Sale Price
Determinants
of Houses in
Ames, IA

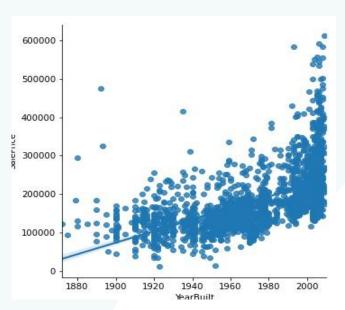
By: Samantha Chu



## **Problem Statement:**

There seems to be an upward trend of the price of houses in Ames, Iowa over the past couple of decades. Young couples and prospective homeowners looking to keep a budget while purchasing a home, would like to be able to estimate how much a home Ames, Iowa will cost them.

- Develop linear regression statistical model to predict price of house
- Suggest/recommend house characteristics that will affect price so home buyers know what price to expect.



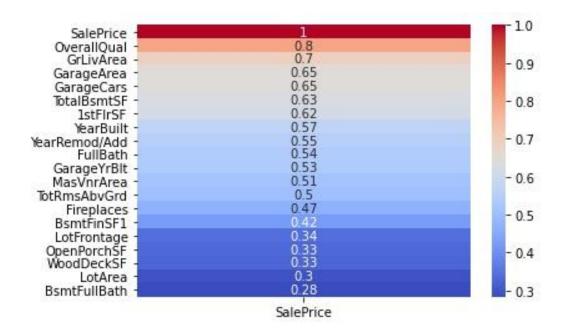


### Correlation Coefficients with the Sale Price target variable



#### **Correlation Coefficient with Sale Price:**

- Most significant factors that influenced a house's Sale Price
  - o Overall Quality
  - Exterior Quality
  - Above Ground Living Area (ft^2) = GrLivArea
  - o GarageArea
  - GarageCars
  - Total Square Feet of Basement Area = TotalBsmtSF

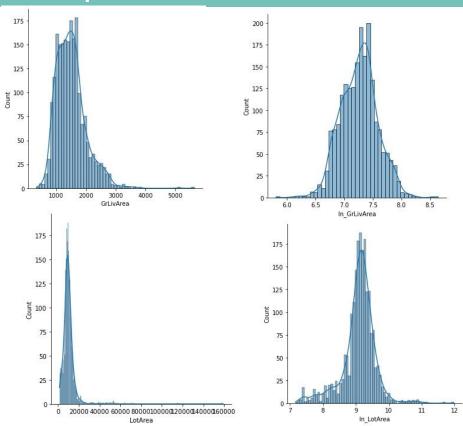






### **Transformations:**

- Above Ground Living Area was right-skewed
- Lot Area was right-skewed as well
- R^2 increased significantly after log transforming

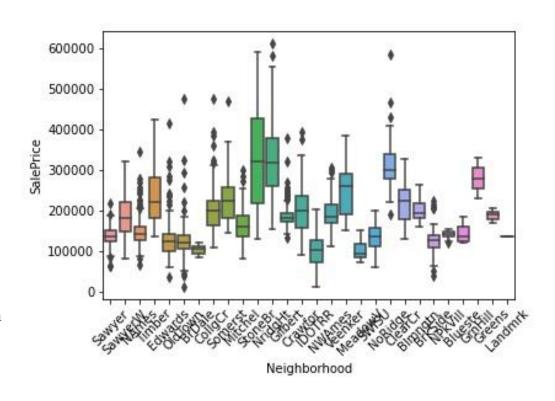


### Adding Variables that contributed to variance of Sale Price



# Features affecting Sale Price Variance

- Neighborhood variable was added
- This feature is of interest to prospective homeowners
- Where/which neighborhood a person lives in matters

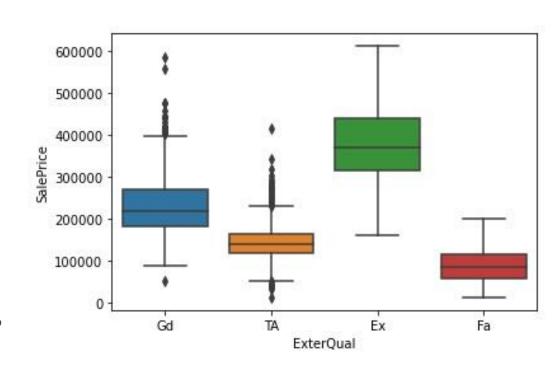


#### Adding Variables that contributed to variance of Sale Price



# Features affecting Sale Price Variance

- Exterior Quality was another variable that I added to influence the variance in Sale Price
- A lot of other variables that I added that were similar to this, and were also ordinal (BsmtQual, HeatingQC)



### **Looked at Statistical Significance**



• Looked at p-values to see significance of the variable

|              | coef       | std err  | t       | P> t  | [0.025    | 0.975]    |
|--------------|------------|----------|---------|-------|-----------|-----------|
| const        | -1.059e+06 | 8.06e+04 | -13.138 | 0.000 | -1.22e+06 | -9.01e+05 |
| In_LotArea   | 3.027e+04  | 2341.210 | 12,927  | 0.000 | 2.57e+04  | 3.49e+04  |
| In_GrLivArea | 5.98e+04   | 3565.636 | 16.770  | 0.000 | 5.28e+04  | 6.68e+04  |
| GarageArea   | 22.7350    | 5.088    | 4.469   | 0.000 | 12.755    | 32.715    |
| OverallQual  | 1.295e+04  | 1028.676 | 12.592  | 0.000 | 1.09e+04  | 1.5e+04   |
| TotalBsmtSF  | 7.6179     | 3.666    | 2.078   | 0.038 | 0.427     | 14.809    |
| BrDale       | 1.202e+04  | 1.14e+04 | 1.052   | 0.293 | -1.04e+04 | 3.44e+04  |
| BrkSide      | -2529.4090 | 8983.291 | -0.282  | 0.778 | -2.02e+04 | 1.51e+04  |
| ClearCr      | -5092.2805 | 1.02e+04 | -0.498  | 0.619 | -2.52e+04 | 1.5e+04   |
| CollgCr      | -2.008e+04 | 7876,160 | -2.549  | 0.011 | -3.55e+04 | -4625.664 |
| Crawfor      | 4439.4831  | 8877.653 | 0.500   | 0.617 | -1.3e+04  | 2.19e+04  |
| Edwards      | -2.212e+04 | 8380.669 | -2.639  | 0.008 | -3.86e+04 | -5678.940 |
| Gilbert      | -2.151e+04 | 8379.794 | -2.567  | 0.010 | -3.79e+04 | -5070.245 |
| IDOTRR       | -1.432e+04 | 9283.570 | -1.543  | 0.123 | -3.25e+04 | 3885.833  |
| MeadowV      | 1.963e+04  | 1.06e+04 | 1.845   | 0.065 | -1236.143 | 4.05e+04  |

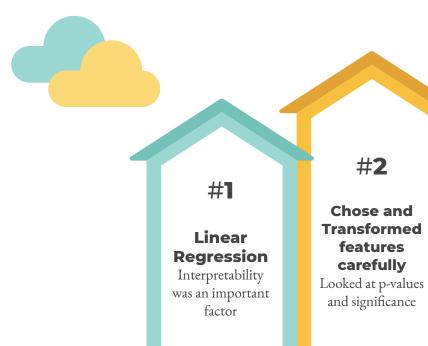
### **Looked at Statistical Significance**



• Looked at p-values to see significance of the variable

| YearBuilt_squ           | 0.0911     | 0.019    | 4.733  | 0.000 | 0.053     | 0.129    |
|-------------------------|------------|----------|--------|-------|-----------|----------|
| YearRemod-Built         | 197.0255   | 54.789   | 3.596  | 0.000 | 89.554    | 304.497  |
| ExterQual               | 1.725e+04  | 2210.460 | 7.804  | 0.000 | 1.29e+04  | 2.16e+04 |
| BsmtQual                | 2855.9111  | 1451.494 | 1.968  | 0.049 | 8.734     | 5703.088 |
| BsmtFinType1            | -761.6644  | 582,895  | -1.307 | 0.192 | -1905.041 | 381.712  |
| BsmtFinSF1              | -16.1334   | 7.907    | -2.040 | 0.041 | -31.644   | -0.623   |
| BsmtFinType1*BsmtFinSF1 | 7.9883     | 1.445    | 5.527  | 0.000 | 5.153     | 10.823   |
| 1stFlrSF                | -0.8855    | 4.048    | -0.219 | 0.827 | -8.826    | 7.055    |
| HeatingQC               | 2012.2666  | 1022.668 | 1.968  | 0.049 | 6.253     | 4018.280 |
| Hip                     | 9647.0630  | 2107.702 | 4.577  | 0.000 | 5512.700  | 1.38e+04 |
| Other_roof              | -6218,7302 | 5537.476 | -1.123 | 0.262 | -1.71e+04 | 4643.305 |
|                         |            |          |        |       |           |          |

### Methodology



#3

LASSO

Tried Lasso, but did not improve my model that much with the features that I had. ~ Lose interpretability

#**4** 

Goal

Develop a predictive model, that still maintained some interpretability



### R^2 Score

85-86%



#### **Recommendations**

# To the prospective homeowner in Ames, Iowa: A few recommendations/interpretations to consider when deciding on a home

- 1. A house in College Creek neighborhood, then holding everything else constant, on average the sale price of the house will be \$20,080 less than a house bought in Bloomington Heights neighborhood
- 2. A house bought in Meadow Village neighborhood, on average, has a sale price that is \$19,030 more than a house bought in the Bloomington Heights neighborhood
- 3. An increase in a house's exterior material quality from, ex: good, to excellent, on average will lead to an increase in the Sale Price by \$17,250.
- 4. An increase in the Heating Quality and Condition, ex: Fair to average, will lead to an increase in the sale price by \$2,012 dollars.
- 5. An increase in the ordinal category of the Kitchen Quality ex: Typical to good, will lead to an average increase in the sale price by \$11,330.
- 6. An increase in the ordinal category of the Fireplace Quality ex: Good to excellent, will lead to an average increase in the sale price by \$1,961.



