

## **Background**

We are the **Data Science team of Ground Assessment (GA)**, a company that provides **one-stop consultation and construction services** to property owners in the United States.



### **Problem Statement**

Recommend types of renovations/enhancements ('features') that would help property owners increase the sale price of their house.

### **Audience**

GA management



## Methodology

 Dataset: Sale price of different houses in Ames, Iowa between 2006-2010

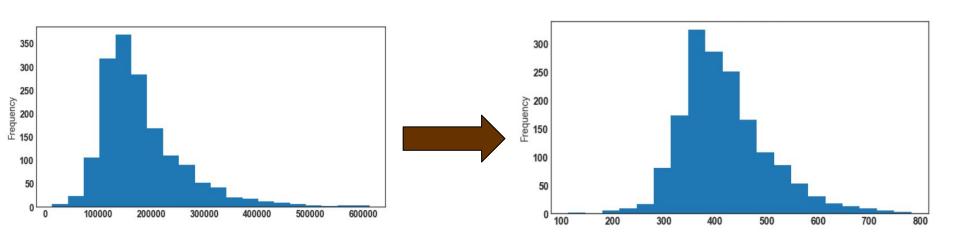
Data cleaning & exploration

Prescriptive model fitting

Top feature identification & return value estimation

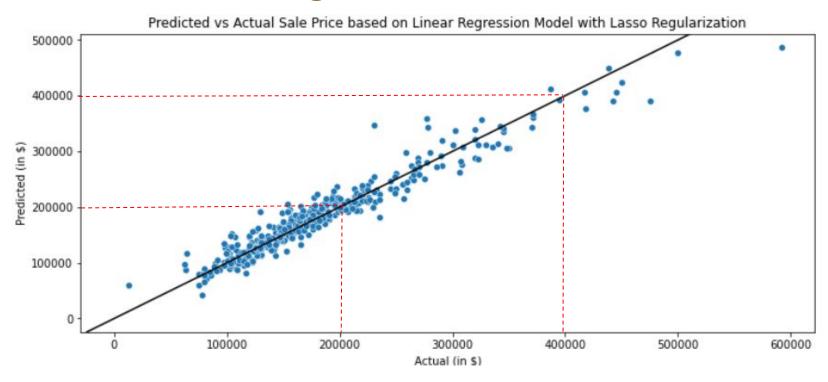
- Noteworthy edits:
  - Removed 2 outliers: large houses (>5,000 sqft) sold at very low prices
  - Corrected 1 record where a garage is built in the future (in 2207)
  - Imputed missing values based on analysis and inference

## **Distribution of Housing Sale Price**

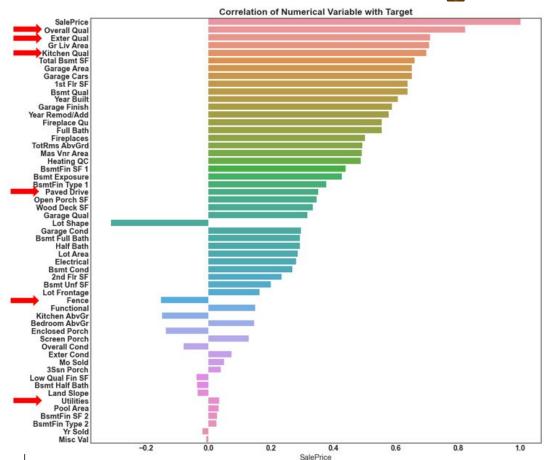


Positive Skewed transformed to Normal Distribution for better model

## **Our Prediction against Actual Sale Price**



## **Feature Correlations to Housing Price**



## **Features House Owners Can Improve On**

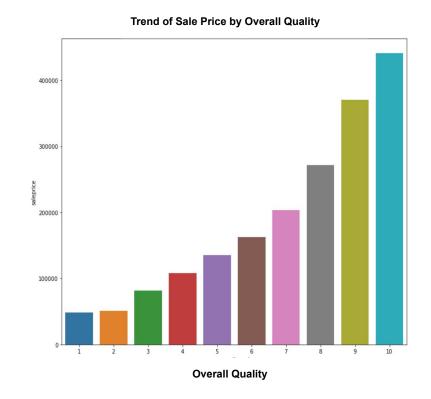
Feature	Description	<b>Correlation to Price</b>
Overall Quality	Finishing material quality	0.8
Exterior Quality	Finishing exterior quality	0.7
Kitchen Quality	Kitchen setup	0.68
Pave Drive	Top quality: Paved Lowest quality: Dirt/Gravel	0.38
Fence	Top quality: Good fencing material with privacy Lowest quality: No fencing	-0.18
Utility	Top quality: All public utilities (Electricity, gas, water, and sep tank) Lowest quality: Elec only	0.05

# Feature 1 - Overall Quality of the House

Rating of the overall condition of the house from 1 to 10:

- 1 Very poor condition
- 10 Excellent condition

Based on our model, **improvement** in the rating by 1 **score** is estimated to increase sale price of **approx**. \$13,188



# Feature 1 - Overall Quality of the House





**Poor Overall Quality** 

**Excellent Overall Quality** 

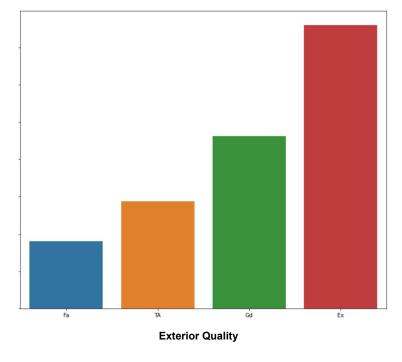
## **Feature 2 - Exterior Quality**

Rating of material quality of the exterior from 1 to 4:

- 1 Fair
- 4 Excellent

Based on our model, **improvement** in the rating by 1 **score** is estimated to increase sale price of **approx**. \$24,450

#### Trend of Sale Price by Exterior Quality



# **Feature 2 - Exterior Quality**





**Poor Exterior Quality** 

**Excellent Exterior Quality** 

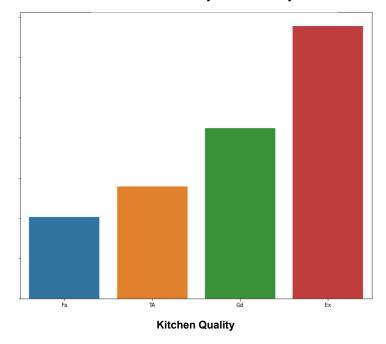
## Feature 3 - Kitchen Quality

Rating of the kitchen quality ranges from Fair to Excellent:

- 1 Fair
- 4 Excellent

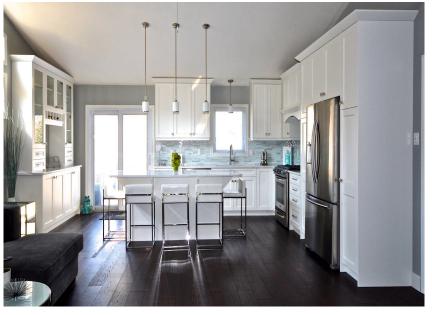
Based on our model, renovating kitchen to an excellent condition is estimated to increase sale price of approx. \$25,000

#### Trend of Sale Price by Kitchen Quality



# Feature 3 - Kitchen Quality





**Poor Quality Kitchen** 

**Excellent Quality Kitchen** 

### Conclusion

3 key renovations we recommend to help property owners maximum housing sale price:

1



The Kitchen

**1**~\$25,000 / 1 score increase

2



The Exterior



3



13,000 / 1 score increase

## **Actionable Insight**

Based on the client (house owner) current housing condition, GA proposal team can propose to client, the actual increase in housing price by the recommended types of renovation packages.

## **Next Steps**

Currently, the evaluation of house owner current housing condition is manually done by our proposal team and the evaluation is based on individual's judgement (subjective) and time consuming.

We will be working on **image processing tool to automate the evaluation of features** for a consistent scoring and reduce the amount of time for the evaluation.



# **Appendix A - Data Cleaning**

S/N	Туре	Findings	Action
01	Missing Value / Imputation for Numerical Features	<ul> <li>There are 3769 Missing Values!</li> <li>However, most of the missingness is expected. It explains the absence of Feature.</li> </ul>	<ul> <li>For categorical/Ordinal, replaces NaN to "Not applicable"</li> <li>For Continuous/Discrete, replaces NaN to 0</li> <li>Replace missing values with mean (case-by-case basis)</li> </ul>
02	Outliers	<ul> <li>Large Houses (&gt;5000 square feet) but sold at very low prices</li> <li>Data for the year where the garage is built is indicated as year 2207</li> </ul>	<ul> <li>Removed 2 outliers which are large houses sold at very low prices</li> <li>Replaced 1 future-dated year the garage is built to the year the house is built</li> </ul>
03	One hot encoding for Categorical Features (e.g. quality of basement, fireplace) -	Assume missing values as not having the features	Fill Missing values with None

## **Appendix B - Additional Considerations**

Other features which can also improve housing price:

- Size of Garage Area, Car Capacity
- Basement Height and Size

