Analysis Question 2

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**Loading Packages**

library(MASS)

## Warning: package 'MASS' was built under R version 4.3.3

library(glmnet)

## Warning: package 'glmnet' was built under R version 4.3.3

## Loading required package: Matrix

## Loaded glmnet 4.1-8

library(ggplot2)   
library(leaps)

## Warning: package 'leaps' was built under R version 4.3.3

library(olsrr)

## Warning: package 'olsrr' was built under R version 4.3.3

##   
## Attaching package: 'olsrr'

## The following object is masked from 'package:MASS':  
##   
## cement

## The following object is masked from 'package:datasets':  
##   
## rivers

library(plyr)   
library(forecast)

## Warning: package 'forecast' was built under R version 4.3.3

## Registered S3 method overwritten by 'quantmod':  
## method from  
## as.zoo.data.frame zoo

library(caret)

## Loading required package: lattice

library(car)

## Loading required package: carData

library(lmtest)

## Warning: package 'lmtest' was built under R version 4.3.3

## Loading required package: zoo

## Warning: package 'zoo' was built under R version 4.3.3

##   
## Attaching package: 'zoo'

## The following objects are masked from 'package:base':  
##   
## as.Date, as.Date.numeric

**Loading Data**

train\_df = read.csv(choose.files(), header = TRUE)  
test\_df = read.csv(choose.files(), header = TRUE)  
  
View(train\_df)  
View(test\_df)  
names(train\_df)

## [1] "Id" "MSSubClass" "MSZoning" "LotFrontage"   
## [5] "LotArea" "Street" "Alley" "LotShape"   
## [9] "LandContour" "Utilities" "LotConfig" "LandSlope"   
## [13] "Neighborhood" "Condition1" "Condition2" "BldgType"   
## [17] "HouseStyle" "OverallQual" "OverallCond" "YearBuilt"   
## [21] "YearRemodAdd" "RoofStyle" "RoofMatl" "Exterior1st"   
## [25] "Exterior2nd" "MasVnrType" "MasVnrArea" "ExterQual"   
## [29] "ExterCond" "Foundation" "BsmtQual" "BsmtCond"   
## [33] "BsmtExposure" "BsmtFinType1" "BsmtFinSF1" "BsmtFinType2"   
## [37] "BsmtFinSF2" "BsmtUnfSF" "TotalBsmtSF" "Heating"   
## [41] "HeatingQC" "CentralAir" "Electrical" "X1stFlrSF"   
## [45] "X2ndFlrSF" "LowQualFinSF" "GrLivArea" "BsmtFullBath"   
## [49] "BsmtHalfBath" "FullBath" "HalfBath" "BedroomAbvGr"   
## [53] "KitchenAbvGr" "KitchenQual" "TotRmsAbvGrd" "Functional"   
## [57] "Fireplaces" "FireplaceQu" "GarageType" "GarageYrBlt"   
## [61] "GarageFinish" "GarageCars" "GarageArea" "GarageQual"   
## [65] "GarageCond" "PavedDrive" "WoodDeckSF" "OpenPorchSF"   
## [69] "EnclosedPorch" "X3SsnPorch" "ScreenPorch" "PoolArea"   
## [73] "PoolQC" "Fence" "MiscFeature" "MiscVal"   
## [77] "MoSold" "YrSold" "SaleType" "SaleCondition"  
## [81] "SalePrice"

str(train\_df)

## 'data.frame': 1460 obs. of 81 variables:  
## $ Id : int 1 2 3 4 5 6 7 8 9 10 ...  
## $ MSSubClass : int 60 20 60 70 60 50 20 60 50 190 ...  
## $ MSZoning : chr "RL" "RL" "RL" "RL" ...  
## $ LotFrontage : int 65 80 68 60 84 85 75 NA 51 50 ...  
## $ LotArea : int 8450 9600 11250 9550 14260 14115 10084 10382 6120 7420 ...  
## $ Street : chr "Pave" "Pave" "Pave" "Pave" ...  
## $ Alley : chr NA NA NA NA ...  
## $ LotShape : chr "Reg" "Reg" "IR1" "IR1" ...  
## $ LandContour : chr "Lvl" "Lvl" "Lvl" "Lvl" ...  
## $ Utilities : chr "AllPub" "AllPub" "AllPub" "AllPub" ...  
## $ LotConfig : chr "Inside" "FR2" "Inside" "Corner" ...  
## $ LandSlope : chr "Gtl" "Gtl" "Gtl" "Gtl" ...  
## $ Neighborhood : chr "CollgCr" "Veenker" "CollgCr" "Crawfor" ...  
## $ Condition1 : chr "Norm" "Feedr" "Norm" "Norm" ...  
## $ Condition2 : chr "Norm" "Norm" "Norm" "Norm" ...  
## $ BldgType : chr "1Fam" "1Fam" "1Fam" "1Fam" ...  
## $ HouseStyle : chr "2Story" "1Story" "2Story" "2Story" ...  
## $ OverallQual : int 7 6 7 7 8 5 8 7 7 5 ...  
## $ OverallCond : int 5 8 5 5 5 5 5 6 5 6 ...  
## $ YearBuilt : int 2003 1976 2001 1915 2000 1993 2004 1973 1931 1939 ...  
## $ YearRemodAdd : int 2003 1976 2002 1970 2000 1995 2005 1973 1950 1950 ...  
## $ RoofStyle : chr "Gable" "Gable" "Gable" "Gable" ...  
## $ RoofMatl : chr "CompShg" "CompShg" "CompShg" "CompShg" ...  
## $ Exterior1st : chr "VinylSd" "MetalSd" "VinylSd" "Wd Sdng" ...  
## $ Exterior2nd : chr "VinylSd" "MetalSd" "VinylSd" "Wd Shng" ...  
## $ MasVnrType : chr "BrkFace" "None" "BrkFace" "None" ...  
## $ MasVnrArea : int 196 0 162 0 350 0 186 240 0 0 ...  
## $ ExterQual : chr "Gd" "TA" "Gd" "TA" ...  
## $ ExterCond : chr "TA" "TA" "TA" "TA" ...  
## $ Foundation : chr "PConc" "CBlock" "PConc" "BrkTil" ...  
## $ BsmtQual : chr "Gd" "Gd" "Gd" "TA" ...  
## $ BsmtCond : chr "TA" "TA" "TA" "Gd" ...  
## $ BsmtExposure : chr "No" "Gd" "Mn" "No" ...  
## $ BsmtFinType1 : chr "GLQ" "ALQ" "GLQ" "ALQ" ...  
## $ BsmtFinSF1 : int 706 978 486 216 655 732 1369 859 0 851 ...  
## $ BsmtFinType2 : chr "Unf" "Unf" "Unf" "Unf" ...  
## $ BsmtFinSF2 : int 0 0 0 0 0 0 0 32 0 0 ...  
## $ BsmtUnfSF : int 150 284 434 540 490 64 317 216 952 140 ...  
## $ TotalBsmtSF : int 856 1262 920 756 1145 796 1686 1107 952 991 ...  
## $ Heating : chr "GasA" "GasA" "GasA" "GasA" ...  
## $ HeatingQC : chr "Ex" "Ex" "Ex" "Gd" ...  
## $ CentralAir : chr "Y" "Y" "Y" "Y" ...  
## $ Electrical : chr "SBrkr" "SBrkr" "SBrkr" "SBrkr" ...  
## $ X1stFlrSF : int 856 1262 920 961 1145 796 1694 1107 1022 1077 ...  
## $ X2ndFlrSF : int 854 0 866 756 1053 566 0 983 752 0 ...  
## $ LowQualFinSF : int 0 0 0 0 0 0 0 0 0 0 ...  
## $ GrLivArea : int 1710 1262 1786 1717 2198 1362 1694 2090 1774 1077 ...  
## $ BsmtFullBath : int 1 0 1 1 1 1 1 1 0 1 ...  
## $ BsmtHalfBath : int 0 1 0 0 0 0 0 0 0 0 ...  
## $ FullBath : int 2 2 2 1 2 1 2 2 2 1 ...  
## $ HalfBath : int 1 0 1 0 1 1 0 1 0 0 ...  
## $ BedroomAbvGr : int 3 3 3 3 4 1 3 3 2 2 ...  
## $ KitchenAbvGr : int 1 1 1 1 1 1 1 1 2 2 ...  
## $ KitchenQual : chr "Gd" "TA" "Gd" "Gd" ...  
## $ TotRmsAbvGrd : int 8 6 6 7 9 5 7 7 8 5 ...  
## $ Functional : chr "Typ" "Typ" "Typ" "Typ" ...  
## $ Fireplaces : int 0 1 1 1 1 0 1 2 2 2 ...  
## $ FireplaceQu : chr NA "TA" "TA" "Gd" ...  
## $ GarageType : chr "Attchd" "Attchd" "Attchd" "Detchd" ...  
## $ GarageYrBlt : int 2003 1976 2001 1998 2000 1993 2004 1973 1931 1939 ...  
## $ GarageFinish : chr "RFn" "RFn" "RFn" "Unf" ...  
## $ GarageCars : int 2 2 2 3 3 2 2 2 2 1 ...  
## $ GarageArea : int 548 460 608 642 836 480 636 484 468 205 ...  
## $ GarageQual : chr "TA" "TA" "TA" "TA" ...  
## $ GarageCond : chr "TA" "TA" "TA" "TA" ...  
## $ PavedDrive : chr "Y" "Y" "Y" "Y" ...  
## $ WoodDeckSF : int 0 298 0 0 192 40 255 235 90 0 ...  
## $ OpenPorchSF : int 61 0 42 35 84 30 57 204 0 4 ...  
## $ EnclosedPorch: int 0 0 0 272 0 0 0 228 205 0 ...  
## $ X3SsnPorch : int 0 0 0 0 0 320 0 0 0 0 ...  
## $ ScreenPorch : int 0 0 0 0 0 0 0 0 0 0 ...  
## $ PoolArea : int 0 0 0 0 0 0 0 0 0 0 ...  
## $ PoolQC : chr NA NA NA NA ...  
## $ Fence : chr NA NA NA NA ...  
## $ MiscFeature : chr NA NA NA NA ...  
## $ MiscVal : int 0 0 0 0 0 700 0 350 0 0 ...  
## $ MoSold : int 2 5 9 2 12 10 8 11 4 1 ...  
## $ YrSold : int 2008 2007 2008 2006 2008 2009 2007 2009 2008 2008 ...  
## $ SaleType : chr "WD" "WD" "WD" "WD" ...  
## $ SaleCondition: chr "Normal" "Normal" "Normal" "Abnorml" ...  
## $ SalePrice : int 208500 181500 223500 140000 250000 143000 307000 200000 129900 118000 ...

**Data Processing and Cleaning**

First we will do a count of NA values per column.

## Count the number of NA values in each column  
na\_summary <- colSums(is.na(train\_df))  
sum(na\_summary > 0) # 19 columns w NA. I would like to filter them out to ease

## [1] 19

#choosing variables  
# Filter out columns with NA values  
na\_summary <- na\_summary[na\_summary > 0]  
# Print the summary, should be the names of the 19 and how many.  
print(na\_summary)

## LotFrontage Alley MasVnrType MasVnrArea BsmtQual BsmtCond   
## 259 1369 8 8 37 37   
## BsmtExposure BsmtFinType1 BsmtFinType2 Electrical FireplaceQu GarageType   
## 38 37 38 1 690 81   
## GarageYrBlt GarageFinish GarageQual GarageCond PoolQC Fence   
## 81 81 81 81 1453 1179   
## MiscFeature   
## 1406

Here we will obtain the column names then check a summary of our clean datasets.

# Get the column names with NA values  
na\_cols <- names(na\_summary)  
# Create a new dataframe without the columns containing NA values  
train\_clean <- train\_df[, !(names(train\_df) %in% na\_cols)]  
test\_clean <- test\_df[, !(names(test\_df) %in% na\_cols)]  
#Checking summary  
summary(train\_clean)

## Id MSSubClass MSZoning LotArea   
## Min. : 1.0 Min. : 20.0 Length:1460 Min. : 1300   
## 1st Qu.: 365.8 1st Qu.: 20.0 Class :character 1st Qu.: 7554   
## Median : 730.5 Median : 50.0 Mode :character Median : 9478   
## Mean : 730.5 Mean : 56.9 Mean : 10517   
## 3rd Qu.:1095.2 3rd Qu.: 70.0 3rd Qu.: 11602   
## Max. :1460.0 Max. :190.0 Max. :215245   
## Street LotShape LandContour Utilities   
## Length:1460 Length:1460 Length:1460 Length:1460   
## Class :character Class :character Class :character Class :character   
## Mode :character Mode :character Mode :character Mode :character   
##   
##   
##   
## LotConfig LandSlope Neighborhood Condition1   
## Length:1460 Length:1460 Length:1460 Length:1460   
## Class :character Class :character Class :character Class :character   
## Mode :character Mode :character Mode :character Mode :character   
##   
##   
##   
## Condition2 BldgType HouseStyle OverallQual   
## Length:1460 Length:1460 Length:1460 Min. : 1.000   
## Class :character Class :character Class :character 1st Qu.: 5.000   
## Mode :character Mode :character Mode :character Median : 6.000   
## Mean : 6.099   
## 3rd Qu.: 7.000   
## Max. :10.000   
## OverallCond YearBuilt YearRemodAdd RoofStyle   
## Min. :1.000 Min. :1872 Min. :1950 Length:1460   
## 1st Qu.:5.000 1st Qu.:1954 1st Qu.:1967 Class :character   
## Median :5.000 Median :1973 Median :1994 Mode :character   
## Mean :5.575 Mean :1971 Mean :1985   
## 3rd Qu.:6.000 3rd Qu.:2000 3rd Qu.:2004   
## Max. :9.000 Max. :2010 Max. :2010   
## RoofMatl Exterior1st Exterior2nd ExterQual   
## Length:1460 Length:1460 Length:1460 Length:1460   
## Class :character Class :character Class :character Class :character   
## Mode :character Mode :character Mode :character Mode :character   
##   
##   
##   
## ExterCond Foundation BsmtFinSF1 BsmtFinSF2   
## Length:1460 Length:1460 Min. : 0.0 Min. : 0.00   
## Class :character Class :character 1st Qu.: 0.0 1st Qu.: 0.00   
## Mode :character Mode :character Median : 383.5 Median : 0.00   
## Mean : 443.6 Mean : 46.55   
## 3rd Qu.: 712.2 3rd Qu.: 0.00   
## Max. :5644.0 Max. :1474.00   
## BsmtUnfSF TotalBsmtSF Heating HeatingQC   
## Min. : 0.0 Min. : 0.0 Length:1460 Length:1460   
## 1st Qu.: 223.0 1st Qu.: 795.8 Class :character Class :character   
## Median : 477.5 Median : 991.5 Mode :character Mode :character   
## Mean : 567.2 Mean :1057.4   
## 3rd Qu.: 808.0 3rd Qu.:1298.2   
## Max. :2336.0 Max. :6110.0   
## CentralAir X1stFlrSF X2ndFlrSF LowQualFinSF   
## Length:1460 Min. : 334 Min. : 0 Min. : 0.000   
## Class :character 1st Qu.: 882 1st Qu.: 0 1st Qu.: 0.000   
## Mode :character Median :1087 Median : 0 Median : 0.000   
## Mean :1163 Mean : 347 Mean : 5.845   
## 3rd Qu.:1391 3rd Qu.: 728 3rd Qu.: 0.000   
## Max. :4692 Max. :2065 Max. :572.000   
## GrLivArea BsmtFullBath BsmtHalfBath FullBath   
## Min. : 334 Min. :0.0000 Min. :0.00000 Min. :0.000   
## 1st Qu.:1130 1st Qu.:0.0000 1st Qu.:0.00000 1st Qu.:1.000   
## Median :1464 Median :0.0000 Median :0.00000 Median :2.000   
## Mean :1515 Mean :0.4253 Mean :0.05753 Mean :1.565   
## 3rd Qu.:1777 3rd Qu.:1.0000 3rd Qu.:0.00000 3rd Qu.:2.000   
## Max. :5642 Max. :3.0000 Max. :2.00000 Max. :3.000   
## HalfBath BedroomAbvGr KitchenAbvGr KitchenQual   
## Min. :0.0000 Min. :0.000 Min. :0.000 Length:1460   
## 1st Qu.:0.0000 1st Qu.:2.000 1st Qu.:1.000 Class :character   
## Median :0.0000 Median :3.000 Median :1.000 Mode :character   
## Mean :0.3829 Mean :2.866 Mean :1.047   
## 3rd Qu.:1.0000 3rd Qu.:3.000 3rd Qu.:1.000   
## Max. :2.0000 Max. :8.000 Max. :3.000   
## TotRmsAbvGrd Functional Fireplaces GarageCars   
## Min. : 2.000 Length:1460 Min. :0.000 Min. :0.000   
## 1st Qu.: 5.000 Class :character 1st Qu.:0.000 1st Qu.:1.000   
## Median : 6.000 Mode :character Median :1.000 Median :2.000   
## Mean : 6.518 Mean :0.613 Mean :1.767   
## 3rd Qu.: 7.000 3rd Qu.:1.000 3rd Qu.:2.000   
## Max. :14.000 Max. :3.000 Max. :4.000   
## GarageArea PavedDrive WoodDeckSF OpenPorchSF   
## Min. : 0.0 Length:1460 Min. : 0.00 Min. : 0.00   
## 1st Qu.: 334.5 Class :character 1st Qu.: 0.00 1st Qu.: 0.00   
## Median : 480.0 Mode :character Median : 0.00 Median : 25.00   
## Mean : 473.0 Mean : 94.24 Mean : 46.66   
## 3rd Qu.: 576.0 3rd Qu.:168.00 3rd Qu.: 68.00   
## Max. :1418.0 Max. :857.00 Max. :547.00   
## EnclosedPorch X3SsnPorch ScreenPorch PoolArea   
## Min. : 0.00 Min. : 0.00 Min. : 0.00 Min. : 0.000   
## 1st Qu.: 0.00 1st Qu.: 0.00 1st Qu.: 0.00 1st Qu.: 0.000   
## Median : 0.00 Median : 0.00 Median : 0.00 Median : 0.000   
## Mean : 21.95 Mean : 3.41 Mean : 15.06 Mean : 2.759   
## 3rd Qu.: 0.00 3rd Qu.: 0.00 3rd Qu.: 0.00 3rd Qu.: 0.000   
## Max. :552.00 Max. :508.00 Max. :480.00 Max. :738.000   
## MiscVal MoSold YrSold SaleType   
## Min. : 0.00 Min. : 1.000 Min. :2006 Length:1460   
## 1st Qu.: 0.00 1st Qu.: 5.000 1st Qu.:2007 Class :character   
## Median : 0.00 Median : 6.000 Median :2008 Mode :character   
## Mean : 43.49 Mean : 6.322 Mean :2008   
## 3rd Qu.: 0.00 3rd Qu.: 8.000 3rd Qu.:2009   
## Max. :15500.00 Max. :12.000 Max. :2010   
## SaleCondition SalePrice   
## Length:1460 Min. : 34900   
## Class :character 1st Qu.:129975   
## Mode :character Median :163000   
## Mean :180921   
## 3rd Qu.:214000   
## Max. :755000

summary(test\_clean)

## Id MSSubClass MSZoning LotArea   
## Min. :1461 Min. : 20.00 Length:1459 Min. : 1470   
## 1st Qu.:1826 1st Qu.: 20.00 Class :character 1st Qu.: 7391   
## Median :2190 Median : 50.00 Mode :character Median : 9399   
## Mean :2190 Mean : 57.38 Mean : 9819   
## 3rd Qu.:2554 3rd Qu.: 70.00 3rd Qu.:11518   
## Max. :2919 Max. :190.00 Max. :56600   
##   
## Street LotShape LandContour Utilities   
## Length:1459 Length:1459 Length:1459 Length:1459   
## Class :character Class :character Class :character Class :character   
## Mode :character Mode :character Mode :character Mode :character   
##   
##   
##   
##   
## LotConfig LandSlope Neighborhood Condition1   
## Length:1459 Length:1459 Length:1459 Length:1459   
## Class :character Class :character Class :character Class :character   
## Mode :character Mode :character Mode :character Mode :character   
##   
##   
##   
##   
## Condition2 BldgType HouseStyle OverallQual   
## Length:1459 Length:1459 Length:1459 Min. : 1.000   
## Class :character Class :character Class :character 1st Qu.: 5.000   
## Mode :character Mode :character Mode :character Median : 6.000   
## Mean : 6.079   
## 3rd Qu.: 7.000   
## Max. :10.000   
##   
## OverallCond YearBuilt YearRemodAdd RoofStyle   
## Min. :1.000 Min. :1879 Min. :1950 Length:1459   
## 1st Qu.:5.000 1st Qu.:1953 1st Qu.:1963 Class :character   
## Median :5.000 Median :1973 Median :1992 Mode :character   
## Mean :5.554 Mean :1971 Mean :1984   
## 3rd Qu.:6.000 3rd Qu.:2001 3rd Qu.:2004   
## Max. :9.000 Max. :2010 Max. :2010   
##   
## RoofMatl Exterior1st Exterior2nd ExterQual   
## Length:1459 Length:1459 Length:1459 Length:1459   
## Class :character Class :character Class :character Class :character   
## Mode :character Mode :character Mode :character Mode :character   
##   
##   
##   
##   
## ExterCond Foundation BsmtFinSF1 BsmtFinSF2   
## Length:1459 Length:1459 Min. : 0.0 Min. : 0.00   
## Class :character Class :character 1st Qu.: 0.0 1st Qu.: 0.00   
## Mode :character Mode :character Median : 350.5 Median : 0.00   
## Mean : 439.2 Mean : 52.62   
## 3rd Qu.: 753.5 3rd Qu.: 0.00   
## Max. :4010.0 Max. :1526.00   
## NA's :1 NA's :1   
## BsmtUnfSF TotalBsmtSF Heating HeatingQC   
## Min. : 0.0 Min. : 0 Length:1459 Length:1459   
## 1st Qu.: 219.2 1st Qu.: 784 Class :character Class :character   
## Median : 460.0 Median : 988 Mode :character Mode :character   
## Mean : 554.3 Mean :1046   
## 3rd Qu.: 797.8 3rd Qu.:1305   
## Max. :2140.0 Max. :5095   
## NA's :1 NA's :1   
## CentralAir X1stFlrSF X2ndFlrSF LowQualFinSF   
## Length:1459 Min. : 407.0 Min. : 0 Min. : 0.000   
## Class :character 1st Qu.: 873.5 1st Qu.: 0 1st Qu.: 0.000   
## Mode :character Median :1079.0 Median : 0 Median : 0.000   
## Mean :1156.5 Mean : 326 Mean : 3.543   
## 3rd Qu.:1382.5 3rd Qu.: 676 3rd Qu.: 0.000   
## Max. :5095.0 Max. :1862 Max. :1064.000   
##   
## GrLivArea BsmtFullBath BsmtHalfBath FullBath   
## Min. : 407 Min. :0.0000 Min. :0.0000 Min. :0.000   
## 1st Qu.:1118 1st Qu.:0.0000 1st Qu.:0.0000 1st Qu.:1.000   
## Median :1432 Median :0.0000 Median :0.0000 Median :2.000   
## Mean :1486 Mean :0.4345 Mean :0.0652 Mean :1.571   
## 3rd Qu.:1721 3rd Qu.:1.0000 3rd Qu.:0.0000 3rd Qu.:2.000   
## Max. :5095 Max. :3.0000 Max. :2.0000 Max. :4.000   
## NA's :2 NA's :2   
## HalfBath BedroomAbvGr KitchenAbvGr KitchenQual   
## Min. :0.0000 Min. :0.000 Min. :0.000 Length:1459   
## 1st Qu.:0.0000 1st Qu.:2.000 1st Qu.:1.000 Class :character   
## Median :0.0000 Median :3.000 Median :1.000 Mode :character   
## Mean :0.3777 Mean :2.854 Mean :1.042   
## 3rd Qu.:1.0000 3rd Qu.:3.000 3rd Qu.:1.000   
## Max. :2.0000 Max. :6.000 Max. :2.000   
##   
## TotRmsAbvGrd Functional Fireplaces GarageCars   
## Min. : 3.000 Length:1459 Min. :0.0000 Min. :0.000   
## 1st Qu.: 5.000 Class :character 1st Qu.:0.0000 1st Qu.:1.000   
## Median : 6.000 Mode :character Median :0.0000 Median :2.000   
## Mean : 6.385 Mean :0.5812 Mean :1.766   
## 3rd Qu.: 7.000 3rd Qu.:1.0000 3rd Qu.:2.000   
## Max. :15.000 Max. :4.0000 Max. :5.000   
## NA's :1   
## GarageArea PavedDrive WoodDeckSF OpenPorchSF   
## Min. : 0.0 Length:1459 Min. : 0.00 Min. : 0.00   
## 1st Qu.: 318.0 Class :character 1st Qu.: 0.00 1st Qu.: 0.00   
## Median : 480.0 Mode :character Median : 0.00 Median : 28.00   
## Mean : 472.8 Mean : 93.17 Mean : 48.31   
## 3rd Qu.: 576.0 3rd Qu.: 168.00 3rd Qu.: 72.00   
## Max. :1488.0 Max. :1424.00 Max. :742.00   
## NA's :1   
## EnclosedPorch X3SsnPorch ScreenPorch PoolArea   
## Min. : 0.00 Min. : 0.000 Min. : 0.00 Min. : 0.000   
## 1st Qu.: 0.00 1st Qu.: 0.000 1st Qu.: 0.00 1st Qu.: 0.000   
## Median : 0.00 Median : 0.000 Median : 0.00 Median : 0.000   
## Mean : 24.24 Mean : 1.794 Mean : 17.06 Mean : 1.744   
## 3rd Qu.: 0.00 3rd Qu.: 0.000 3rd Qu.: 0.00 3rd Qu.: 0.000   
## Max. :1012.00 Max. :360.000 Max. :576.00 Max. :800.000   
##   
## MiscVal MoSold YrSold SaleType   
## Min. : 0.00 Min. : 1.000 Min. :2006 Length:1459   
## 1st Qu.: 0.00 1st Qu.: 4.000 1st Qu.:2007 Class :character   
## Median : 0.00 Median : 6.000 Median :2008 Mode :character   
## Mean : 58.17 Mean : 6.104 Mean :2008   
## 3rd Qu.: 0.00 3rd Qu.: 8.000 3rd Qu.:2009   
## Max. :17000.00 Max. :12.000 Max. :2010   
##   
## SaleCondition   
## Length:1459   
## Class :character   
## Mode :character   
##   
##   
##   
##

From our summary we see that our character columns would make more sense if they were changed to factor values. After converting to characters, we will double check for NA’s below.

# we see that there are many character columns that can be changed into a factor  
# of multiple levels  
# Identify character columns  
character\_columns <- sapply(train\_clean, is.character)  
character\_columns <- sapply(test\_clean, is.character)  
# Get the names of columns identified as character columns  
character\_column\_names <- names(character\_columns)[character\_columns]  
# Convert character columns to factors  
train\_clean[character\_column\_names] <- lapply(train\_clean[character\_column\_names], as.factor)  
test\_clean[character\_column\_names] <- lapply(test\_clean[character\_column\_names], as.factor)  
  
# Double checking for NA's:  
missing\_values <- colSums(is.na(train\_clean))  
missing\_val2 <- colSums(is.na(test\_clean))  
# Display variables with missing values and their counts  
missing\_values <- missing\_values[missing\_values > 0]  
missing\_val2 <- missing\_val2[missing\_val2 > 0]  
print(missing\_values) #There should be ZERO NA's.

## named numeric(0)

print(missing\_val2) #There are NA's!! We can impute to deal w them.

## MSZoning Utilities Exterior1st Exterior2nd BsmtFinSF1 BsmtFinSF2   
## 4 2 1 1 1 1   
## BsmtUnfSF TotalBsmtSF BsmtFullBath BsmtHalfBath KitchenQual Functional   
## 1 1 2 2 1 2   
## GarageCars GarageArea SaleType   
## 1 1 1

Now we see that there are no longer NAs in our Train\_clean dataset, we want to eliminate NAs from the Test\_clean dataset as well by imputing. For categorical variable columns we impute NAs along the mode, for numeric variable columns we impute along the mean.

#TO DEAL WITH MISSING VALUES WE WILL IMPUTE ALONG MEAN (NUMERIC)/MODE (CATEGORICAL)  
# Define a function to calculate the mode  
Mode <- function(x) {  
 ux <- unique(x)  
 ux[which.max(tabulate(match(x, ux)))]  
}  
  
# Identify columns with missing values  
missing\_cols <- colnames(test\_clean)[colSums(is.na(test\_clean)) > 0]  
  
# Impute categorical variables with mode and numerical variables with mean  
for (col in missing\_cols) {  
 if (is.factor(test\_clean[[col]])) {  
 # Impute categorical variables with mode  
 test\_clean[[col]][is.na(test\_clean[[col]])] <- Mode(test\_clean[[col]][!is.na(test\_clean[[col]])])  
 } else {  
 # Impute numerical variables with mean  
 test\_clean[[col]][is.na(test\_clean[[col]])] <- mean(test\_clean[[col]], na.rm = TRUE)  
 }  
}  
  
# Verify if all missing values have been imputed  
colSums(is.na(test\_clean)) #NO MORE MISSING VALUES

## Id MSSubClass MSZoning LotArea Street   
## 0 0 0 0 0   
## LotShape LandContour Utilities LotConfig LandSlope   
## 0 0 0 0 0   
## Neighborhood Condition1 Condition2 BldgType HouseStyle   
## 0 0 0 0 0   
## OverallQual OverallCond YearBuilt YearRemodAdd RoofStyle   
## 0 0 0 0 0   
## RoofMatl Exterior1st Exterior2nd ExterQual ExterCond   
## 0 0 0 0 0   
## Foundation BsmtFinSF1 BsmtFinSF2 BsmtUnfSF TotalBsmtSF   
## 0 0 0 0 0   
## Heating HeatingQC CentralAir X1stFlrSF X2ndFlrSF   
## 0 0 0 0 0   
## LowQualFinSF GrLivArea BsmtFullBath BsmtHalfBath FullBath   
## 0 0 0 0 0   
## HalfBath BedroomAbvGr KitchenAbvGr KitchenQual TotRmsAbvGrd   
## 0 0 0 0 0   
## Functional Fireplaces GarageCars GarageArea PavedDrive   
## 0 0 0 0 0   
## WoodDeckSF OpenPorchSF EnclosedPorch X3SsnPorch ScreenPorch   
## 0 0 0 0 0   
## PoolArea MiscVal MoSold YrSold SaleType   
## 0 0 0 0 0   
## SaleCondition   
## 0

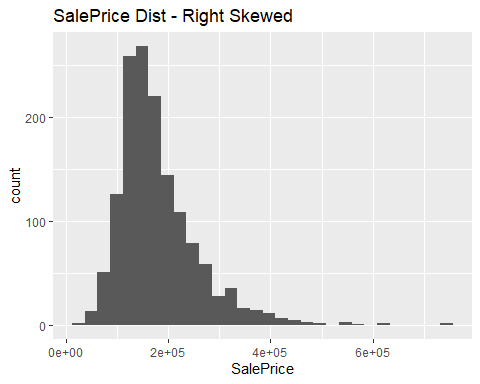
NO MORE MISSING VALUES!

**Variable Analysis**

We will now analyze our response variable and check its distribution.

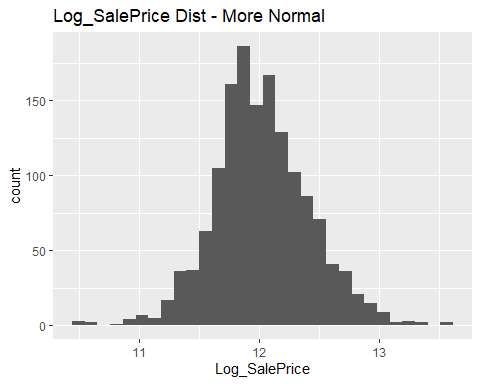
#Distribution of SalePrice is right-skewed:  
ggplot(data = train\_clean, aes(x = SalePrice)) +  
 geom\_histogram() +  
 labs(title = "SalePrice Dist - Right Skewed")

## `stat\_bin()` using `bins = 30`. Pick better value with `binwidth`.



#Logging the SalePrice column because it is very right-skewed (non normal distribution)  
train\_clean$Log\_SalePrice = log(train\_clean$SalePrice)  
  
#Distribution of Log\_SalePrice:  
ggplot(data = train\_clean, aes(x = Log\_SalePrice)) +  
 geom\_histogram() +  
 labs(title = "Log\_SalePrice Dist - More Normal")

## `stat\_bin()` using `bins = 30`. Pick better value with `binwidth`.



**Model Selection**

Here we will do different selection techniques and store our models under different variable names (log\_forward, log\_backward, log\_stepwise).

Forward Selection

#another way to do forward selection:  
#int only model  
log\_intercept\_only = lm(Log\_SalePrice ~ 1, data = train\_clean)  
#model w all predictors  
log\_all = lm(Log\_SalePrice ~.-SalePrice, data = train\_clean)  
#forward selection  
log\_forward = step(log\_intercept\_only, direction = "forward", scope = formula(log\_all), trace = 0)  
log\_forward # to show results

##   
## Call:  
## lm(formula = Log\_SalePrice ~ OverallQual + Neighborhood + GrLivArea +   
## GarageCars + OverallCond + BsmtFullBath + RoofMatl + TotalBsmtSF +   
## YearBuilt + BldgType + Condition2 + MSZoning + BsmtFinSF1 +   
## SaleCondition + Functional + LotArea + CentralAir + KitchenQual +   
## Condition1 + Fireplaces + Heating + ScreenPorch + SaleType +   
## Exterior1st + WoodDeckSF + YearRemodAdd + GarageArea + Foundation +   
## LandSlope + EnclosedPorch + HeatingQC + LotConfig + BsmtFinSF2 +   
## Street + X3SsnPorch + KitchenAbvGr + PoolArea + HalfBath +   
## FullBath + X1stFlrSF + LandContour, data = train\_clean)  
##   
## Coefficients:  
## (Intercept) OverallQual NeighborhoodBlueste   
## 1.961e+00 4.974e-02 -6.829e-02   
## NeighborhoodBrDale NeighborhoodBrkSide NeighborhoodClearCr   
## -6.628e-02 6.636e-03 3.222e-02   
## NeighborhoodCollgCr NeighborhoodCrawfor NeighborhoodEdwards   
## -2.703e-02 9.132e-02 -7.714e-02   
## NeighborhoodGilbert NeighborhoodIDOTRR NeighborhoodMeadowV   
## -2.667e-02 -3.520e-02 -1.647e-01   
## NeighborhoodMitchel NeighborhoodNAmes NeighborhoodNoRidge   
## -6.428e-02 -4.014e-02 1.924e-02   
## NeighborhoodNPkVill NeighborhoodNridgHt NeighborhoodNWAmes   
## 1.043e-03 7.529e-02 -4.823e-02   
## NeighborhoodOldTown NeighborhoodSawyer NeighborhoodSawyerW   
## -5.715e-02 -3.720e-02 -2.268e-02   
## NeighborhoodSomerst NeighborhoodStoneBr NeighborhoodSWISU   
## 1.865e-02 1.016e-01 -9.875e-03   
## NeighborhoodTimber NeighborhoodVeenker GrLivArea   
## -8.342e-03 2.735e-02 2.366e-04   
## GarageCars OverallCond BsmtFullBath   
## 2.931e-02 3.815e-02 2.596e-02   
## RoofMatlCompShg RoofMatlMembran RoofMatlMetal   
## 2.618e+00 2.971e+00 2.788e+00   
## RoofMatlRoll RoofMatlTar&Grv RoofMatlWdShake   
## 2.688e+00 2.678e+00 2.645e+00   
## RoofMatlWdShngl TotalBsmtSF YearBuilt   
## 2.711e+00 7.237e-05 2.106e-03   
## BldgType2fmCon BldgTypeDuplex BldgTypeTwnhs   
## -3.720e-03 -1.452e-02 -1.070e-01   
## BldgTypeTwnhsE Condition2Feedr Condition2Norm   
## -5.916e-02 5.222e-02 2.052e-02   
## Condition2PosA Condition2PosN Condition2RRAe   
## 3.176e-01 -8.534e-01 -7.408e-02   
## Condition2RRAn Condition2RRNn MSZoningFV   
## -6.901e-02 -4.985e-02 4.162e-01   
## MSZoningRH MSZoningRL MSZoningRM   
## 3.981e-01 4.021e-01 3.674e-01   
## BsmtFinSF1 SaleConditionAdjLand SaleConditionAlloca   
## 7.546e-05 9.985e-02 6.605e-02   
## SaleConditionFamily SaleConditionNormal SaleConditionPartial   
## 1.937e-02 7.330e-02 -3.962e-02   
## FunctionalMaj2 FunctionalMin1 FunctionalMin2   
## -2.196e-01 4.221e-02 3.785e-02   
## FunctionalMod FunctionalSev FunctionalTyp   
## -6.446e-02 -3.512e-01 7.919e-02   
## LotArea CentralAirY KitchenQualFa   
## 2.434e-06 5.879e-02 -6.694e-02   
## KitchenQualGd KitchenQualTA Condition1Feedr   
## -6.691e-02 -6.559e-02 3.068e-02   
## Condition1Norm Condition1PosA Condition1PosN   
## 7.961e-02 5.086e-02 7.437e-02   
## Condition1RRAe Condition1RRAn Condition1RRNe   
## -4.347e-02 4.936e-02 1.130e-02   
## Condition1RRNn Fireplaces HeatingGasA   
## 9.622e-02 2.462e-02 1.405e-01   
## HeatingGasW HeatingGrav HeatingOthW   
## 2.096e-01 -6.718e-03 1.003e-01   
## HeatingWall ScreenPorch SaleTypeCon   
## 2.365e-01 2.618e-04 8.764e-02   
## SaleTypeConLD SaleTypeConLI SaleTypeConLw   
## 1.370e-01 -2.739e-02 2.283e-02   
## SaleTypeCWD SaleTypeNew SaleTypeOth   
## 9.768e-02 1.535e-01 7.648e-02   
## SaleTypeWD Exterior1stAsphShn Exterior1stBrkComm   
## -1.116e-02 4.498e-03 -1.900e-01   
## Exterior1stBrkFace Exterior1stCBlock Exterior1stCemntBd   
## 8.811e-02 -1.500e-02 4.699e-02   
## Exterior1stHdBoard Exterior1stImStucc Exterior1stMetalSd   
## 1.555e-02 -8.017e-03 4.586e-02   
## Exterior1stPlywood Exterior1stStone Exterior1stStucco   
## 2.000e-02 -1.983e-02 2.643e-02   
## Exterior1stVinylSd Exterior1stWd Sdng Exterior1stWdShing   
## 3.764e-02 1.633e-02 1.690e-02   
## WoodDeckSF YearRemodAdd GarageArea   
## 9.043e-05 6.150e-04 1.086e-04   
## FoundationCBlock FoundationPConc FoundationSlab   
## 1.418e-02 3.663e-02 -2.902e-02   
## FoundationStone FoundationWood LandSlopeMod   
## 1.171e-01 -1.221e-01 3.184e-02   
## LandSlopeSev EnclosedPorch HeatingQCFa   
## -1.115e-01 1.312e-04 -2.501e-02   
## HeatingQCGd HeatingQCPo HeatingQCTA   
## -2.146e-02 -6.681e-02 -3.134e-02   
## LotConfigCulDSac LotConfigFR2 LotConfigFR3   
## 2.358e-02 -2.409e-02 -8.676e-02   
## LotConfigInside BsmtFinSF2 StreetPave   
## -1.142e-02 3.865e-05 1.045e-01   
## X3SsnPorch KitchenAbvGr PoolArea   
## 1.670e-04 -4.438e-02 1.276e-04   
## HalfBath FullBath X1stFlrSF   
## 2.148e-02 1.429e-02 3.197e-05   
## LandContourHLS LandContourLow LandContourLvl   
## 4.572e-02 3.844e-03 2.877e-02

summary(log\_forward)

##   
## Call:  
## lm(formula = Log\_SalePrice ~ OverallQual + Neighborhood + GrLivArea +   
## GarageCars + OverallCond + BsmtFullBath + RoofMatl + TotalBsmtSF +   
## YearBuilt + BldgType + Condition2 + MSZoning + BsmtFinSF1 +   
## SaleCondition + Functional + LotArea + CentralAir + KitchenQual +   
## Condition1 + Fireplaces + Heating + ScreenPorch + SaleType +   
## Exterior1st + WoodDeckSF + YearRemodAdd + GarageArea + Foundation +   
## LandSlope + EnclosedPorch + HeatingQC + LotConfig + BsmtFinSF2 +   
## Street + X3SsnPorch + KitchenAbvGr + PoolArea + HalfBath +   
## FullBath + X1stFlrSF + LandContour, data = train\_clean)  
##   
## Residuals:  
## Min 1Q Median 3Q Max   
## -0.69318 -0.04845 0.00053 0.05564 0.69318   
##   
## Coefficients:  
## Estimate Std. Error t value Pr(>|t|)   
## (Intercept) 1.961e+00 7.446e-01 2.634 0.008539 \*\*   
## OverallQual 4.974e-02 4.254e-03 11.692 < 2e-16 \*\*\*  
## NeighborhoodBlueste -6.829e-02 8.437e-02 -0.809 0.418439   
## NeighborhoodBrDale -6.628e-02 4.756e-02 -1.394 0.163633   
## NeighborhoodBrkSide 6.636e-03 4.006e-02 0.166 0.868455   
## NeighborhoodClearCr 3.222e-02 3.979e-02 0.810 0.418240   
## NeighborhoodCollgCr -2.703e-02 3.132e-02 -0.863 0.388324   
## NeighborhoodCrawfor 9.132e-02 3.690e-02 2.475 0.013453 \*   
## NeighborhoodEdwards -7.714e-02 3.445e-02 -2.239 0.025324 \*   
## NeighborhoodGilbert -2.667e-02 3.337e-02 -0.799 0.424346   
## NeighborhoodIDOTRR -3.520e-02 4.638e-02 -0.759 0.448074   
## NeighborhoodMeadowV -1.647e-01 4.813e-02 -3.423 0.000639 \*\*\*  
## NeighborhoodMitchel -6.428e-02 3.510e-02 -1.831 0.067253 .   
## NeighborhoodNAmes -4.014e-02 3.356e-02 -1.196 0.231781   
## NeighborhoodNoRidge 1.924e-02 3.564e-02 0.540 0.589321   
## NeighborhoodNPkVill 1.043e-03 4.825e-02 0.022 0.982762   
## NeighborhoodNridgHt 7.529e-02 3.141e-02 2.397 0.016655 \*   
## NeighborhoodNWAmes -4.823e-02 3.473e-02 -1.389 0.165158   
## NeighborhoodOldTown -5.715e-02 4.115e-02 -1.389 0.165103   
## NeighborhoodSawyer -3.720e-02 3.511e-02 -1.059 0.289573   
## NeighborhoodSawyerW -2.268e-02 3.378e-02 -0.671 0.502027   
## NeighborhoodSomerst 1.865e-02 3.860e-02 0.483 0.629015   
## NeighborhoodStoneBr 1.016e-01 3.587e-02 2.834 0.004667 \*\*   
## NeighborhoodSWISU -9.875e-03 4.147e-02 -0.238 0.811801   
## NeighborhoodTimber -8.342e-03 3.564e-02 -0.234 0.814958   
## NeighborhoodVeenker 2.735e-02 4.612e-02 0.593 0.553367   
## GrLivArea 2.366e-04 1.340e-05 17.660 < 2e-16 \*\*\*  
## GarageCars 2.931e-02 9.605e-03 3.052 0.002318 \*\*   
## OverallCond 3.815e-02 3.614e-03 10.556 < 2e-16 \*\*\*  
## BsmtFullBath 2.596e-02 8.023e-03 3.236 0.001243 \*\*   
## RoofMatlCompShg 2.618e+00 1.370e-01 19.112 < 2e-16 \*\*\*  
## RoofMatlMembran 2.971e+00 1.877e-01 15.825 < 2e-16 \*\*\*  
## RoofMatlMetal 2.788e+00 1.852e-01 15.055 < 2e-16 \*\*\*  
## RoofMatlRoll 2.688e+00 1.760e-01 15.267 < 2e-16 \*\*\*  
## RoofMatlTar&Grv 2.678e+00 1.423e-01 18.818 < 2e-16 \*\*\*  
## RoofMatlWdShake 2.645e+00 1.483e-01 17.831 < 2e-16 \*\*\*  
## RoofMatlWdShngl 2.711e+00 1.418e-01 19.119 < 2e-16 \*\*\*  
## TotalBsmtSF 7.237e-05 1.683e-05 4.301 1.82e-05 \*\*\*  
## YearBuilt 2.106e-03 3.014e-04 6.988 4.40e-12 \*\*\*  
## BldgType2fmCon -3.720e-03 2.505e-02 -0.149 0.881960   
## BldgTypeDuplex -1.452e-02 2.668e-02 -0.544 0.586553   
## BldgTypeTwnhs -1.070e-01 2.346e-02 -4.560 5.60e-06 \*\*\*  
## BldgTypeTwnhsE -5.916e-02 1.570e-02 -3.767 0.000172 \*\*\*  
## Condition2Feedr 5.222e-02 9.820e-02 0.532 0.594965   
## Condition2Norm 2.052e-02 8.370e-02 0.245 0.806355   
## Condition2PosA 3.176e-01 1.388e-01 2.289 0.022241 \*   
## Condition2PosN -8.534e-01 1.190e-01 -7.169 1.25e-12 \*\*\*  
## Condition2RRAe -7.408e-02 1.387e-01 -0.534 0.593341   
## Condition2RRAn -6.901e-02 1.388e-01 -0.497 0.619062   
## Condition2RRNn -4.985e-02 1.170e-01 -0.426 0.670123   
## MSZoningFV 4.162e-01 5.292e-02 7.864 7.66e-15 \*\*\*  
## MSZoningRH 3.981e-01 5.289e-02 7.528 9.50e-14 \*\*\*  
## MSZoningRL 4.021e-01 4.505e-02 8.924 < 2e-16 \*\*\*  
## MSZoningRM 3.674e-01 4.206e-02 8.736 < 2e-16 \*\*\*  
## BsmtFinSF1 7.546e-05 1.055e-05 7.154 1.39e-12 \*\*\*  
## SaleConditionAdjLand 9.985e-02 5.996e-02 1.665 0.096078 .   
## SaleConditionAlloca 6.605e-02 3.789e-02 1.743 0.081510 .   
## SaleConditionFamily 1.937e-02 2.743e-02 0.706 0.480189   
## SaleConditionNormal 7.330e-02 1.278e-02 5.737 1.20e-08 \*\*\*  
## SaleConditionPartial -3.962e-02 6.737e-02 -0.588 0.556531   
## FunctionalMaj2 -2.196e-01 5.836e-02 -3.763 0.000176 \*\*\*  
## FunctionalMin1 4.221e-02 3.669e-02 1.151 0.250075   
## FunctionalMin2 3.785e-02 3.606e-02 1.050 0.294103   
## FunctionalMod -6.446e-02 4.331e-02 -1.488 0.136920   
## FunctionalSev -3.512e-01 1.193e-01 -2.943 0.003304 \*\*   
## FunctionalTyp 7.919e-02 3.128e-02 2.532 0.011454 \*   
## LotArea 2.434e-06 4.341e-07 5.607 2.50e-08 \*\*\*  
## CentralAirY 5.879e-02 1.622e-02 3.624 0.000301 \*\*\*  
## KitchenQualFa -6.694e-02 2.615e-02 -2.559 0.010593 \*   
## KitchenQualGd -6.691e-02 1.408e-02 -4.753 2.23e-06 \*\*\*  
## KitchenQualTA -6.559e-02 1.638e-02 -4.004 6.57e-05 \*\*\*  
## Condition1Feedr 3.068e-02 2.174e-02 1.411 0.158401   
## Condition1Norm 7.961e-02 1.787e-02 4.456 9.05e-06 \*\*\*  
## Condition1PosA 5.086e-02 4.395e-02 1.157 0.247387   
## Condition1PosN 7.437e-02 3.238e-02 2.297 0.021777 \*   
## Condition1RRAe -4.347e-02 4.070e-02 -1.068 0.285650   
## Condition1RRAn 4.936e-02 2.996e-02 1.648 0.099607 .   
## Condition1RRNe 1.130e-02 8.036e-02 0.141 0.888183   
## Condition1RRNn 9.622e-02 5.573e-02 1.726 0.084495 .   
## Fireplaces 2.462e-02 5.910e-03 4.165 3.32e-05 \*\*\*  
## HeatingGasA 1.405e-01 1.110e-01 1.267 0.205542   
## HeatingGasW 2.096e-01 1.139e-01 1.840 0.066038 .   
## HeatingGrav -6.718e-03 1.194e-01 -0.056 0.955155   
## HeatingOthW 1.003e-01 1.373e-01 0.730 0.465306   
## HeatingWall 2.365e-01 1.267e-01 1.867 0.062145 .   
## ScreenPorch 2.618e-04 5.428e-05 4.823 1.58e-06 \*\*\*  
## SaleTypeCon 8.764e-02 8.021e-02 1.093 0.274729   
## SaleTypeConLD 1.370e-01 4.290e-02 3.193 0.001441 \*\*   
## SaleTypeConLI -2.739e-02 5.194e-02 -0.527 0.598124   
## SaleTypeConLw 2.283e-02 5.327e-02 0.429 0.668270   
## SaleTypeCWD 9.768e-02 5.818e-02 1.679 0.093418 .   
## SaleTypeNew 1.535e-01 6.965e-02 2.203 0.027743 \*   
## SaleTypeOth 7.648e-02 6.562e-02 1.166 0.244018   
## SaleTypeWD -1.116e-02 1.861e-02 -0.600 0.548589   
## Exterior1stAsphShn 4.498e-03 1.143e-01 0.039 0.968622   
## Exterior1stBrkComm -1.900e-01 8.745e-02 -2.173 0.029966 \*   
## Exterior1stBrkFace 8.811e-02 3.168e-02 2.782 0.005484 \*\*   
## Exterior1stCBlock -1.500e-02 1.131e-01 -0.133 0.894491   
## Exterior1stCemntBd 4.699e-02 3.296e-02 1.426 0.154131   
## Exterior1stHdBoard 1.555e-02 2.880e-02 0.540 0.589161   
## Exterior1stImStucc -8.017e-03 1.119e-01 -0.072 0.942892   
## Exterior1stMetalSd 4.586e-02 2.805e-02 1.635 0.102322   
## Exterior1stPlywood 2.000e-02 3.042e-02 0.657 0.511057   
## Exterior1stStone -1.983e-02 8.808e-02 -0.225 0.821929   
## Exterior1stStucco 2.643e-02 3.508e-02 0.754 0.451231   
## Exterior1stVinylSd 3.764e-02 2.818e-02 1.336 0.181871   
## Exterior1stWd Sdng 1.633e-02 2.790e-02 0.585 0.558547   
## Exterior1stWdShing 1.690e-02 3.494e-02 0.484 0.628727   
## WoodDeckSF 9.043e-05 2.580e-05 3.504 0.000473 \*\*\*  
## YearRemodAdd 6.150e-04 2.352e-04 2.615 0.009034 \*\*   
## GarageArea 1.086e-04 3.267e-05 3.323 0.000916 \*\*\*  
## FoundationCBlock 1.418e-02 1.374e-02 1.032 0.302259   
## FoundationPConc 3.663e-02 1.517e-02 2.415 0.015861 \*   
## FoundationSlab -2.902e-02 3.322e-02 -0.873 0.382568   
## FoundationStone 1.171e-01 4.633e-02 2.529 0.011570 \*   
## FoundationWood -1.221e-01 6.579e-02 -1.855 0.063757 .   
## LandSlopeMod 3.184e-02 1.726e-02 1.845 0.065272 .   
## LandSlopeSev -1.115e-01 4.569e-02 -2.442 0.014755 \*   
## EnclosedPorch 1.312e-04 5.454e-05 2.407 0.016236 \*   
## HeatingQCFa -2.501e-02 2.045e-02 -1.223 0.221497   
## HeatingQCGd -2.146e-02 9.221e-03 -2.327 0.020119 \*   
## HeatingQCPo -6.681e-02 1.163e-01 -0.574 0.565731   
## HeatingQCTA -3.134e-02 9.122e-03 -3.435 0.000610 \*\*\*  
## LotConfigCulDSac 2.358e-02 1.394e-02 1.692 0.090899 .   
## LotConfigFR2 -2.409e-02 1.789e-02 -1.347 0.178224   
## LotConfigFR3 -8.676e-02 5.692e-02 -1.524 0.127680   
## LotConfigInside -1.142e-02 7.773e-03 -1.469 0.142096   
## BsmtFinSF2 3.865e-05 2.047e-05 1.888 0.059220 .   
## StreetPave 1.045e-01 5.051e-02 2.069 0.038732 \*   
## X3SsnPorch 1.670e-04 1.009e-04 1.655 0.098080 .   
## KitchenAbvGr -4.438e-02 2.359e-02 -1.881 0.060150 .   
## PoolArea 1.276e-04 7.825e-05 1.631 0.103160   
## HalfBath 2.148e-02 8.871e-03 2.421 0.015613 \*   
## FullBath 1.429e-02 9.549e-03 1.496 0.134874   
## X1stFlrSF 3.197e-05 1.978e-05 1.616 0.106256   
## LandContourHLS 4.572e-02 2.264e-02 2.020 0.043601 \*   
## LandContourLow 3.844e-03 2.746e-02 0.140 0.888696   
## LandContourLvl 2.877e-02 1.615e-02 1.782 0.075012 .   
## ---  
## Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1  
##   
## Residual standard error: 0.1058 on 1322 degrees of freedom  
## Multiple R-squared: 0.9364, Adjusted R-squared: 0.9298   
## F-statistic: 142.1 on 137 and 1322 DF, p-value: < 2.2e-16

Backward Elimination

#Do a backwards elimination  
log\_backward = step(log\_all, direction = 'backward', scope = formula(log\_all), trace = 0)  
log\_backward

##   
## Call:  
## lm(formula = Log\_SalePrice ~ MSZoning + LotArea + Street + LandContour +   
## Utilities + LotConfig + LandSlope + Neighborhood + Condition1 +   
## Condition2 + BldgType + OverallQual + OverallCond + YearBuilt +   
## YearRemodAdd + RoofStyle + RoofMatl + Exterior1st + Foundation +   
## BsmtFinSF1 + BsmtFinSF2 + BsmtUnfSF + Heating + HeatingQC +   
## CentralAir + X1stFlrSF + X2ndFlrSF + LowQualFinSF + BsmtFullBath +   
## FullBath + HalfBath + KitchenAbvGr + KitchenQual + TotRmsAbvGrd +   
## Functional + Fireplaces + GarageCars + GarageArea + WoodDeckSF +   
## OpenPorchSF + EnclosedPorch + X3SsnPorch + ScreenPorch +   
## PoolArea + SaleType + SaleCondition, data = train\_clean)  
##   
## Coefficients:  
## (Intercept) MSZoningFV MSZoningRH   
## 1.970e+00 4.195e-01 3.978e-01   
## MSZoningRL MSZoningRM LotArea   
## 4.043e-01 3.706e-01 2.612e-06   
## StreetPave LandContourHLS LandContourLow   
## 1.115e-01 4.555e-02 -3.820e-03   
## LandContourLvl UtilitiesNoSeWa LotConfigCulDSac   
## 2.919e-02 -1.583e-01 2.527e-02   
## LotConfigFR2 LotConfigFR3 LotConfigInside   
## -2.617e-02 -8.993e-02 -1.216e-02   
## LandSlopeMod LandSlopeSev NeighborhoodBlueste   
## 3.592e-02 -1.396e-01 -6.886e-02   
## NeighborhoodBrDale NeighborhoodBrkSide NeighborhoodClearCr   
## -7.204e-02 6.798e-03 1.985e-02   
## NeighborhoodCollgCr NeighborhoodCrawfor NeighborhoodEdwards   
## -2.409e-02 9.053e-02 -7.966e-02   
## NeighborhoodGilbert NeighborhoodIDOTRR NeighborhoodMeadowV   
## -2.317e-02 -3.746e-02 -1.666e-01   
## NeighborhoodMitchel NeighborhoodNAmes NeighborhoodNoRidge   
## -6.541e-02 -4.210e-02 2.451e-02   
## NeighborhoodNPkVill NeighborhoodNridgHt NeighborhoodNWAmes   
## -5.221e-03 7.565e-02 -5.309e-02   
## NeighborhoodOldTown NeighborhoodSawyer NeighborhoodSawyerW   
## -5.918e-02 -3.922e-02 -2.164e-02   
## NeighborhoodSomerst NeighborhoodStoneBr NeighborhoodSWISU   
## 1.882e-02 1.051e-01 -4.200e-03   
## NeighborhoodTimber NeighborhoodVeenker Condition1Feedr   
## 1.474e-03 2.807e-02 2.931e-02   
## Condition1Norm Condition1PosA Condition1PosN   
## 7.775e-02 5.641e-02 7.106e-02   
## Condition1RRAe Condition1RRAn Condition1RRNe   
## -4.570e-02 4.124e-02 8.165e-03   
## Condition1RRNn Condition2Feedr Condition2Norm   
## 9.151e-02 6.195e-02 1.825e-02   
## Condition2PosA Condition2PosN Condition2RRAe   
## 2.888e-01 -8.480e-01 -4.896e-01   
## Condition2RRAn Condition2RRNn BldgType2fmCon   
## -6.496e-02 -5.222e-02 -1.714e-03   
## BldgTypeDuplex BldgTypeTwnhs BldgTypeTwnhsE   
## -1.159e-02 -9.902e-02 -5.216e-02   
## OverallQual OverallCond YearBuilt   
## 4.890e-02 3.792e-02 2.127e-03   
## YearRemodAdd RoofStyleGable RoofStyleGambrel   
## 6.145e-04 -4.127e-02 -3.870e-02   
## RoofStyleHip RoofStyleMansard RoofStyleShed   
## -3.778e-02 1.390e-02 3.639e-01   
## RoofMatlCompShg RoofMatlMembran RoofMatlMetal   
## 2.614e+00 2.982e+00 2.785e+00   
## RoofMatlRoll RoofMatlTar&Grv RoofMatlWdShake   
## 2.674e+00 2.643e+00 2.536e+00   
## RoofMatlWdShngl Exterior1stAsphShn Exterior1stBrkComm   
## 2.721e+00 1.124e-03 -1.888e-01   
## Exterior1stBrkFace Exterior1stCBlock Exterior1stCemntBd   
## 8.665e-02 -1.332e-02 4.247e-02   
## Exterior1stHdBoard Exterior1stImStucc Exterior1stMetalSd   
## 1.355e-02 -7.294e-03 4.455e-02   
## Exterior1stPlywood Exterior1stStone Exterior1stStucco   
## 1.805e-02 2.344e-02 2.594e-02   
## Exterior1stVinylSd Exterior1stWd Sdng Exterior1stWdShing   
## 3.459e-02 1.615e-02 1.675e-02   
## FoundationCBlock FoundationPConc FoundationSlab   
## 1.501e-02 3.398e-02 -2.946e-02   
## FoundationStone FoundationWood BsmtFinSF1   
## 1.042e-01 -1.245e-01 1.476e-04   
## BsmtFinSF2 BsmtUnfSF HeatingGasA   
## 1.105e-04 7.089e-05 1.403e-01   
## HeatingGasW HeatingGrav HeatingOthW   
## 2.057e-01 -8.994e-03 1.145e-01   
## HeatingWall HeatingQCFa HeatingQCGd   
## 2.384e-01 -2.591e-02 -2.052e-02   
## HeatingQCPo HeatingQCTA CentralAirY   
## -6.339e-02 -3.158e-02 6.079e-02   
## X1stFlrSF X2ndFlrSF LowQualFinSF   
## 2.543e-04 2.224e-04 1.556e-04   
## BsmtFullBath FullBath HalfBath   
## 2.402e-02 1.455e-02 1.905e-02   
## KitchenAbvGr KitchenQualFa KitchenQualGd   
## -5.192e-02 -5.996e-02 -6.577e-02   
## KitchenQualTA TotRmsAbvGrd FunctionalMaj2   
## -6.474e-02 5.611e-03 -2.158e-01   
## FunctionalMin1 FunctionalMin2 FunctionalMod   
## 3.549e-02 3.598e-02 -7.274e-02   
## FunctionalSev FunctionalTyp Fireplaces   
## -3.732e-01 7.502e-02 2.457e-02   
## GarageCars GarageArea WoodDeckSF   
## 2.742e-02 1.140e-04 9.159e-05   
## OpenPorchSF EnclosedPorch X3SsnPorch   
## 7.015e-05 1.373e-04 1.779e-04   
## ScreenPorch PoolArea SaleTypeCon   
## 2.752e-04 1.330e-04 8.705e-02   
## SaleTypeConLD SaleTypeConLI SaleTypeConLw   
## 1.352e-01 -3.642e-02 2.030e-02   
## SaleTypeCWD SaleTypeNew SaleTypeOth   
## 9.584e-02 1.324e-01 7.144e-02   
## SaleTypeWD SaleConditionAdjLand SaleConditionAlloca   
## -1.502e-02 8.919e-02 6.272e-02   
## SaleConditionFamily SaleConditionNormal SaleConditionPartial   
## 1.688e-02 7.027e-02 -2.679e-02

summary(log\_backward)

##   
## Call:  
## lm(formula = Log\_SalePrice ~ MSZoning + LotArea + Street + LandContour +   
## Utilities + LotConfig + LandSlope + Neighborhood + Condition1 +   
## Condition2 + BldgType + OverallQual + OverallCond + YearBuilt +   
## YearRemodAdd + RoofStyle + RoofMatl + Exterior1st + Foundation +   
## BsmtFinSF1 + BsmtFinSF2 + BsmtUnfSF + Heating + HeatingQC +   
## CentralAir + X1stFlrSF + X2ndFlrSF + LowQualFinSF + BsmtFullBath +   
## FullBath + HalfBath + KitchenAbvGr + KitchenQual + TotRmsAbvGrd +   
## Functional + Fireplaces + GarageCars + GarageArea + WoodDeckSF +   
## OpenPorchSF + EnclosedPorch + X3SsnPorch + ScreenPorch +   
## PoolArea + SaleType + SaleCondition, data = train\_clean)  
##   
## Residuals:  
## Min 1Q Median 3Q Max   
## -0.69689 -0.04738 0.00043 0.05437 0.69689   
##   
## Coefficients:  
## Estimate Std. Error t value Pr(>|t|)   
## (Intercept) 1.970e+00 7.499e-01 2.627 0.008719 \*\*   
## MSZoningFV 4.195e-01 5.299e-02 7.916 5.20e-15 \*\*\*  
## MSZoningRH 3.978e-01 5.294e-02 7.513 1.06e-13 \*\*\*  
## MSZoningRL 4.043e-01 4.521e-02 8.942 < 2e-16 \*\*\*  
## MSZoningRM 3.706e-01 4.227e-02 8.767 < 2e-16 \*\*\*  
## LotArea 2.612e-06 4.414e-07 5.917 4.18e-09 \*\*\*  
## StreetPave 1.115e-01 5.047e-02 2.208 0.027395 \*   
## LandContourHLS 4.555e-02 2.262e-02 2.013 0.044289 \*   
## LandContourLow -3.820e-03 2.759e-02 -0.138 0.889919   
## LandContourLvl 2.919e-02 1.613e-02 1.809 0.070626 .   
## UtilitiesNoSeWa -1.583e-01 1.121e-01 -1.413 0.157986   
## LotConfigCulDSac 2.527e-02 1.401e-02 1.804 0.071466 .   
## LotConfigFR2 -2.617e-02 1.795e-02 -1.457 0.145266   
## LotConfigFR3 -8.993e-02 5.688e-02 -1.581 0.114100   
## LotConfigInside -1.216e-02 7.789e-03 -1.561 0.118747   
## LandSlopeMod 3.592e-02 1.731e-02 2.076 0.038116 \*   
## LandSlopeSev -1.396e-01 4.782e-02 -2.918 0.003583 \*\*   
## NeighborhoodBlueste -6.886e-02 8.434e-02 -0.816 0.414375   
## NeighborhoodBrDale -7.204e-02 4.765e-02 -1.512 0.130780   
## NeighborhoodBrkSide 6.798e-03 4.066e-02 0.167 0.867240   
## NeighborhoodClearCr 1.985e-02 4.052e-02 0.490 0.624323   
## NeighborhoodCollgCr -2.409e-02 3.166e-02 -0.761 0.446831   
## NeighborhoodCrawfor 9.053e-02 3.728e-02 2.428 0.015311 \*   
## NeighborhoodEdwards -7.966e-02 3.484e-02 -2.287 0.022373 \*   
## NeighborhoodGilbert -2.317e-02 3.363e-02 -0.689 0.490985   
## NeighborhoodIDOTRR -3.746e-02 4.666e-02 -0.803 0.422163   
## NeighborhoodMeadowV -1.666e-01 4.833e-02 -3.447 0.000584 \*\*\*  
## NeighborhoodMitchel -6.541e-02 3.550e-02 -1.843 0.065591 .   
## NeighborhoodNAmes -4.210e-02 3.389e-02 -1.242 0.214281   
## NeighborhoodNoRidge 2.451e-02 3.626e-02 0.676 0.499099   
## NeighborhoodNPkVill -5.221e-03 4.824e-02 -0.108 0.913835   
## NeighborhoodNridgHt 7.565e-02 3.151e-02 2.401 0.016494 \*   
## NeighborhoodNWAmes -5.309e-02 3.509e-02 -1.513 0.130544   
## NeighborhoodOldTown -5.918e-02 4.175e-02 -1.418 0.156561   
## NeighborhoodSawyer -3.922e-02 3.542e-02 -1.107 0.268398   
## NeighborhoodSawyerW -2.164e-02 3.413e-02 -0.634 0.526271   
## NeighborhoodSomerst 1.882e-02 3.890e-02 0.484 0.628706   
## NeighborhoodStoneBr 1.051e-01 3.607e-02 2.915 0.003619 \*\*   
## NeighborhoodSWISU -4.200e-03 4.219e-02 -0.100 0.920711   
## NeighborhoodTimber 1.474e-03 3.598e-02 0.041 0.967334   
## NeighborhoodVeenker 2.807e-02 4.633e-02 0.606 0.544724   
## Condition1Feedr 2.931e-02 2.175e-02 1.347 0.178064   
## Condition1Norm 7.775e-02 1.787e-02 4.350 1.46e-05 \*\*\*  
## Condition1PosA 5.641e-02 4.409e-02 1.279 0.201047   
## Condition1PosN 7.106e-02 3.262e-02 2.179 0.029540 \*   
## Condition1RRAe -4.570e-02 4.064e-02 -1.124 0.261062   
## Condition1RRAn 4.124e-02 3.013e-02 1.369 0.171315   
## Condition1RRNe 8.165e-03 8.018e-02 0.102 0.918903   
## Condition1RRNn 9.151e-02 5.573e-02 1.642 0.100848   
## Condition2Feedr 6.195e-02 9.842e-02 0.629 0.529160   
## Condition2Norm 1.825e-02 8.368e-02 0.218 0.827378   
## Condition2PosA 2.888e-01 1.397e-01 2.068 0.038837 \*   
## Condition2PosN -8.480e-01 1.190e-01 -7.125 1.71e-12 \*\*\*  
## Condition2RRAe -4.896e-01 1.945e-01 -2.517 0.011948 \*   
## Condition2RRAn -6.496e-02 1.386e-01 -0.469 0.639418   
## Condition2RRNn -5.222e-02 1.168e-01 -0.447 0.654990   
## BldgType2fmCon -1.714e-03 2.509e-02 -0.068 0.945544   
## BldgTypeDuplex -1.159e-02 2.685e-02 -0.432 0.666149   
## BldgTypeTwnhs -9.902e-02 2.374e-02 -4.171 3.24e-05 \*\*\*  
## BldgTypeTwnhsE -5.216e-02 1.628e-02 -3.204 0.001387 \*\*   
## OverallQual 4.890e-02 4.266e-03 11.463 < 2e-16 \*\*\*  
## OverallCond 3.792e-02 3.617e-03 10.485 < 2e-16 \*\*\*  
## YearBuilt 2.127e-03 3.024e-04 7.032 3.27e-12 \*\*\*  
## YearRemodAdd 6.145e-04 2.353e-04 2.612 0.009101 \*\*   
## RoofStyleGable -4.127e-02 8.092e-02 -0.510 0.610102   
## RoofStyleGambrel -3.870e-02 8.757e-02 -0.442 0.658642   
## RoofStyleHip -3.778e-02 8.117e-02 -0.465 0.641705   
## RoofStyleMansard 1.390e-02 9.331e-02 0.149 0.881619   
## RoofStyleShed 3.639e-01 1.546e-01 2.353 0.018747 \*   
## RoofMatlCompShg 2.614e+00 1.376e-01 18.996 < 2e-16 \*\*\*  
## RoofMatlMembran 2.982e+00 2.032e-01 14.674 < 2e-16 \*\*\*  
## RoofMatlMetal 2.785e+00 2.019e-01 13.795 < 2e-16 \*\*\*  
## RoofMatlRoll 2.674e+00 1.765e-01 15.147 < 2e-16 \*\*\*  
## RoofMatlTar&Grv 2.643e+00 1.594e-01 16.577 < 2e-16 \*\*\*  
## RoofMatlWdShake 2.536e+00 1.532e-01 16.553 < 2e-16 \*\*\*  
## RoofMatlWdShngl 2.721e+00 1.425e-01 19.089 < 2e-16 \*\*\*  
## Exterior1stAsphShn 1.124e-03 1.143e-01 0.010 0.992150   
## Exterior1stBrkComm -1.888e-01 8.759e-02 -2.156 0.031291 \*   
## Exterior1stBrkFace 8.665e-02 3.172e-02 2.732 0.006388 \*\*   
## Exterior1stCBlock -1.332e-02 1.128e-01 -0.118 0.906051   
## Exterior1stCemntBd 4.247e-02 3.307e-02 1.284 0.199269   
## Exterior1stHdBoard 1.355e-02 2.888e-02 0.469 0.639026   
## Exterior1stImStucc -7.294e-03 1.119e-01 -0.065 0.948044   
## Exterior1stMetalSd 4.455e-02 2.810e-02 1.585 0.113203   
## Exterior1stPlywood 1.805e-02 3.055e-02 0.591 0.554818   
## Exterior1stStone 2.344e-02 8.967e-02 0.261 0.793789   
## Exterior1stStucco 2.594e-02 3.508e-02 0.739 0.459854   
## Exterior1stVinylSd 3.459e-02 2.826e-02 1.224 0.221213   
## Exterior1stWd Sdng 1.615e-02 2.797e-02 0.577 0.563718   
## Exterior1stWdShing 1.675e-02 3.501e-02 0.479 0.632356   
## FoundationCBlock 1.501e-02 1.381e-02 1.087 0.277070   
## FoundationPConc 3.398e-02 1.520e-02 2.236 0.025536 \*   
## FoundationSlab -2.946e-02 3.334e-02 -0.884 0.377025   
## FoundationStone 1.042e-01 4.686e-02 2.223 0.026398 \*   
## FoundationWood -1.245e-01 6.572e-02 -1.894 0.058379 .   
## BsmtFinSF1 1.476e-04 1.820e-05 8.110 1.15e-15 \*\*\*  
## BsmtFinSF2 1.105e-04 2.459e-05 4.491 7.70e-06 \*\*\*  
## BsmtUnfSF 7.089e-05 1.690e-05 4.195 2.91e-05 \*\*\*  
## HeatingGasA 1.403e-01 1.111e-01 1.263 0.206671   
## HeatingGasW 2.057e-01 1.141e-01 1.803 0.071684 .   
## HeatingGrav -8.994e-03 1.196e-01 -0.075 0.940071   
## HeatingOthW 1.145e-01 1.375e-01 0.833 0.405225   
## HeatingWall 2.384e-01 1.269e-01 1.879 0.060494 .   
## HeatingQCFa -2.591e-02 2.044e-02 -1.267 0.205203   
## HeatingQCGd -2.052e-02 9.226e-03 -2.225 0.026278 \*   
## HeatingQCPo -6.339e-02 1.160e-01 -0.546 0.584938   
## HeatingQCTA -3.158e-02 9.116e-03 -3.464 0.000549 \*\*\*  
## CentralAirY 6.079e-02 1.633e-02 3.723 0.000205 \*\*\*  
## X1stFlrSF 2.543e-04 2.220e-05 11.455 < 2e-16 \*\*\*  
## X2ndFlrSF 2.224e-04 1.699e-05 13.091 < 2e-16 \*\*\*  
## LowQualFinSF 1.556e-04 6.533e-05 2.382 0.017368 \*   
## BsmtFullBath 2.402e-02 8.051e-03 2.983 0.002906 \*\*   
## FullBath 1.455e-02 9.621e-03 1.512 0.130711   
## HalfBath 1.905e-02 8.993e-03 2.119 0.034307 \*   
## KitchenAbvGr -5.192e-02 2.400e-02 -2.164 0.030667 \*   
## KitchenQualFa -5.996e-02 2.621e-02 -2.287 0.022338 \*   
## KitchenQualGd -6.577e-02 1.412e-02 -4.657 3.53e-06 \*\*\*  
## KitchenQualTA -6.474e-02 1.637e-02 -3.954 8.10e-05 \*\*\*  
## TotRmsAbvGrd 5.611e-03 3.802e-03 1.476 0.140297   
## FunctionalMaj2 -2.158e-01 5.848e-02 -3.689 0.000234 \*\*\*  
## FunctionalMin1 3.549e-02 3.675e-02 0.966 0.334395   
## FunctionalMin2 3.598e-02 3.620e-02 0.994 0.320527   
## FunctionalMod -7.274e-02 4.348e-02 -1.673 0.094580 .   
## FunctionalSev -3.732e-01 1.203e-01 -3.101 0.001970 \*\*   
## FunctionalTyp 7.502e-02 3.135e-02 2.393 0.016857 \*   
## Fireplaces 2.457e-02 5.926e-03 4.146 3.60e-05 \*\*\*  
## GarageCars 2.742e-02 9.630e-03 2.847 0.004480 \*\*   
## GarageArea 1.140e-04 3.272e-05 3.483 0.000512 \*\*\*  
## WoodDeckSF 9.159e-05 2.585e-05 3.544 0.000408 \*\*\*  
## OpenPorchSF 7.015e-05 5.060e-05 1.386 0.165894   
## EnclosedPorch 1.373e-04 5.472e-05 2.509 0.012239 \*   
## X3SsnPorch 1.779e-04 1.008e-04 1.765 0.077835 .   
## ScreenPorch 2.752e-04 5.460e-05 5.041 5.29e-07 \*\*\*  
## PoolArea 1.330e-04 7.846e-05 1.696 0.090177 .   
## SaleTypeCon 8.705e-02 8.014e-02 1.086 0.277587   
## SaleTypeConLD 1.352e-01 4.299e-02 3.145 0.001700 \*\*   
## SaleTypeConLI -3.642e-02 5.201e-02 -0.700 0.483935   
## SaleTypeConLw 2.030e-02 5.324e-02 0.381 0.703111   
## SaleTypeCWD 9.584e-02 5.817e-02 1.648 0.099664 .   
## SaleTypeNew 1.324e-01 6.985e-02 1.896 0.058146 .   
## SaleTypeOth 7.144e-02 6.553e-02 1.090 0.275787   
## SaleTypeWD -1.502e-02 1.873e-02 -0.802 0.422746   
## SaleConditionAdjLand 8.919e-02 6.068e-02 1.470 0.141848   
## SaleConditionAlloca 6.272e-02 3.785e-02 1.657 0.097722 .   
## SaleConditionFamily 1.688e-02 2.748e-02 0.614 0.539317   
## SaleConditionNormal 7.027e-02 1.281e-02 5.484 4.99e-08 \*\*\*  
## SaleConditionPartial -2.679e-02 6.746e-02 -0.397 0.691372   
## ---  
## Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1  
##   
## Residual standard error: 0.1056 on 1313 degrees of freedom  
## Multiple R-squared: 0.9372, Adjusted R-squared: 0.9302   
## F-statistic: 134.1 on 146 and 1313 DF, p-value: < 2.2e-16

Stepwise Selection

# Perform stepwise selection using BIC  
log\_stepwise <- stepAIC(log\_all, direction = "both", k = log(nrow(train\_clean)), trace = 0)  
log\_stepwise

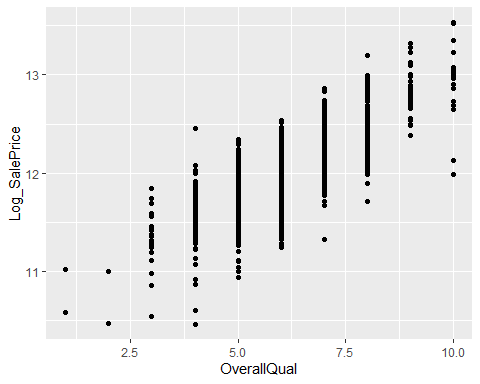
##   
## Call:  
## lm(formula = Log\_SalePrice ~ MSZoning + LotArea + LandSlope +   
## Condition2 + OverallQual + OverallCond + YearBuilt + YearRemodAdd +   
## RoofMatl + Foundation + BsmtFinSF1 + BsmtFinSF2 + BsmtUnfSF +   
## CentralAir + X1stFlrSF + X2ndFlrSF + LowQualFinSF + KitchenAbvGr +   
## KitchenQual + Functional + Fireplaces + GarageCars + GarageArea +   
## ScreenPorch + SaleCondition, data = train\_clean)  
##   
## Coefficients:  
## (Intercept) MSZoningFV MSZoningRH   
## 1.947e+00 4.069e-01 3.736e-01   
## MSZoningRL MSZoningRM LotArea   
## 3.819e-01 2.899e-01 2.974e-06   
## LandSlopeMod LandSlopeSev Condition2Feedr   
## 4.190e-02 -1.446e-01 1.240e-01   
## Condition2Norm Condition2PosA Condition2PosN   
## 9.190e-02 1.898e-01 -9.177e-01   
## Condition2RRAe Condition2RRAn Condition2RRNn   
## -2.565e-02 -4.990e-02 7.682e-02   
## OverallQual OverallCond YearBuilt   
## 5.993e-02 4.085e-02 1.757e-03   
## YearRemodAdd RoofMatlCompShg RoofMatlMembran   
## 8.433e-04 3.057e+00 3.441e+00   
## RoofMatlMetal RoofMatlRoll RoofMatlTar&Grv   
## 3.354e+00 3.042e+00 3.086e+00   
## RoofMatlWdShake RoofMatlWdShngl FoundationCBlock   
## 3.067e+00 3.085e+00 -2.043e-02   
## FoundationPConc FoundationSlab FoundationStone   
## 3.504e-02 -1.770e-03 1.098e-01   
## FoundationWood BsmtFinSF1 BsmtFinSF2   
## -1.326e-01 2.013e-04 1.660e-04   
## BsmtUnfSF CentralAirY X1stFlrSF   
## 1.040e-04 5.913e-02 2.776e-04   
## X2ndFlrSF LowQualFinSF KitchenAbvGr   
## 2.686e-04 1.782e-04 -5.835e-02   
## KitchenQualFa KitchenQualGd KitchenQualTA   
## -9.382e-02 -7.497e-02 -9.049e-02   
## FunctionalMaj2 FunctionalMin1 FunctionalMin2   
## -1.300e-01 6.317e-02 6.916e-02   
## FunctionalMod FunctionalSev FunctionalTyp   
## -2.410e-02 -3.565e-01 1.026e-01   
## Fireplaces GarageCars GarageArea   
## 3.373e-02 3.223e-02 1.125e-04   
## ScreenPorch SaleConditionAdjLand SaleConditionAlloca   
## 2.092e-04 4.002e-02 6.439e-02   
## SaleConditionFamily SaleConditionNormal SaleConditionPartial   
## 1.669e-02 7.445e-02 1.411e-01

summary(log\_stepwise)

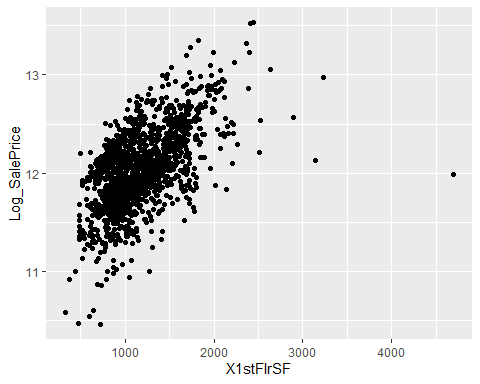
##   
## Call:  
## lm(formula = Log\_SalePrice ~ MSZoning + LotArea + LandSlope +   
## Condition2 + OverallQual + OverallCond + YearBuilt + YearRemodAdd +   
## RoofMatl + Foundation + BsmtFinSF1 + BsmtFinSF2 + BsmtUnfSF +   
## CentralAir + X1stFlrSF + X2ndFlrSF + LowQualFinSF + KitchenAbvGr +   
## KitchenQual + Functional + Fireplaces + GarageCars + GarageArea +   
## ScreenPorch + SaleCondition, data = train\_clean)  
##   
## Residuals:  
## Min 1Q Median 3Q Max   
## -0.82415 -0.05900 0.00302 0.06501 0.82415   
##   
## Coefficients:  
## Estimate Std. Error t value Pr(>|t|)   
## (Intercept) 1.947e+00 5.492e-01 3.545 0.000406 \*\*\*  
## MSZoningFV 4.069e-01 4.289e-02 9.488 < 2e-16 \*\*\*  
## MSZoningRH 3.736e-01 4.888e-02 7.642 3.94e-14 \*\*\*  
## MSZoningRL 3.819e-01 3.993e-02 9.563 < 2e-16 \*\*\*  
## MSZoningRM 2.899e-01 4.020e-02 7.211 9.03e-13 \*\*\*  
## LotArea 2.974e-06 4.222e-07 7.043 2.93e-12 \*\*\*  
## LandSlopeMod 4.190e-02 1.552e-02 2.700 0.007025 \*\*   
## LandSlopeSev -1.446e-01 4.621e-02 -3.129 0.001787 \*\*   
## Condition2Feedr 1.240e-01 9.859e-02 1.258 0.208643   
## Condition2Norm 9.190e-02 8.530e-02 1.077 0.281529   
## Condition2PosA 1.898e-01 1.470e-01 1.291 0.196929   
## Condition2PosN -9.177e-01 1.213e-01 -7.567 6.89e-14 \*\*\*  
## Condition2RRAe -2.565e-02 1.441e-01 -0.178 0.858752   
## Condition2RRAn -4.990e-02 1.442e-01 -0.346 0.729344   
## Condition2RRNn 7.682e-02 1.202e-01 0.639 0.522748   
## OverallQual 5.993e-02 4.293e-03 13.960 < 2e-16 \*\*\*  
## OverallCond 4.085e-02 3.734e-03 10.940 < 2e-16 \*\*\*  
## YearBuilt 1.757e-03 2.293e-04 7.662 3.40e-14 \*\*\*  
## YearRemodAdd 8.433e-04 2.413e-04 3.494 0.000490 \*\*\*  
## RoofMatlCompShg 3.057e+00 1.333e-01 22.944 < 2e-16 \*\*\*  
## RoofMatlMembran 3.441e+00 1.901e-01 18.096 < 2e-16 \*\*\*  
## RoofMatlMetal 3.354e+00 1.856e-01 18.069 < 2e-16 \*\*\*  
## RoofMatlRoll 3.042e+00 1.787e-01 17.023 < 2e-16 \*\*\*  
## RoofMatlTar&Grv 3.086e+00 1.390e-01 22.201 < 2e-16 \*\*\*  
## RoofMatlWdShake 3.067e+00 1.444e-01 21.241 < 2e-16 \*\*\*  
## RoofMatlWdShngl 3.085e+00 1.396e-01 22.097 < 2e-16 \*\*\*  
## FoundationCBlock -2.043e-02 1.360e-02 -1.502 0.133349   
## FoundationPConc 3.504e-02 1.589e-02 2.205 0.027606 \*   
## FoundationSlab -1.770e-03 3.288e-02 -0.054 0.957084   
## FoundationStone 1.098e-01 4.968e-02 2.209 0.027333 \*   
## FoundationWood -1.326e-01 6.996e-02 -1.896 0.058174 .   
## BsmtFinSF1 2.013e-04 1.737e-05 11.592 < 2e-16 \*\*\*  
## BsmtFinSF2 1.660e-04 2.505e-05 6.627 4.87e-11 \*\*\*  
## BsmtUnfSF 1.040e-04 1.718e-05 6.054 1.81e-09 \*\*\*  
## CentralAirY 5.913e-02 1.531e-02 3.861 0.000118 \*\*\*  
## X1stFlrSF 2.776e-04 1.891e-05 14.684 < 2e-16 \*\*\*  
## X2ndFlrSF 2.686e-04 9.516e-06 28.222 < 2e-16 \*\*\*  
## LowQualFinSF 1.782e-04 6.644e-05 2.683 0.007385 \*\*   
## KitchenAbvGr -5.835e-02 1.692e-02 -3.448 0.000582 \*\*\*  
## KitchenQualFa -9.382e-02 2.696e-02 -3.480 0.000516 \*\*\*  
## KitchenQualGd -7.497e-02 1.421e-02 -5.274 1.54e-07 \*\*\*  
## KitchenQualTA -9.049e-02 1.672e-02 -5.413 7.30e-08 \*\*\*  
## FunctionalMaj2 -1.300e-01 6.193e-02 -2.099 0.036012 \*   
## FunctionalMin1 6.317e-02 3.850e-02 1.641 0.101081   
## FunctionalMin2 6.916e-02 3.797e-02 1.821 0.068760 .   
## FunctionalMod -2.410e-02 4.538e-02 -0.531 0.595390   
## FunctionalSev -3.565e-01 1.288e-01 -2.768 0.005710 \*\*   
## FunctionalTyp 1.026e-01 3.266e-02 3.143 0.001709 \*\*   
## Fireplaces 3.373e-02 6.046e-03 5.579 2.89e-08 \*\*\*  
## GarageCars 3.223e-02 9.868e-03 3.266 0.001115 \*\*   
## GarageArea 1.125e-04 3.326e-05 3.383 0.000736 \*\*\*  
## ScreenPorch 2.092e-04 5.716e-05 3.659 0.000263 \*\*\*  
## SaleConditionAdjLand 4.002e-02 6.135e-02 0.652 0.514277   
## SaleConditionAlloca 6.439e-02 3.806e-02 1.692 0.090878 .   
## SaleConditionFamily 1.669e-02 2.897e-02 0.576 0.564480   
## SaleConditionNormal 7.445e-02 1.268e-02 5.870 5.42e-09 \*\*\*  
## SaleConditionPartial 1.411e-01 1.742e-02 8.097 1.22e-15 \*\*\*  
## ---  
## Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1  
##   
## Residual standard error: 0.1166 on 1403 degrees of freedom  
## Multiple R-squared: 0.9181, Adjusted R-squared: 0.9148   
## F-statistic: 280.8 on 56 and 1403 DF, p-value: < 2.2e-16

**Checking Assumptions!**

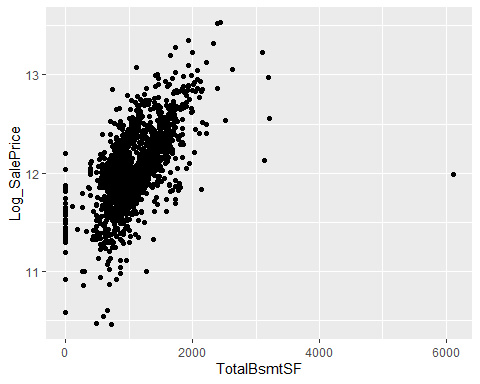
##CHECKING ASSUMPTIONS OF EACH MODEL:  
#We can see that a good amount of the variables we've chosen are linearly related  
# to log\_SalePrice  
#Distribution of Overall Qual vs. Log\_SalePrice the means increase linearly:  
ggplot(data = train\_clean, aes(x = OverallQual, y = Log\_SalePrice)) +  
 geom\_point()



#Distribution of X1stFlrSF vs. Log\_SalePrice shows the linear correlation:  
ggplot(data = train\_clean, aes(x = X1stFlrSF, y = Log\_SalePrice)) +  
 geom\_point()



#Distribution of TotalBsmtSF vs. Log\_SalePrice:  
ggplot(data = train\_clean, aes(x = TotalBsmtSF, y = Log\_SalePrice)) +  
 geom\_point()



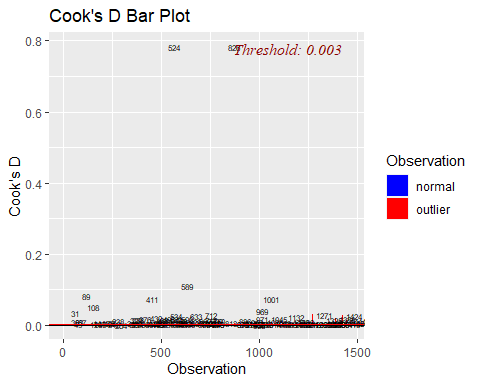
Here we see how the variables are related linearly.

##CHECKING VIF FOR MULTICOLLINEARITY:  
# Calculate VIF using our first model (forward)  
vif\_values <- vif(log\_forward)  
# Print VIF values  
print(vif\_values)

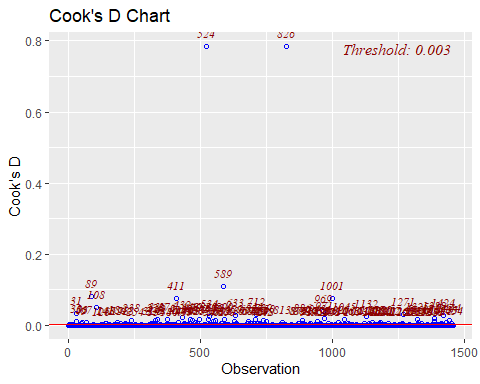
## GVIF Df GVIF^(1/(2\*Df))  
## OverallQual 4.509738 1 2.123614  
## Neighborhood 29583.098697 24 1.239215  
## GrLivArea 6.456258 1 2.540917  
## GarageCars 6.713012 1 2.590948  
## OverallCond 2.107146 1 1.451601  
## BsmtFullBath 2.258345 1 1.502779  
## RoofMatl 6.744836 7 1.146073  
## TotalBsmtSF 7.100094 1 2.664600  
## YearBuilt 10.800238 1 3.286372  
## BldgType 18.242098 4 1.437588  
## Condition2 3.312698 7 1.089321  
## MSZoning 41.212701 4 1.591765  
## BsmtFinSF1 3.015461 1 1.736508  
## SaleCondition 111.117153 5 1.601689  
## Functional 2.722810 6 1.087055  
## LotArea 2.446549 1 1.564145  
## CentralAir 2.087894 1 1.444955  
## KitchenQual 5.438793 3 1.326123  
## Condition1 5.785656 8 1.115956  
## Fireplaces 1.891535 1 1.375331  
## Heating 3.345264 5 1.128348  
## ScreenPorch 1.193337 1 1.092400  
## SaleType 104.774797 8 1.337415  
## Exterior1st 47.637912 14 1.147960  
## WoodDeckSF 1.363009 1 1.167480  
## YearRemodAdd 3.072281 1 1.752792  
## GarageArea 6.358661 1 2.521639  
## Foundation 16.701179 5 1.325180  
## LandSlope 3.804207 2 1.396581  
## EnclosedPorch 1.447600 1 1.203163  
## HeatingQC 4.533722 4 1.207972  
## LotConfig 1.813242 4 1.077226  
## BsmtFinSF2 1.421127 1 1.192110  
## Street 1.361650 1 1.166897  
## X3SsnPorch 1.140413 1 1.067901  
## KitchenAbvGr 3.521002 1 1.876433  
## PoolArea 1.287709 1 1.134773  
## HalfBath 2.593240 1 1.610354  
## FullBath 3.606283 1 1.899021  
## X1stFlrSF 7.618886 1 2.760233  
## LandContour 3.441721 3 1.228747

There are a few variables with high multicollinearity (Neighborhood, MSZoning and Sale Condition) we will leave these for our forward model. While brainstorming for our custom model these will be the specific variables we will leave out.

# Plot Cook's distance  
ols\_plot\_cooksd\_bar(log\_forward) #We can see that there are only two observations



# with a Cook's D greater than 0.2. The rest fall below it. Since there are 1400+  
# observations we can leave them in.   
ols\_plot\_cooksd\_chart(log\_forward)



We can see that there are only two observations with a Cook’s D greater than 0.2. The rest fall below it. Since there are 1400+ observations we can leave them in.

#CHECKING FOR HETEROSCEDASTICITY:  
bptest(log\_forward)

##   
## studentized Breusch-Pagan test  
##   
## data: log\_forward  
## BP = 591.75, df = 137, p-value < 2.2e-16

bptest(log\_backward)

##   
## studentized Breusch-Pagan test  
##   
## data: log\_backward  
## BP = 602.88, df = 146, p-value < 2.2e-16

bptest(log\_stepwise)

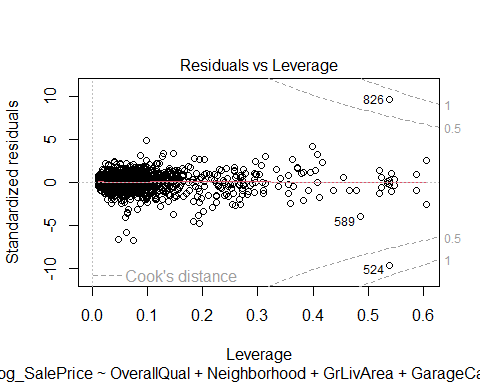
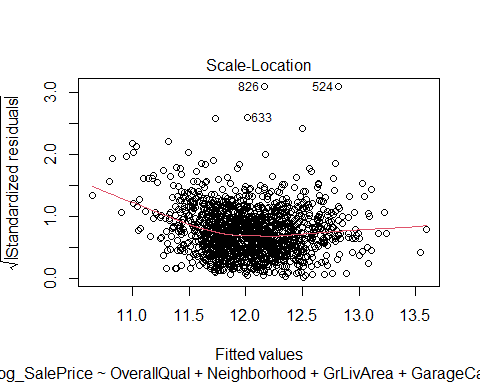
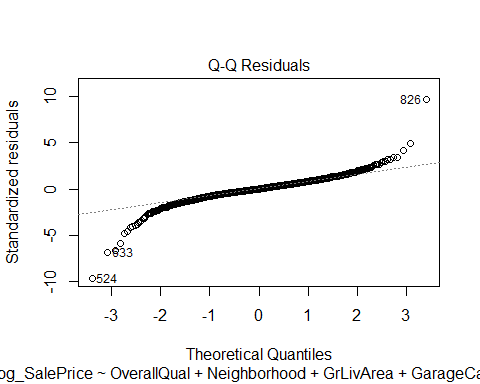
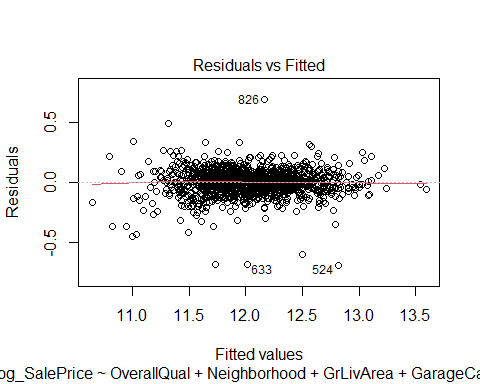
##   
## studentized Breusch-Pagan test  
##   
## data: log\_stepwise  
## BP = 688.74, df = 56, p-value < 2.2e-16

#Each p-value < 2.2e-16

When running the Studentized Breusch-Pagan test, our respective p-value for each of the models is < 2.2e-16. This extremely small p-value provides evidence against Heteroscedasticity, meaning, the variance across variables is constant.

plot(log\_forward)

## Warning: not plotting observations with leverage one:  
## 121, 272, 326, 584, 667, 1004, 1012, 1188, 1231, 1276, 1299, 1322, 1371



Our residual plot and our QQ plots both look to fulfill our assumptions.

NOW… Let’s build our predictions. We will deal with simply the log\_forward, log\_backward, and log\_stepwise first.

#MAKING PREDICTIONS ON THE TEST DATASET  
# Predict Log\_SalePrice using the forward-selected model  
forward\_predictions <- predict(log\_forward, newdata = test\_clean)  
  
# Predict Log\_SalePrice using the backward-selected model  
backward\_predictions <- predict(log\_backward, newdata = test\_clean)  
  
# Predict Log\_SalePrice using the stepwise-selected model  
stepwise\_predictions <- predict(log\_stepwise, newdata = test\_clean)  
  
# Create a dataframe with predictions from each model  
predictions\_df <- data.frame(  
 Forward\_Predictions = forward\_predictions,  
 Backward\_Predictions = backward\_predictions,  
 Stepwise\_Predictions = stepwise\_predictions  
)  
# Take the exponential of each variable to back-transform  
predictions\_df <- exp(predictions\_df)  
# Rename the columns by adding a string to indicate they represent SalePrice  
colnames(predictions\_df) <- paste0(colnames(predictions\_df), "\_SalePrice")  
View(predictions\_df)

We can see when viewing the dataframe we have all our predicted values for the Test\_clean dataframe.

**Analysing our Performance (Cross Validation**)

Forward

##DEFINING FORWARD MODEL  
formula\_forward <- Log\_SalePrice ~ OverallQual + Neighborhood + GrLivArea + GarageCars + OverallCond + BsmtFullBath + RoofMatl + TotalBsmtSF + YearBuilt + BldgType + Condition2 + MSZoning + BsmtFinSF1 + SaleCondition + Functional + LotArea + CentralAir + KitchenQual + Condition1 + Fireplaces + Heating + ScreenPorch + SaleType + Exterior1st + WoodDeckSF + YearRemodAdd + GarageArea + Foundation + LandSlope + EnclosedPorch + HeatingQC + LotConfig + BsmtFinSF2 + Street + X3SsnPorch + KitchenAbvGr + PoolArea + HalfBath + FullBath + X1stFlrSF + LandContour  
# Train your model with 10-fold cross-validation  
model\_forward <- train(  
 formula\_forward,  
 data = train\_clean,  
 method = "lm",  
 trControl = trainControl(method = "cv", number = 10)  
)

## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases

# Get cross-validated prediction errors  
cv\_press\_forward <- model\_forward$results$RMSE  
# [1] 0.1804603

Backward

##DO THE SAME FOR BACKWARD:  
# Define your model formula  
formula\_backward <- Log\_SalePrice ~ MSZoning + LotArea + Street + LandContour +   
 Utilities + LotConfig + LandSlope + Neighborhood + Condition1 +   
 Condition2 + BldgType + OverallQual + OverallCond + YearBuilt +   
 YearRemodAdd + RoofStyle + RoofMatl + Exterior1st + Foundation +   
 BsmtFinSF1 + BsmtFinSF2 + BsmtUnfSF + Heating + HeatingQC +   
 CentralAir + X1stFlrSF + X2ndFlrSF + LowQualFinSF + BsmtFullBath +   
 FullBath + HalfBath + KitchenAbvGr + KitchenQual + TotRmsAbvGrd +   
 Functional + Fireplaces + GarageCars + GarageArea + WoodDeckSF +   
 OpenPorchSF + EnclosedPorch + X3SsnPorch + ScreenPorch +   
 PoolArea + SaleType + SaleCondition  
# Train your model with 10-fold cross-validation  
model\_backward <- train(  
 formula\_backward,  
 data = train\_clean,  
 method = "lm",  
 trControl = trainControl(method = "cv", number = 10)  
)

## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases

# Get cross-validated prediction errors  
cv\_press\_backward <- model\_backward$results$RMSE  
# [1] 0.1798864

Stepwise

##DO THE SAME FOR STEPWISE:  
# Define your model formula  
formula\_stepwise <- Log\_SalePrice ~ MSZoning + LotArea + LandSlope +   
 Condition2 + OverallQual + OverallCond + YearBuilt + YearRemodAdd +   
 RoofMatl + Foundation + BsmtFinSF1 + BsmtFinSF2 + BsmtUnfSF +   
 CentralAir + X1stFlrSF + X2ndFlrSF + LowQualFinSF + KitchenAbvGr +   
 KitchenQual + Functional + Fireplaces + GarageCars + GarageArea +   
 ScreenPorch + SaleCondition  
# Train your model with 10-fold cross-validation  
model\_stepwise <- train(  
 formula\_stepwise,  
 data = train\_clean,  
 method = "lm",  
 trControl = trainControl(method = "cv", number = 10)  
)

## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases  
  
## Warning in predict.lm(modelFit, newdata): prediction from rank-deficient fit;  
## attr(\*, "non-estim") has doubtful cases

# Get cross-validated prediction errors  
cv\_press\_stepwise <- model\_stepwise$results$RMSE  
# [1] 0.2003931

After all of our analysis for CV PRESS we see that our best performing model is the first one (Forward\_Selection).

**Creating/Submitting Dataframes**

Here we will have to create dataframes with the ID’s from test\_clean with the new predicted values added in.

#BUILDING THE SUBMISSION DATAFRAMES:  
submission\_for = data.frame(  
 ID = test\_df$Id,  
 SalePrice = predictions\_df$Forward\_Predictions\_SalePrice)  
  
submission\_back = data.frame(  
 ID = test\_df$Id,  
 SalePrice = predictions\_df$Backward\_Predictions\_SalePrice)  
  
submission\_step = data.frame(  
 ID = test\_df$Id,  
 SalePrice = predictions\_df$Stepwise\_Predictions\_SalePrice)

Next and final step is to create the CSV for each submission so we can obtain a Kaggle score.

#SAVING THE DATAFRAMES TO CSV FOR UPLOADING TO KAGGLE  
# Exporting submission\_for dataframe  
write.csv(submission\_for, file = "submission\_for.csv", row.names = FALSE)  
  
# Exporting submission\_back dataframe  
write.csv(submission\_back, file = "submission\_back.csv", row.names = FALSE)  
  
# Exporting submission\_step dataframe  
write.csv(submission\_step, file = "submission\_step.csv", row.names = FALSE)