   <chr>              <dbl>   <dbl>
## 1 (Intercept)         92.8  1.67e-14
## 2 room_typePrivate room -56.1  1.40e-152
## 3 room_typeShared room -78.6  7.63e-15
## 4 bathrooms1-1.5      15.3  3.42e-2
## 5 bathrooms2-2.5      92.2  2.11e-29
## 6 bathrooms3+        114.  1.12e-19
## 7 bedrooms3-5         81.3  5.40e-143
## 8 bedrooms6+        284.  4.70e-94
## 9 minimum_nights4-7   -2.21 3.56e-1
## 10 minimum_nights8+  -32.2 1.90e-5
## 11 review_scores_rating 0.327 1.66e-3
```



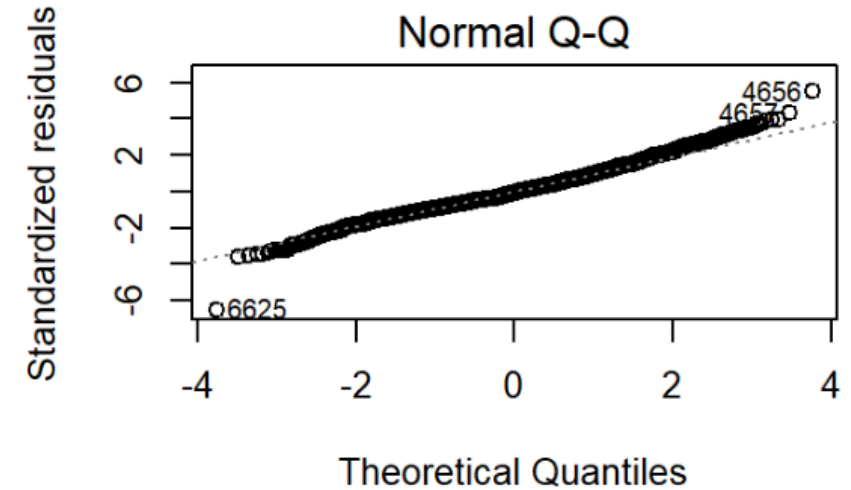
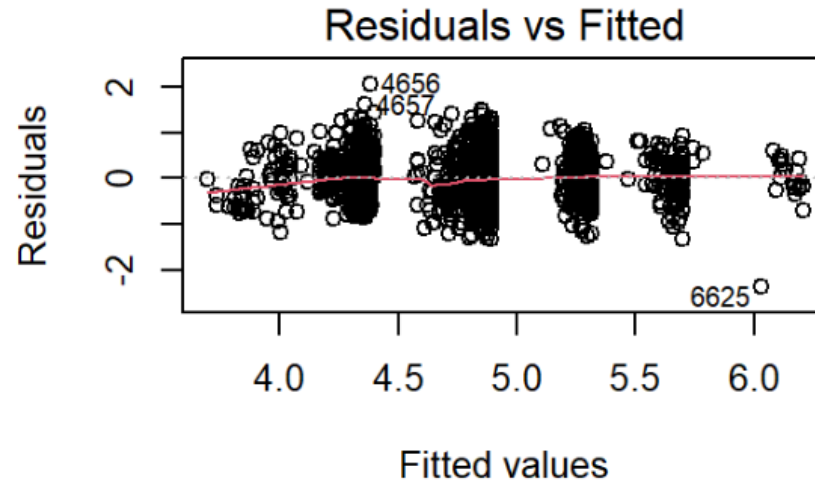
Transformation Time

- ♦ Price data = Right-skewed \rightarrow Log transformation = Not skewed
- ♦ New adjusted r-squared = 0.393



Transformation Time

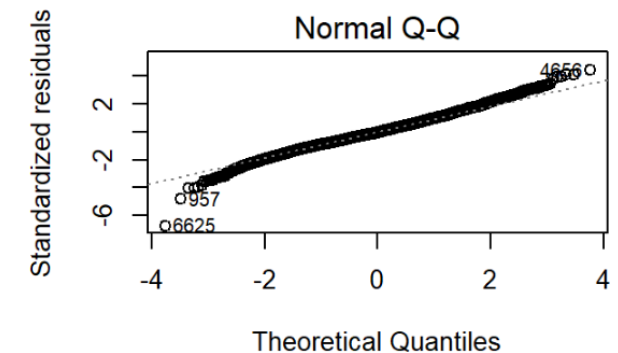
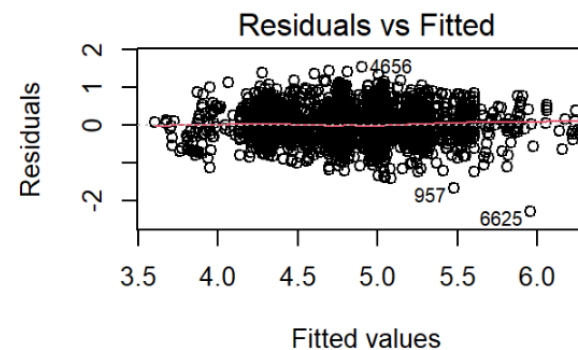
- ♦ Residual problem = fixed
- ♦ Normality problem = fixed



Final Model & Statistics

- ♦ Can we produce a stronger model?
 - ♦ Property type & accommodates added
- ♦ Model #2 & Final Model
 - ♦ Create levels within variables
 - ♦ 7 total variables
 - ♦ Backwards Elimination
 - ♦ Adjusted r-squared = 0.472

```
## # A tibble: 20 x 4
##   term                                estimate    p.value estimate_exp
##   <chr>                                <dbl>    <dbl>         <dbl>
## 1 (Intercept)                        4.20      0             66.9
## 2 room_typePrivate room             -0.468  3.62e-249      0.626
## 3 room_typeShared room              -0.814  3.16e- 43      0.443
## 4 bathrooms1-1.5                     0.120  4.41e-  3      1.13
## 5 bathrooms2-2.5                     0.395  1.05e- 16      1.49
## 6 bathrooms3+                        0.192  9.24e-  3      1.21
## 7 bedrooms3-5                       0.233  5.17e- 32      1.26
## 8 bedrooms6+                        0.514  8.06e- 10      1.67
## 9 minimum_nights4-7                 -0.00208 8.80e-  1      0.998
## 10 minimum_nights8+                 -0.419  8.56e- 22      0.658
## 11 review_scores_rating              0.00468 8.46e- 15      1.00
## 12 accommodates4-6                  0.250  1.32e-120      1.28
## 13 accommodates7+                   0.524  8.46e- 54      1.69
## 14 property_typeHouse                0.0561  1.10e-  3      1.06
## 15 property_typeBed & Breakfast      0.162  2.82e- 12      1.18
## 16 property_typeBoat                 0.162  1.44e- 12      1.18
## 17 property_typeLoft                 0.0319  4.94e-  1      1.03
## 18 property_typeCabin                -0.288  1.31e-  2      0.750
## 19 property_typeCamper/RV            -1.07   5.82e- 18      0.344
## 20 property_typeOther                 0.0179  7.76e-  1      1.02
```



Answers to Research Question

- ♦ What factors have an impact the price of an Airbnb?
 - ♦ All 7 factors researched
 - ♦ Final model's backward elimination results
- ♦ Is there a combination of factors that have a strong effect on price?
 - ♦ 7 variables instead of 5 variables
 - ♦ Adjusted r-squared values: 0.393 (5) vs. 0.472 (7)

Conclusion

- ♦ Introduction of Data
- ♦ EDA & Visualizations
- ♦ Models & Statistics
- ♦ Key Takeaways
 - ♦ Multiple variables are better than just 1!
 - ♦ Ways to fix residuals
 - ♦ Transformation and additional variables
 - ♦ Every part of the process is important!



Future Research

- ♦ Explore the variable “city”
 - ♦ Would require lots of data wrangling
- ♦ Geographic location vs. Price
 - ♦ Possibility of map plot using latitude and longitude
 - ♦ May have to filter by town or neighborhood
- ♦ Transform overall rating variable
 - ♦ Left-skewedness creates difficulties





Thank you!