

## Question 1

What is the optimal value of alpha for ridge and lasso regression? What will be the changes in the model if you choose double the value of alpha for both ridge and lasso? What will be the most important predictor variables after the change is implemented?

Ans: -

What is the optimal value of alpha for ridge and lasso regression?

| Ridge | Lasso     |
|-------|-----------|
| 0.005 | 16.372746 |

What will be the changes in the model if you choose double the value of alpha for both ridge and lasso?

```
# Before change  
df_final
```

|   | Parameter | Ridge   | Lasso     |
|---|-----------|---------|-----------|
| 0 | Train_R2  | 0.84906 | 0.844945  |
| 1 | Test_R2   | 0.84173 | 0.840276  |
| 2 | Alpha     | 0.00500 | 16.372746 |

```
# After change  
df_final_change
```

|   | Parameter | Ridge    | Lasso     |
|---|-----------|----------|-----------|
| 0 | Train_R2  | 0.845818 | 0.836047  |
| 1 | Test_R2   | 0.843546 | 0.832647  |
| 2 | Alpha     | 0.100000 | 32.745492 |

R2 value for ridge regression have increased and R2 value for lasso regression have reduced. But the change in R2 is not significant. Moreover top 5 variables remain the same but after that variables are changing as you can see in the below picture.

If we are increasing the alpha value more features will have coefficient of 0 and in return dependency on many variables will be reduced.

```
print(len(final_lasso_variables))  
print(len(final_lasso_variables_change))  
print(len(final_ridge_variables))  
print(len(final_ridge_variables_change))
```

```
79  
56  
101  
101
```

What will be the most important predictor variables after the change is implemented?

```
final_lasso_variables.head(20)
```

|    | Variable_Name        | Coef          | Abs_Coef      |
|----|----------------------|---------------|---------------|
| 0  | GrLivArea            | 282326.735800 | 282326.735800 |
| 1  | OverallQual          | 155680.715684 | 155680.715684 |
| 2  | RoofMatl_WdShngl     | 105220.020957 | 105220.020957 |
| 3  | Neighborhood_NridgHt | 68035.511961  | 68035.511961  |
| 4  | Heating_OthW         | -66122.237825 | 66122.237825  |
| 5  | Functional_Sev       | -62274.959880 | 62274.959880  |
| 6  | Neighborhood_StoneBr | 56939.762751  | 56939.762751  |
| 7  | Exterior2nd_ImStucc  | 39006.338067  | 39006.338067  |
| 8  | Neighborhood_NoRidge | 38249.509442  | 38249.509442  |
| 9  | BldgType_Twnhs       | -33406.240230 | 33406.240230  |
| 10 | Exterior2nd_Stucco   | -23765.920575 | 23765.920575  |
| 11 | BsmtExposure_Gd      | 23712.262644  | 23712.262644  |
| 12 | BldgType_TwnhsE      | -23330.268569 | 23330.268569  |
| 13 | Neighborhood_SWISU   | -21655.253710 | 21655.253710  |
| 14 | MSZoning_FV          | 20345.663245  | 20345.663245  |

```
final_ridge_variables.head(14)
```

|    | Variable_Name        | Coef     | Abs_Coef |
|----|----------------------|----------|----------|
| 0  | GrLivArea            | 274944   | 274944   |
| 1  | OverallQual          | 141407   | 141407   |
| 2  | RoofMatl_WdShngl     | 119304   | 119304   |
| 3  | Functional_Sev       | -83633.6 | 83633.6  |
| 4  | Neighborhood_NridgHt | 73129.8  | 73129.8  |
| 5  | Heating_OthW         | -68347   | 68347    |
| 6  | Neighborhood_StoneBr | 64854.8  | 64854.8  |
| 7  | Utilities_NoSeWa     | -52870.3 | 52870.3  |
| 8  | Exterior2nd_ImStucc  | 49330.6  | 49330.6  |
| 9  | BldgType_Twnhs       | -47864.5 | 47864.5  |
| 10 | Neighborhood_NoRidge | 41179.9  | 41179.9  |
| 11 | GarageQual_Po        | -40512.4 | 40512.4  |
| 12 | Neighborhood_NPkvill | 36506.4  | 36506.4  |
| 13 | Functional_Maj2      | -35411.4 | 35411.4  |

```
final_lasso_variables_change
```

|    | Variable_Name        | Coef          | Abs_Coef      |
|----|----------------------|---------------|---------------|
| 0  | GrLivArea            | 268604.605706 | 268604.605706 |
| 1  | OverallQual          | 171277.036647 | 171277.036647 |
| 2  | RoofMatl_WdShngl     | 97355.498567  | 97355.498567  |
| 3  | Neighborhood_NridgHt | 63272.495078  | 63272.495078  |
| 4  | Heating_OthW         | -57546.205632 | 57546.205632  |
| 5  | Neighborhood_StoneBr | 50500.711665  | 50500.711665  |
| 6  | Functional_Sev       | -48647.970198 | 48647.970198  |
| 7  | Exterior2nd_ImStucc  | 34576.336650  | 34576.336650  |
| 8  | Neighborhood_NoRidge | 34259.245883  | 34259.245883  |
| 9  | BsmtExposure_Gd      | 23896.399209  | 23896.399209  |
| 10 | BldgType_Twnhs       | -23371.645514 | 23371.645514  |
| 11 | WoodDeckSF           | 18622.262597  | 18622.262597  |
| 12 | Exterior2nd_Stucco   | -18108.290216 | 18108.290216  |
| 13 | BldgType_TwnhsE      | -16370.029073 | 16370.029073  |
| 14 | Exterior2nd_CmentBd  | 16032.022451  | 16032.022451  |

```
final_ridge_variables_change.head(14)
```

|    | Variable_Name        | Coef     | Abs_Coef |
|----|----------------------|----------|----------|
| 0  | GrLivArea            | 242658   | 242658   |
| 1  | OverallQual          | 129681   | 129681   |
| 2  | RoofMatl_WdShngl     | 115001   | 115001   |
| 3  | Functional_Sev       | -68914.5 | 68914.5  |
| 4  | Neighborhood_NridgHt | 63762.5  | 63762.5  |
| 5  | Neighborhood_StoneBr | 55835    | 55835    |
| 6  | Heating_OthW         | -54300.3 | 54300.3  |
| 7  | Utilities_NoSeWa     | -50876   | 50876    |
| 8  | Exterior2nd_ImStucc  | 48569.9  | 48569.9  |
| 9  | BldgType_Twnhs       | -37547.1 | 37547.1  |
| 10 | Neighborhood_NoRidge | 36792.1  | 36792.1  |
| 11 | Functional_Maj2      | -35555.5 | 35555.5  |
| 12 | MasVnrArea           | 33518.8  | 33518.8  |
| 13 | Neighborhood_Blueste | 25943.8  | 25943.8  |

## Question 2

You have determined the optimal value of lambda for ridge and lasso regression during the assignment. Now, which one will you choose to apply and why?

Ans: - On increase of lambda value more features will have 0 coefficient, but we need to look at R2 as well. There should be very less difference between train and test. On looking at the combination of this two we need to take decision. We have used high lambda is second iteration we are able to see there is no much difference between R2 value of both lasso and ridge. Even top 5 variables are same with both the values of lambda. But we are getting an advantage of using less variables in final model in case of high lambda. With less variable chances of changing CSI will be low. In our case lambda is very less but we are getting very less difference between R2 value of test and train almost negligible. In second case we have used high value of lambda and we are getting good R2 value as well, and difference between test and train is low as well. So, with high value of lambda with same R2 (almost) value we are able to reduce variable, so second iteration is good as comparative to first iteration.

## Question 3

After building the model, you realised that the five most important predictor variables in the lasso model are not available in the incoming data. You will now have to create another model excluding the five most important predictor variables. Which are the five most important predictor variables now?

Ans: -

```
# Dropping First 5 Variable and taking the same alpha  
a.head(20)
```

|    | Variable_Name        | Coef          | Abs_Coef      |
|----|----------------------|---------------|---------------|
| 12 | MasVnrArea           | 138707.059036 | 138707.059036 |
| 1  | Neighborhood_StoneBr | 65327.306717  | 65327.306717  |
| 63 | Neighborhood_MeadowV | -56451.859493 | 56451.859493  |
| 3  | Neighborhood_NoRidge | 55932.594864  | 55932.594864  |
| 13 | Functional_Maj2      | -52032.622612 | 52032.622612  |
| 2  | Exterior2nd_ImStucc  | 51227.200371  | 51227.200371  |
| 11 | Exterior2nd_CmentBd  | 45493.290176  | 45493.290176  |
| 10 | WoodDeckSF           | 41462.564399  | 41462.564399  |
| 6  | BsmtExposure_Gd      | 34500.663036  | 34500.663036  |
| 20 | Neighborhood_Blueste | 33895.724565  | 33895.724565  |
| 14 | Neighborhood_NPkvill | 32302.125222  | 32302.125222  |
| 16 | Foundation_Slab      | -31857.690646 | 31857.690646  |
| 15 | Neighborhood_Crawfor | 28138.558887  | 28138.558887  |
| 7  | BldgType_TwnhsE      | -27970.498715 | 27970.498715  |
| 67 | RoofMatl_Membran     | 25162.473370  | 25162.473370  |

```
# Dropping First 5 Variable and tuning alpha  
a.head(20)
```

|    | Variable_Name        | Coef          | Abs_Coef      |
|----|----------------------|---------------|---------------|
| 12 | MasVnrArea           | 139381.290958 | 139381.290958 |
| 1  | Neighborhood_StoneBr | 66479.093875  | 66479.093875  |
| 13 | Functional_Maj2      | -58420.279490 | 58420.279490  |
| 63 | Neighborhood_MeadowV | -57951.735450 | 57951.735450  |
| 3  | Neighborhood_NoRidge | 56297.013748  | 56297.013748  |
| 2  | Exterior2nd_ImStucc  | 53395.413568  | 53395.413568  |
| 11 | Exterior2nd_CmentBd  | 46683.234349  | 46683.234349  |
| 20 | Neighborhood_Blueste | 43550.001314  | 43550.001314  |
| 10 | WoodDeckSF           | 41629.526640  | 41629.526640  |
| 14 | Neighborhood_NPkvill | 36597.961531  | 36597.961531  |
| 6  | BsmtExposure_Gd      | 34662.991610  | 34662.991610  |
| 16 | Foundation_Slab      | -33641.898918 | 33641.898918  |
| 15 | Neighborhood_Crawfor | 30260.781311  | 30260.781311  |
| 7  | BldgType_TwnhsE      | -29890.909294 | 29890.909294  |
| 67 | RoofMatl_Membran     | 29219.615358  | 29219.615358  |

R2 value is dropping drastically.

Train: - 0.6689850515889246

0.7175182901130661

Test: -