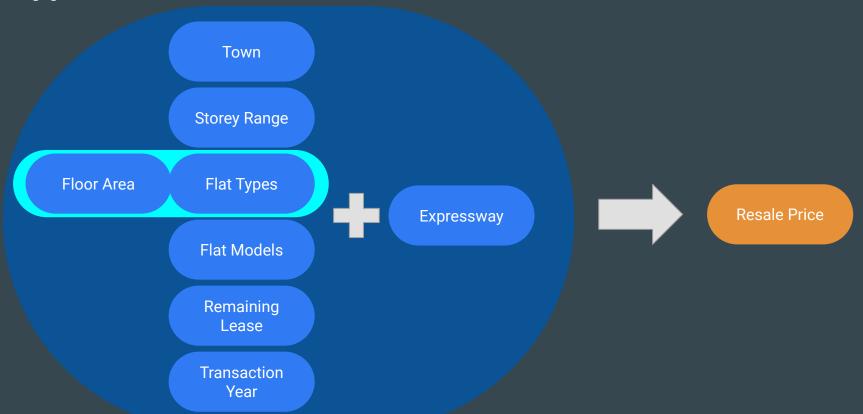
Living Near Expressways

Hypothesis

Do Living Near Expressways Increase or Decrease My HDB Flat's Value?

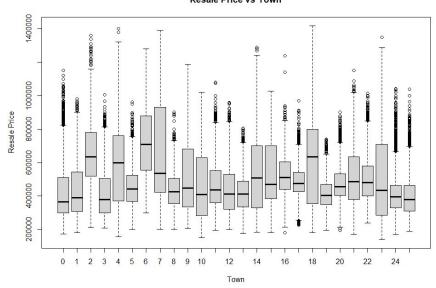
Approach



Towns

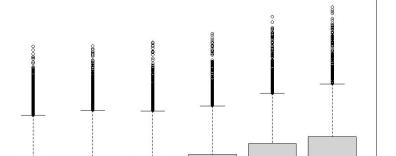
• E.g. Pasir Ris, Jurong, Punggol

Resale Price vs Town



Transaction Year

• E.g. 2017, 2019



3

Years

600000 800000 1000000

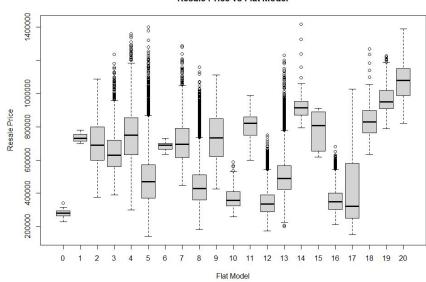
Resale Price

Resale Price vs Years

Flat Models

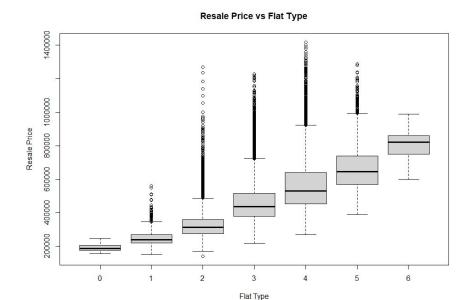
• E.g. New Generation, Improved

Resale Price vs Flat Model



Flat Types

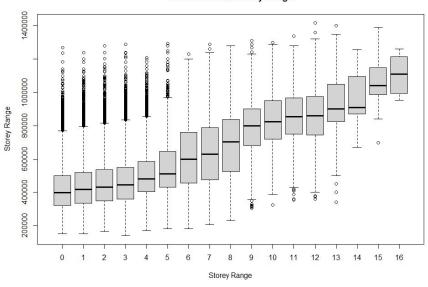
• E.g. 2 Room, 3 Room, Executive



Storey Ranges

• E.g. 10 to 12, 1 to 3, 4 to 6

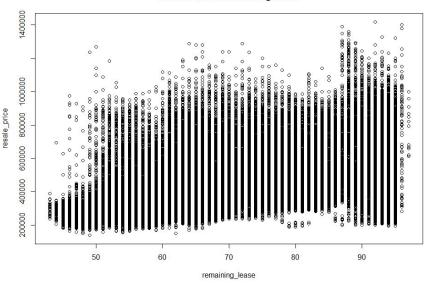
Resale Price vs Storey Range



Remaining Lease

• E.g. 62 years, 55 years

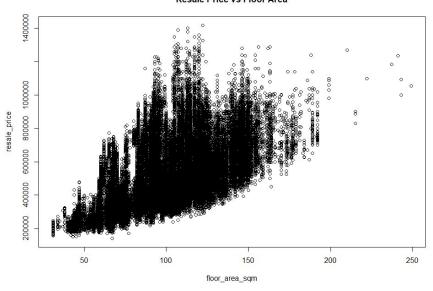
Resale Price vs Remaining Lease



Floor Area

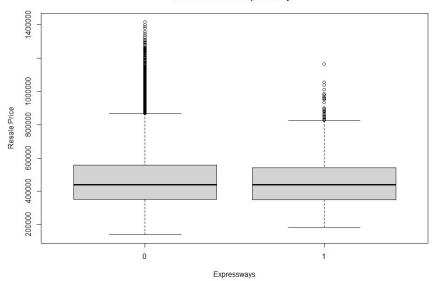
• E.g. 44.0, 52.0, 67.0

Resale Price vs Floor Area

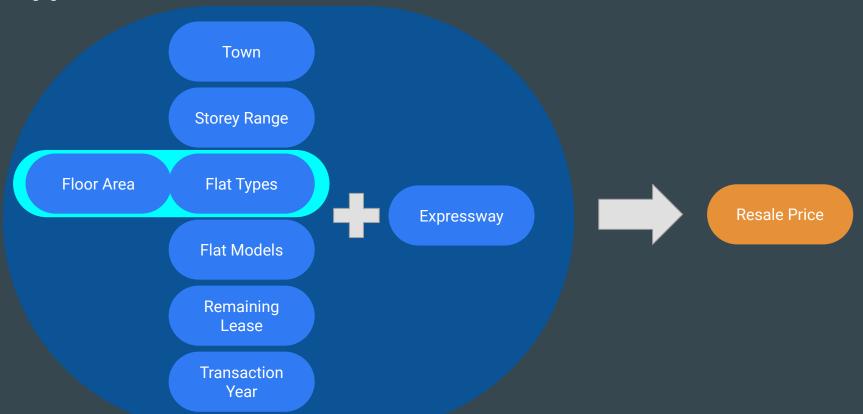


E.g. Yes (1) or No (0)

Resale Price vs Expressways



Approach



Near Expressways?

Block + Street Name	Latitude	Longitude
Bishan	1.378	130.843

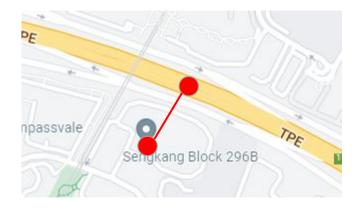
Expressway	Latitude	Longitude
PIE	1.378	130.843

Near Expressways?

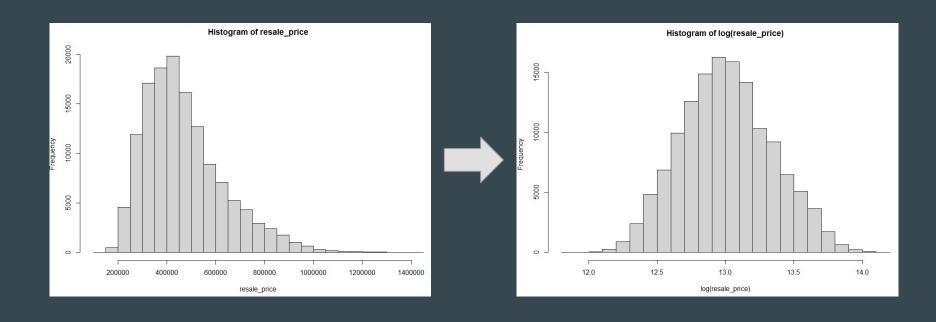
Block + Street Name	Latitude	Longitude	Expressway
2 Bishan	1.378	130.843	PIE
5 Punggol	1.483	132.457	NaN

Near Expressways?

- Round Latitude and Longitude to 3 decimal places
- I.e. 0.001 -> 111 metres



Transformation of Resale Price



Multicollinearity

Variance Inflation Factor (VIF)

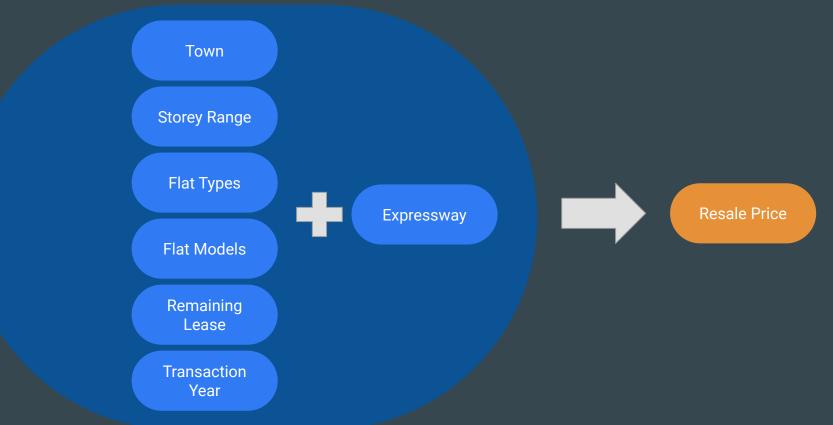
- VIF of Floor Area = 11.242 and Flat Types = 11.270
- Floor Area and Flat Types are correlated



Significance

• Cannot trust our coefficient estimates

Approach



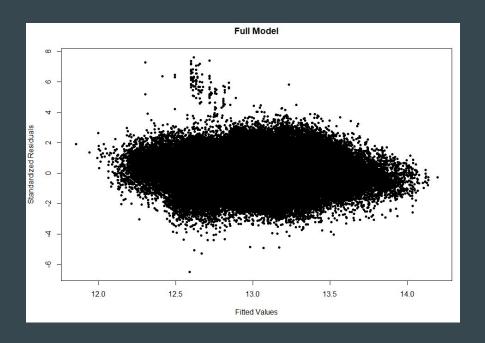
Regression

- Estimates of Coefficient of
 Expressway (Name) = -0.0622
- Resale Price Negative Correlated with Expressway
- Anova Test shows Significance of Expressway affecting Resale Price

```
Anova Table (Type II tests)
Response: log(resale_price)
                         Df F value
                                      Pr(>F)
              Sum Sq
               946.9
                          5 14438.2 < 2.2e-16
month
                            7923.6 < 2.2e-16
              2598.3
town
              3846.0
flat_type
                          5 58642.0 < 2.2e-16
storey_range 228.3
                           1087.8 < 2.2e-16
            320.5
flat_model
                        19 1286.1 < 2.2e-16
remaining_lease 597.0
                         1 45516.1 < 2.2e-16 ***
                             672.5 < 2.2e-16 ***
Name
Residuals
              1785.2 136099
```

Model Diagnostics

- Random Pattern in Residuals implies Errors are not Correlated
- Mean of Residuals = 0
- Possible Outliers (> 3 or <-3)



Removing of Outliers

- High Leverage Points +
- High Cook's Distance +
- Residual Standard Error >3 or <-3

- Coefficient Estimate is still significant
- Relationship does not change
 - Still Negative (-0.0621

```
Anova Table (Type II tests)
Response: log(resale_price)
                          Df F value
                                        Pr(>F)
               Sum Sq
month
                947.8
                           5 14495.66 < 2.2e-16
               2598.6
                         25 7948.57 < 2.2e-16
town
flat_type
               3846.6
                           5 58829.80 < 2.2e-16
              227.7
storey_range
                            1088.31 < 2.2e-16
             314.9
flat_model
                         19 1267.26 < 2.2e-16
remaining_lease 597.8
                           1 45709.73 < 2.2e-16
                               672.42 < 2.2e-16 ***
Name
Residuals
               1779.3 136061
```

Conclusion

Insights

 Presence of Expressway will result in a -6.03% drop in resale price

Future Work

- Subject Knowledge on what goes into affecting Resale Price
 - Removes OmittedVariable Bias
- Better definition of closeness
 - Distance betweenExpressway and Flats
- More focus on transformations of predictor/ response variables

Thank You