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February 4, 2022

1 Multicollinearity of Features - Lab

1.1 Introduction

In this lab, you'll identify multicollinearity in the Ames Housing dataset.

1.2 Objectives

You will be able to: * Create a scatter matrix and correlation matrix * Assess Intpret the output of a correlation matrix * Identify if variables are exhibiting collinearity * Decide how to address the collinearity in the data set

1.3 Correlation matrix for the Ames Housing data

1.3.1 Import data

Let's reimport the Ames Housing data assign the numeric variables we want to keep to numeric_vars.

```
[2]: import pandas as pd
    import numpy as np
    import matplotlib.pyplot as plt
    %matplotlib inline
    pd.options.display.max_columns = 999
    pd.options.display.max_rows = 999
    ames = pd.read_csv('ames.csv')
    numeric_vars = ['LotFrontage', 'LotArea', 'BsmtFinSF1', 'BsmtFinSF2', |
     'TotalBsmtSF', '1stFlrSF', '2ndFlrSF', 'LowQualFinSF',

¬'GrLivArea'.
                    'BsmtFullBath', 'BsmtHalfBath', 'FullBath', 'HalfBath',
      'KitchenAbvGr', 'TotRmsAbvGrd', 'Fireplaces', 'GarageYrBlt',

    GarageCars¹,

                    'GarageArea', 'WoodDeckSF', 'OpenPorchSF', 'EnclosedPorch',
```

```
'ScreenPorch', 'PoolArea']
```

1.3.2 Create processed

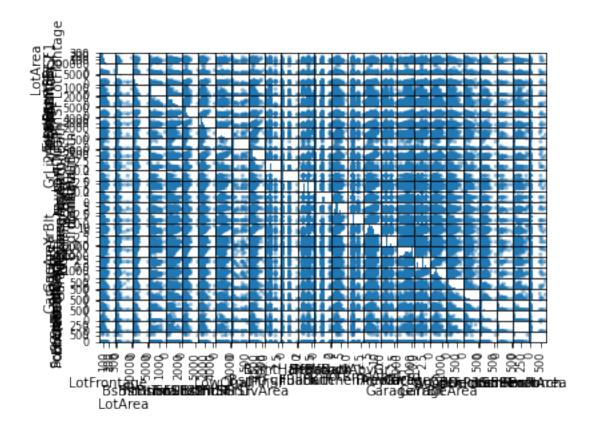
Create a new dataframe named ames_preprocessed that contains only the features in numeric_vars.

```
[3]: # create single dataframe called ames_preprocessed

ames_preprocessed = ames[numeric_vars]
```

1.4 Scatter matrix

Create the scatter matrix for the Ames Housing data. This takes a few minutes to load!



The scatter matrix took a while to load and is hard to read. Run the code below to see if adjusting some of the visualization settings helps.

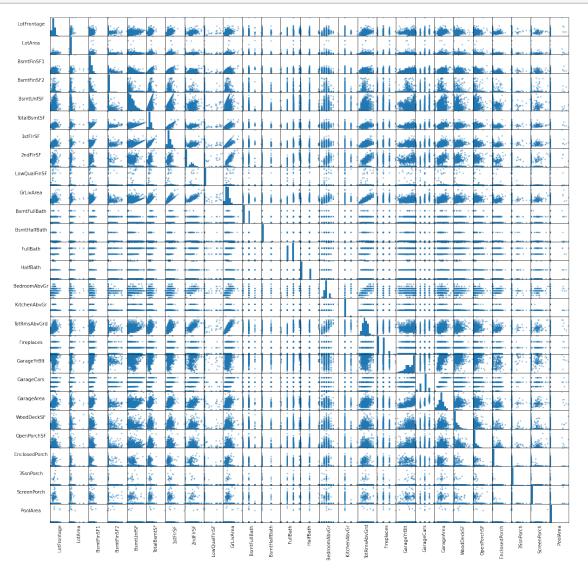
```
[7]: sm = pd.plotting.scatter_matrix(ames_preprocessed, figsize=[20, 20]);

# Rotates the text
[s.xaxis.label.set_rotation(90) for s in sm.reshape(-1)]
[s.yaxis.label.set_rotation(0) for s in sm.reshape(-1)]

#May need to offset label when rotating to prevent overlap of figure
[s.get_yaxis().set_label_coords(-1,0.5) for s in sm.reshape(-1)]

#Hide all ticks
[s.set_xticks(()) for s in sm.reshape(-1)]
[s.set_yticks(()) for s in sm.reshape(-1)]

plt.show()
```

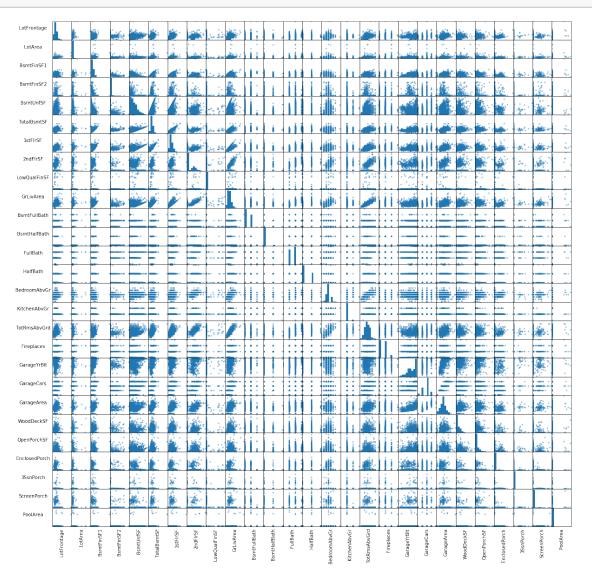


```
[8]: #__Solution__
sm = pd.plotting.scatter_matrix(ames_preprocessed, figsize=[20, 20]);

# Rotates the text
[s.xaxis.label.set_rotation(90) for s in sm.reshape(-1)]
[s.yaxis.label.set_rotation(0) for s in sm.reshape(-1)]

#May need to offset label when rotating to prevent overlap of figure
[s.get_yaxis().set_label_coords(-1,0.5) for s in sm.reshape(-1)]

#Hide all ticks
[s.set_xticks(()) for s in sm.reshape(-1)]
[s.set_yticks(()) for s in sm.reshape(-1)]
```



The enhanced plot demonstrates that with larger datasets, scatter matricies become less useful. Through careful examination of the matrix it's clear that TotRmsAbvGrd seems correlated with GrLivArea, but how easy to use would this matrix if a dataset has hundreds or thousands of variables? Also visual approach to finding correlation cannot be automated, so a numeric approach is a good next step.

1.5 Correlation matrix

Next, create and look at the correlation matrix:

[4]: ames_preprocessed.corr()

| | LotFrontage | ${	t LotArea}$ | BsmtFinSF1 | BsmtFinSF2 | ${\tt BsmtUnfSF}$ | \ |
|----------------------|--|--|--|--|--|--|
| LotFrontage | | 0.426095 | 0.233633 | 0.049900 | 0.132644 | |
| LotArea | 0.426095 | 1.000000 | 0.214103 | 0.111170 | -0.002618 | |
| BsmtFinSF1 | 0.233633 | 0.214103 | 1.000000 | -0.050117 | -0.495251 | |
| BsmtFinSF2 | 0.049900 | 0.111170 | -0.050117 | 1.000000 | -0.209294 | |
| BsmtUnfSF | 0.132644 | -0.002618 | -0.495251 | -0.209294 | 1.000000 | |
| TotalBsmtSF | 0.392075 | 0.260833 | 0.522396 | 0.104810 | 0.415360 | |
| 1stFlrSF | 0.457181 | 0.299475 | 0.445863 | 0.097117 | 0.317987 | |
| 2ndFlrSF | 0.080177 | 0.050986 | -0.137079 | -0.099260 | 0.004469 | |
| ${\tt LowQualFinSF}$ | 0.038469 | 0.004779 | -0.064503 | 0.014807 | 0.028167 | |
| GrLivArea | 0.402797 | 0.263116 | 0.208171 | -0.009640 | 0.240257 | |
| ${\tt BsmtFullBath}$ | 0.100949 | 0.158155 | 0.649212 | 0.158678 | -0.422900 | |
| ${\tt BsmtHalfBath}$ | -0.007234 | 0.048046 | 0.067418 | 0.070948 | -0.095804 | |
| FullBath | 0.198769 | 0.126031 | 0.058543 | -0.076444 | 0.288886 | |
| HalfBath | 0.053532 | 0.014259 | 0.004262 | -0.032148 | -0.041118 | |
| ${\tt BedroomAbvGr}$ | 0.263170 | 0.119690 | -0.107355 | -0.015728 | 0.166643 | |
| KitchenAbvGr | -0.006069 | -0.017784 | -0.081007 | -0.040751 | 0.030086 | |
| ${\tt TotRmsAbvGrd}$ | 0.352096 | 0.190015 | 0.044316 | -0.035227 | 0.250647 | |
| Fireplaces | 0.266639 | 0.271364 | 0.260011 | 0.046921 | 0.051575 | |
| GarageYrBlt | 0.070250 | -0.024947 | 0.153484 | -0.088011 | 0.190708 | |
| GarageCars | 0.285691 | 0.154871 | 0.224054 | -0.038264 | 0.214175 | |
| GarageArea | 0.344997 | 0.180403 | 0.296970 | -0.018227 | 0.183303 | |
| WoodDeckSF | 0.088521 | 0.171698 | 0.204306 | 0.067898 | -0.005316 | |
| OpenPorchSF | 0.151972 | 0.084774 | 0.111761 | 0.003093 | 0.129005 | |
| EnclosedPorch | 0.010700 | -0.018340 | -0.102303 | 0.036543 | -0.002538 | |
| 3SsnPorch | 0.070029 | 0.020423 | 0.026451 | -0.029993 | 0.020764 | |
| ScreenPorch | 0.041383 | 0.043160 | 0.062021 | 0.088871 | -0.012579 | |
| PoolArea | 0.206167 | 0.077672 | 0.140491 | 0.041709 | -0.035092 | |
| | | | | | | |
| | ${\tt TotalBsmtSF}$ | 1stFlrSF | 2ndFlrSF I | LowQualFinSF | ${\tt GrLivArea}$ | \ |
| LotFrontage | 0.392075 | 0.457181 | 0.080177 | 0.038469 | 0.402797 | |
| LotArea | 0.260833 | 0.299475 | 0.050986 | 0.004779 | 0.263116 | |
| BsmtFinSF1 | 0.522396 | 0.445863 | -0.137079 | -0.064503 | 0.208171 | |
| | LotArea BsmtFinSF1 BsmtFinSF2 BsmtUnfSF TotalBsmtSF 1stFlrSF 2ndFlrSF LowQualFinSF GrLivArea BsmtFullBath BsmtHalfBath FullBath HalfBath HalfBath HalfBath GrichenAbvGr TotRmsAbvGrd Fireplaces GarageYrBlt GarageCars GarageArea WoodDeckSF OpenPorchSF EnclosedPorch 3SsnPorch ScreenPorch PoolArea LotFrontage LotArea | LotFrontage 1.000000 LotArea 0.426095 BsmtFinSF1 0.233633 BsmtFinSF2 0.049900 BsmtUnfSF 0.132644 TotalBsmtSF 0.392075 1stFlrSF 0.457181 2ndFlrSF 0.080177 LowQualFinSF 0.038469 GrLivArea 0.402797 BsmtFullBath 0.100949 BsmtHalfBath -0.007234 FullBath 0.198769 HalfBath 0.053532 BedroomAbvGr 0.263170 KitchenAbvGr -0.006069 TotRmsAbvGrd 0.352096 Fireplaces 0.266639 GarageYrBlt 0.070250 GarageCars 0.285691 GarageArea 0.344997 WoodDeckSF 0.088521 OpenPorchSF 0.151972 EnclosedPorch 0.010700 3SsnPorch 0.070029 ScreenPorch 0.041383 PoolArea TotalBsmtSF LotFrontage 0.392075 LotArea 0.260833 | LotFrontage 1.000000 0.426095 LotArea 0.426095 1.000000 BsmtFinSF1 0.233633 0.214103 BsmtFinSF2 0.049900 0.111170 BsmtUnfSF 0.132644 -0.002618 TotalBsmtSF 0.392075 0.260833 1stFlrSF 0.457181 0.299475 2ndFlrSF 0.080177 0.050986 LowQualFinSF 0.038469 0.004779 GrLivArea 0.402797 0.263116 BsmtFullBath 0.100949 0.158155 BsmtHalfBath 0.100949 0.158155 BsmtHalfBath 0.198769 0.126031 HalfBath 0.053532 0.014259 BedroomAbvGr 0.263170 0.119690 KitchenAbvGr -0.006069 -0.017784 TotRmsAbvGrd 0.352096 0.190015 Fireplaces 0.266639 0.271364 GarageYrBlt 0.070250 -0.024947 GarageCars 0.285691 0.154871 GarageArea 0.344997 0.180403 WoodDeckSF 0.088521 0.171698 OpenPorchSF 0.151972 0.084774 EnclosedPorch 0.010700 -0.018340 3SsnPorch 0.070029 0.020423 ScreenPorch 0.041383 0.043160 PoolArea 0.2906167 0.077672 TotalBsmtSF 1stFlrSF LotFrontage 0.392075 0.457181 LotArea 0.260833 0.299475 | LotFrontage 1.000000 0.426095 0.233633 LotArea 0.426095 1.000000 0.214103 BsmtFinSF1 0.233633 0.214103 1.000000 BsmtFinSF2 0.049900 0.111170 -0.050117 BsmtUnfSF 0.132644 -0.002618 -0.495251 TotalBsmtSF 0.392075 0.260833 0.522396 1stFlrSF 0.457181 0.299475 0.445863 2ndFlrSF 0.080177 0.050986 -0.137079 LowQualFinSF 0.038469 0.004779 -0.064503 GrLivArea 0.402797 0.263116 0.208171 BsmtFullBath 0.100949 0.158155 0.649212 BsmtHalfBath -0.007234 0.048046 0.067418 FullBath 0.198769 0.126031 0.058543 HalfBath 0.053532 0.014259 0.004262 BedroomAbvGr 0.263170 0.119690 -0.107355 KitchenAbvGrd 0.3552096 0.190015 0.044316 Fireplaces 0.266639 0.271364 0.260011 GarageYrBlt 0.070250 -0.024947 0.153484 GarageCars 0.285691 0.154871 0.224054 GarageArea 0.344997 0.180403 0.296970 WoodDeckSF 0.088521 0.171698 0.204306 OpenPorchSF 0.151972 0.084774 0.111761 EnclosedPorch 0.070029 0.020423 0.026451 ScreenPorch 0.041383 0.043160 0.062021 PoolArea 0.260833 0.299475 0.050986 | LotFrontage 1.000000 0.426095 0.233633 0.049900 LotArea 0.426095 1.000000 0.214103 0.111170 BsmtFinSF1 0.233633 0.214103 1.000000 -0.050117 BsmtFinSF2 0.049900 0.111170 -0.050117 1.000000 BsmtUnfSF 0.132644 -0.002618 -0.495251 -0.209294 TotalBsmtSF 0.392075 0.260833 0.522396 0.104810 1stFlrSF 0.457181 0.299475 0.445863 0.097117 2ndFlrSF 0.080177 0.050986 -0.137079 -0.099260 LowQualFinSF 0.038469 0.004779 -0.064503 0.014807 GrLivArea 0.402797 0.263116 0.208171 -0.009640 BsmtFullBath 0.100949 0.158155 0.649212 0.158678 BsmtHalfBath 0.109496 0.126031 0.058543 -0.076444 HalfBath 0.053532 0.014259 0.004262 -0.032148 BedroomAbvGr 0.263170 | LotFrontage 1.00000 0.426095 0.233633 0.049900 0.132644 LotArea 0.426095 1.000000 0.214103 0.111170 -0.002618 BsmtFinSF1 0.233633 0.214103 1.000000 -0.50117 -0.495251 BsmtUnfSF 0.049900 0.111170 -0.050117 1.000000 -0.209294 BsmtUnfSF 0.132644 -0.002618 -0.495251 -0.209294 1.000000 TotalBsmtSF 0.392075 0.260833 0.522396 0.104810 0.415360 1stFirSF 0.467181 0.299475 0.445863 0.09717 0.317987 2ndFlrSF 0.080177 0.050986 -0.137079 -0.099260 0.004469 LowQualFinSF 0.038469 0.004779 -0.064503 0.014807 0.028167 GrLivArea 0.402797 0.263116 0.208171 -0.009260 0.042025 BsmtHalfBath 0.109499 0.158155 0.649212 0.158678 -0.422900 BsmtHalfBath 0.198769 0.126031 |

| BsmtFinSF2 | 0.104810 | 0.097117 -0.09 | 99260 | 0.014807 | -0.009640 | |
|----------------------|----------------------|----------------------|-----------|-----------|----------------------|---|
| BsmtUnfSF | 0.415360 | 0.317987 0.00 | 04469 | 0.028167 | 0.240257 | |
| TotalBsmtSF | 1.000000 | 0.819530 -0.17 | 74512 | -0.033245 | 0.454868 | |
| 1stFlrSF | 0.819530 | 1.000000 -0.20 |)2646 | -0.014241 | 0.566024 | |
| 2ndFlrSF | -0.174512 - | 0.202646 1.00 | 00000 | 0.063353 | 0.687501 | |
| LowQualFinSF | -0.033245 - | 0.014241 0.06 | 3353 | 1.000000 | 0.134683 | |
| GrLivArea | 0.454868 | 0.566024 0.68 | 37501 | 0.134683 | 1.000000 | |
| BsmtFullBath | 0.307351 | 0.244671 -0.16 | 59494 · | -0.047143 | 0.034836 | |
| BsmtHalfBath | -0.000315 | 0.001956 -0.02 | 23855 | -0.005842 | -0.018918 | |
| FullBath | 0.323722 | 0.380637 0.42 | 21378 | -0.000710 | 0.630012 | |
| HalfBath | -0.048804 - | 0.119916 0.60 | 9707 | -0.027080 | 0.415772 | |
| ${\tt BedroomAbvGr}$ | 0.050450 | 0.127401 0.50 | 02901 | 0.105607 | 0.521270 | |
| KitchenAbvGr | -0.068901 | 0.068101 0.09 | 59306 | 0.007522 | 0.100063 | |
| TotRmsAbvGrd | 0.285573 | 0.409516 0.63 | 16423 | 0.131185 | 0.825489 | |
| Fireplaces | 0.339519 | 0.410531 0.19 | 94561 | -0.021272 | 0.461679 | |
| GarageYrBlt | 0.322445 | 0.233449 0.07 | 70832 | -0.036363 | 0.231197 | |
| GarageCars | 0.434585 | 0.439317 0.18 | 33926 | -0.094480 | 0.467247 | |
| GarageArea | 0.486665 | 0.489782 0.13 | 38347 | -0.067601 | 0.468997 | |
| WoodDeckSF | 0.232019 | 0.235459 0.09 | 92165 | -0.025444 | 0.247433 | |
| OpenPorchSF | 0.247264 | 0.211671 0.20 | 08026 | 0.018251 | 0.330224 | |
| EnclosedPorch | -0.095478 - | 0.065292 0.06 | 51989 | 0.061081 | 0.009113 | |
| 3SsnPorch | 0.037384 | 0.056104 -0.02 | 24358 | -0.004296 | 0.020643 | |
| ScreenPorch | 0.084489 | 0.088758 0.04 | 10606 | 0.026799 | 0.101510 | |
| PoolArea | 0.126053 | 0.131525 0.08 | 31487 | 0.062157 | 0.170205 | |
| | | | | | | |
| | ${\tt BsmtFullBath}$ | ${\tt BsmtHalfBath}$ | FullBath | HalfBath | ${\tt BedroomAbvGr}$ | \ |
| LotFrontage | 0.100949 | -0.007234 | 0.198769 | 0.053532 | 0.263170 | |
| LotArea | 0.158155 | 0.048046 | 0.126031 | 0.014259 | 0.119690 | |
| BsmtFinSF1 | 0.649212 | 0.067418 | 0.058543 | 0.004262 | -0.107355 | |
| BsmtFinSF2 | 0.158678 | 0.070948 | -0.076444 | -0.032148 | -0.015728 | |
| BsmtUnfSF | -0.422900 | -0.095804 | 0.288886 | -0.041118 | 0.166643 | |
| TotalBsmtSF | 0.307351 | -0.000315 | 0.323722 | -0.048804 | 0.050450 | |
| 1stFlrSF | 0.244671 | 0.001956 | 0.380637 | -0.119916 | 0.127401 | |
| 2ndFlrSF | -0.169494 | -0.023855 | 0.421378 | 0.609707 | 0.502901 | |
| ${\tt LowQualFinSF}$ | -0.047143 | -0.005842 | -0.000710 | -0.027080 | 0.105607 | |
| GrLivArea | 0.034836 | -0.018918 | 0.630012 | 0.415772 | 0.521270 | |
| ${\tt BsmtFullBath}$ | 1.000000 | -0.147871 | -0.064512 | -0.030905 | -0.150673 | |
| ${\tt BsmtHalfBath}$ | -0.147871 | 1.000000 | -0.054536 | -0.012340 | 0.046519 | |
| FullBath | -0.064512 | -0.054536 | 1.000000 | 0.136381 | 0.363252 | |
| HalfBath | -0.030905 | -0.012340 | 0.136381 | 1.000000 | 0.226651 | |
| ${\tt BedroomAbvGr}$ | -0.150673 | 0.046519 | 0.363252 | 0.226651 | 1.000000 | |
| KitchenAbvGr | -0.041503 | -0.037944 | 0.133115 | -0.068263 | 0.198597 | |
| ${\tt TotRmsAbvGrd}$ | -0.053275 | -0.023836 | 0.554784 | 0.343415 | 0.676620 | |
| Fireplaces | 0.137928 | 0.028976 | 0.243671 | 0.203649 | 0.107570 | |
| ${\tt GarageYrBlt}$ | 0.124553 | -0.077464 | 0.484557 | 0.196785 | -0.064518 | |
| GarageCars | 0.131881 | -0.020891 | 0.469672 | 0.219178 | 0.086106 | |
| ${\tt GarageArea}$ | 0.179189 | -0.024536 | 0.405656 | 0.163549 | 0.065253 | |
| | | | | | | |

| WoodDeckSF | 0.175315 | 0.040161 | 0.187703 0 | .108080 | 0.046854 | |
|-----------------------|--------------|----------------------|--------------|---------------------|-------------|---|
| OpenPorchSF | 0.067341 | -0.025324 | 0.259977 | .199740 | 0.093810 | |
| EnclosedPorch | -0.049911 | -0.008555 | -0.115093 -0 | 0.095317 | 0.041570 | |
| 3SsnPorch | -0.000106 | 0.035114 | 0.035353 -0 | .004972 - | -0.024478 | |
| ScreenPorch | 0.023148 | 0.032121 | -0.008106 | 0.072426 | 0.044300 | |
| PoolArea | 0.067616 | 0.020025 | 0.049604 0 | 0.022381 | 0.070703 | |
| | | | | | | |
| | KitchenAbvGr | ${\tt TotRmsAbvGrd}$ | Fireplaces | ${\tt GarageYrBlt}$ | \ | |
| ${	t LotFrontage}$ | -0.006069 | 0.352096 | 0.266639 | 0.070250 | | |
| LotArea | -0.017784 | 0.190015 | 0.271364 | -0.024947 | | |
| BsmtFinSF1 | -0.081007 | 0.044316 | 0.260011 | 0.153484 | | |
| BsmtFinSF2 | -0.040751 | -0.035227 | 0.046921 | -0.088011 | | |
| ${\tt BsmtUnfSF}$ | 0.030086 | 0.250647 | 0.051575 | 0.190708 | | |
| TotalBsmtSF | -0.068901 | 0.285573 | 0.339519 | 0.322445 | | |
| 1stFlrSF | 0.068101 | 0.409516 | 0.410531 | 0.233449 | | |
| 2ndFlrSF | 0.059306 | 0.616423 | 0.194561 | 0.070832 | | |
| ${\tt LowQualFinSF}$ | 0.007522 | 0.131185 | -0.021272 | -0.036363 | | |
| ${\tt GrLivArea}$ | 0.100063 | 0.825489 | 0.461679 | 0.231197 | | |
| BsmtFullBath | -0.041503 | -0.053275 | 0.137928 | 0.124553 | | |
| ${\tt BsmtHalfBath}$ | -0.037944 | -0.023836 | 0.028976 | -0.077464 | | |
| FullBath | 0.133115 | 0.554784 | 0.243671 | 0.484557 | | |
| HalfBath | -0.068263 | 0.343415 | 0.203649 | 0.196785 | | |
| ${\tt BedroomAbvGr}$ | 0.198597 | 0.676620 | 0.107570 | -0.064518 | | |
| KitchenAbvGr | 1.000000 | 0.256045 | -0.123936 | -0.124411 | | |
| ${\tt TotRmsAbvGrd}$ | 0.256045 | 1.000000 | 0.326114 | 0.148112 | | |
| Fireplaces | -0.123936 | 0.326114 | 1.000000 | 0.046822 | | |
| ${\tt GarageYrBlt}$ | -0.124411 | 0.148112 | 0.046822 | 1.000000 | | |
| GarageCars | -0.050634 | 0.362289 | 0.300789 | 0.588920 | | |
| ${\tt GarageArea}$ | -0.064433 | 0.337822 | 0.269141 | 0.564567 | | |
| WoodDeckSF | -0.090130 | 0.165984 | 0.200019 | 0.224577 | | |
| OpenPorchSF | -0.070091 | 0.234192 | 0.169405 | 0.228425 | | |
| ${\tt EnclosedPorch}$ | 0.037312 | 0.004151 | -0.024822 | -0.297003 | | |
| 3SsnPorch | -0.024600 | -0.006683 | 0.011257 | 0.023544 | | |
| ScreenPorch | -0.051613 | 0.059383 | 0.184530 | -0.075418 | | |
| PoolArea | -0.014525 | 0.083757 | 0.095074 | -0.014501 | | |
| | | | | | | |
| | GarageCars G | arageArea Woo | odDeckSF Ope | enPorchSF End | closedPorch | \ |
| ${	t LotFrontage}$ | 0.285691 | 0.344997 | 0.088521 | 0.151972 | 0.010700 | |
| LotArea | 0.154871 | 0.180403 | .171698 | 0.084774 | -0.018340 | |
| BsmtFinSF1 | 0.224054 | 0.296970 | .204306 | 0.111761 | -0.102303 | |
| BsmtFinSF2 | -0.038264 | -0.018227 | 0.067898 | 0.003093 | 0.036543 | |
| ${\tt BsmtUnfSF}$ | 0.214175 | 0.183303 -0 | 0.005316 | 0.129005 | -0.002538 | |
| TotalBsmtSF | 0.434585 | 0.486665 | .232019 | 0.247264 | -0.095478 | |
| 1stFlrSF | 0.439317 | 0.489782 | .235459 | 0.211671 | -0.065292 | |
| 2ndFlrSF | 0.183926 | 0.138347 | 0.092165 | 0.208026 | 0.061989 | |
| ${\tt LowQualFinSF}$ | -0.094480 | -0.067601 -0 | 0.025444 | 0.018251 | 0.061081 | |
| GrLivArea | 0.467247 | 0.468997 | .247433 | 0.330224 | 0.009113 | |
| | | | | | | |

| BsmtFullBath | 0.131881 | 0.179189 | 0.175315 | 0.067341 | -0.049911 |
|----------------------|-----------|-----------|-----------|-----------|-----------|
| BsmtHalfBath | -0.020891 | -0.024536 | 0.040161 | -0.025324 | -0.008555 |
| FullBath | 0.469672 | 0.405656 | 0.187703 | 0.259977 | -0.115093 |
| HalfBath | 0.219178 | 0.163549 | 0.108080 | 0.199740 | -0.095317 |
| ${\tt BedroomAbvGr}$ | 0.086106 | 0.065253 | 0.046854 | 0.093810 | 0.041570 |
| KitchenAbvGr | -0.050634 | -0.064433 | -0.090130 | -0.070091 | 0.037312 |
| ${\tt TotRmsAbvGrd}$ | 0.362289 | 0.337822 | 0.165984 | 0.234192 | 0.004151 |
| Fireplaces | 0.300789 | 0.269141 | 0.200019 | 0.169405 | -0.024822 |
| GarageYrBlt | 0.588920 | 0.564567 | 0.224577 | 0.228425 | -0.297003 |
| GarageCars | 1.000000 | 0.882475 | 0.226342 | 0.213569 | -0.151434 |
| ${	t GarageArea}$ | 0.882475 | 1.000000 | 0.224666 | 0.241435 | -0.121777 |
| WoodDeckSF | 0.226342 | 0.224666 | 1.000000 | 0.058661 | -0.125989 |
| OpenPorchSF | 0.213569 | 0.241435 | 0.058661 | 1.000000 | -0.093079 |
| EnclosedPorch | -0.151434 | -0.121777 | -0.125989 | -0.093079 | 1.000000 |
| 3SsnPorch | 0.035765 | 0.035087 | -0.032771 | -0.005842 | -0.037305 |
| ScreenPorch | 0.050494 | 0.051412 | -0.074181 | 0.074304 | -0.082864 |
| PoolArea | 0.020934 | 0.061047 | 0.073378 | 0.060762 | 0.054203 |
| | | | | | |

| | 3SsnPorch | ScreenPorch | PoolArea |
|-----------------------|-----------|-------------|-----------|
| ${	t LotFrontage}$ | 0.070029 | 0.041383 | 0.206167 |
| LotArea | 0.020423 | 0.043160 | 0.077672 |
| BsmtFinSF1 | 0.026451 | 0.062021 | 0.140491 |
| BsmtFinSF2 | -0.029993 | 0.088871 | 0.041709 |
| BsmtUnfSF | 0.020764 | -0.012579 | -0.035092 |
| TotalBsmtSF | 0.037384 | 0.084489 | 0.126053 |
| 1stFlrSF | 0.056104 | 0.088758 | 0.131525 |
| 2ndFlrSF | -0.024358 | 0.040606 | 0.081487 |
| ${\tt LowQualFinSF}$ | -0.004296 | 0.026799 | 0.062157 |
| ${\tt GrLivArea}$ | 0.020643 | 0.101510 | 0.170205 |
| BsmtFullBath | -0.000106 | 0.023148 | 0.067616 |
| ${\tt BsmtHalfBath}$ | 0.035114 | 0.032121 | 0.020025 |
| FullBath | 0.035353 | -0.008106 | 0.049604 |
| HalfBath | -0.004972 | 0.072426 | 0.022381 |
| ${\tt BedroomAbvGr}$ | -0.024478 | 0.044300 | 0.070703 |
| KitchenAbvGr | -0.024600 | -0.051613 | -0.014525 |
| ${\tt TotRmsAbvGrd}$ | -0.006683 | 0.059383 | 0.083757 |
| Fireplaces | 0.011257 | 0.184530 | 0.095074 |
| ${	t GarageYrBlt}$ | 0.023544 | -0.075418 | -0.014501 |
| GarageCars | 0.035765 | 0.050494 | 0.020934 |
| ${\tt GarageArea}$ | 0.035087 | 0.051412 | 0.061047 |
| WoodDeckSF | -0.032771 | -0.074181 | 0.073378 |
| OpenPorchSF | -0.005842 | 0.074304 | 0.060762 |
| ${\tt EnclosedPorch}$ | -0.037305 | -0.082864 | 0.054203 |
| 3SsnPorch | 1.000000 | -0.031436 | -0.007992 |
| ScreenPorch | -0.031436 | 1.000000 | 0.051307 |
| PoolArea | -0.007992 | 0.051307 | 1.000000 |

Return True for positive or negative correlations that are bigger than 0.75 in the correlation matrix:

[5]: abs(ames_preprocessed.corr())>0.75

| [5]: | | LotFrontage | LotArea | BsmtFinSF1 | BsmtFinSF2 | ${\tt BsmtUnfSF}$ | \ |
|------|----------------------|-------------|----------|------------|--------------|-------------------|---|
| | LotFrontage | True | False | False | False | False | |
| | LotArea | False | True | False | False | False | |
| | BsmtFinSF1 | False | False | True | False | False | |
| | BsmtFinSF2 | False | False | False | True | False | |
| | ${\tt BsmtUnfSF}$ | False | False | False | False | True | |
| | ${\tt TotalBsmtSF}$ | False | False | False | False | False | |
| | 1stFlrSF | False | False | False | False | False | |
| | 2ndFlrSF | False | False | False | False | False | |
| | ${\tt LowQualFinSF}$ | False | False | False | False | False | |
| | ${\tt GrLivArea}$ | False | False | False | False | False | |
| | ${\tt BsmtFullBath}$ | False | False | False | False | False | |
| | ${\tt BsmtHalfBath}$ | False | False | False | False | False | |
| | FullBath | False | False | False | False | False | |
| | HalfBath | False | False | False | False | False | |
| | ${\tt BedroomAbvGr}$ | False | False | False | False | False | |
| | KitchenAbvGr | False | False | False | False | False | |
| | ${\tt TotRmsAbvGrd}$ | False | False | False | False | False | |
| | Fireplaces | False | False | False | False | False | |
| | GarageYrBlt | False | False | False | False | False | |
| | GarageCars | False | False | False | False | False | |
| | GarageArea | False | False | False | False | False | |
| | WoodDeckSF | False | False | False | False | False | |
| | OpenPorchSF | False | False | False | False | False | |
| | EnclosedPorch | False | False | False | | False | |
| | 3SsnPorch | False | False | False | | False | |
| | ScreenPorch | False | False | False | False | False | |
| | PoolArea | False | False | False | False | False | |
| | | TotalBsmtSF | 1stFlrSF | 2ndFlrSF | LowQualFinSF | GrLivArea | \ |
| | LotFrontage | False | False | False | False | False | ` |
| | LotArea | False | False | False | False | False | |
| | BsmtFinSF1 | False | False | False | False | False | |
| | BsmtFinSF2 | False | False | False | False | False | |
| | BsmtUnfSF | False | False | False | False | False | |
| | TotalBsmtSF | True | True | False | False | False | |
| | 1stFlrSF | True | True | False | False | False | |
| | 2ndFlrSF | False | False | True | False | False | |
| | LowQualFinSF | False | False | False | True | False | |
| | GrLivArea | False | False | False | False | True | |
| | BsmtFullBath | False | False | False | False | False | |
| | BsmtHalfBath | False | False | False | False | False | |
| | FullBath | False | False | False | False | False | |
| | | | | | | | |

| HalfBath | False | False F | alse | False | False | |
|-----------------------|--------------|----------------------|------------|----------|--------------|---|
| BedroomAbvGr | False | False F | alse | False | False | |
| KitchenAbvGr | False | False F | alse | False | False | |
| TotRmsAbvGrd | False | False F | alse | False | True | |
| Fireplaces | False | False F | alse | False | False | |
| GarageYrBlt | False | False F | alse | False | False | |
| GarageCars | False | False F | alse | False | False | |
| GarageArea | False | False F | alse | False | False | |
| WoodDeckSF | False | False F | alse | False | False | |
| OpenPorchSF | False | False F | alse | False | False | |
| EnclosedPorch | False | False F | alse | False | False | |
| 3SsnPorch | False | False F | alse | False | False | |
| ScreenPorch | False | False F | alse | False | False | |
| PoolArea | False | False F | alse | False | False | |
| | | | | | | |
| | BsmtFullBath | BsmtHalfBath | FullBath | HalfBath | BedroomAbvGr | \ |
| LotFrontage | False | False | False | False | False | |
| LotArea | False | False | False | False | False | |
| BsmtFinSF1 | False | False | False | False | False | |
| BsmtFinSF2 | False | False | False | False | False | |
| BsmtUnfSF | False | False | False | False | False | |
| TotalBsmtSF | False | False | False | False | False | |
| 1stFlrSF | False | False | False | False | False | |
| 2ndFlrSF | False | False | False | False | False | |
| ${\tt LowQualFinSF}$ | False | False | False | False | False | |
| GrLivArea | False | False | False | False | False | |
| ${\tt BsmtFullBath}$ | True | False | False | False | False | |
| ${\tt BsmtHalfBath}$ | False | True | False | False | False | |
| FullBath | False | False | True | False | False | |
| HalfBath | False | False | False | True | False | |
| ${\tt BedroomAbvGr}$ | False | False | False | False | True | |
| KitchenAbvGr | False | False | False | False | False | |
| ${\tt TotRmsAbvGrd}$ | False | False | False | False | False | |
| Fireplaces | False | False | False | False | False | |
| GarageYrBlt | False | False | False | False | False | |
| GarageCars | False | False | False | False | False | |
| GarageArea | False | False | False | False | False | |
| WoodDeckSF | False | False | False | False | False | |
| OpenPorchSF | False | False | False | False | False | |
| ${\tt EnclosedPorch}$ | False | False | False | False | False | |
| 3SsnPorch | False | False | False | False | False | |
| ScreenPorch | False | False | False | False | False | |
| PoolArea | False | False | False | False | False | |
| | | | | | | |
| | KitchenAbvGr | ${\tt TotRmsAbvGrd}$ | Fireplaces | _ | | |
| LotFrontage | False | False | False | | lse | |
| I at Araa | Falco | Falco | Falco | E- | Jao | |

False

False

False

False

LotArea

| BsmtFinSF1 | False | False | False | False |
|----------------------|-------|-------|-------|-------|
| BsmtFinSF2 | False | False | False | False |
| BsmtUnfSF | False | False | False | False |
| TotalBsmtSF | False | False | False | False |
| 1stFlrSF | False | False | False | False |
| 2ndFlrSF | False | False | False | False |
| ${\tt LowQualFinSF}$ | False | False | False | False |
| GrLivArea | False | True | False | False |
| BsmtFullBath | False | False | False | False |
| BsmtHalfBath | False | False | False | False |
| FullBath | False | False | False | False |
| HalfBath | False | False | False | False |
| ${\tt BedroomAbvGr}$ | False | False | False | False |
| KitchenAbvGr | True | False | False | False |
| ${\tt TotRmsAbvGrd}$ | False | True | False | False |
| Fireplaces | False | False | True | False |
| ${\tt GarageYrBlt}$ | False | False | False | True |
| GarageCars | False | False | False | False |
| ${	t GarageArea}$ | False | False | False | False |
| WoodDeckSF | False | False | False | False |
| OpenPorchSF | False | False | False | False |
| EnclosedPorch | False | False | False | False |
| 3SsnPorch | False | False | False | False |
| ScreenPorch | False | False | False | False |
| PoolArea | False | False | False | False |
| | | | | |

| | GarageCars | ${\tt GarageArea}$ | WoodDeckSF | OpenPorchSF | ${\tt EnclosedPorch}$ | \ |
|----------------------|------------|--------------------|------------|-------------|-----------------------|---|
| LotFrontage | False | False | False | False | False | |
| LotArea | False | False | False | False | False | |
| BsmtFinSF1 | False | False | False | False | False | |
| BsmtFinSF2 | False | False | False | False | False | |
| BsmtUnfSF | False | False | False | False | False | |
| TotalBsmtSF | False | False | False | False | False | |
| 1stFlrSF | False | False | False | False | False | |
| 2ndFlrSF | False | False | False | False | False | |
| ${\tt LowQualFinSF}$ | False | False | False | False | False | |
| GrLivArea | False | False | False | False | False | |
| ${\tt BsmtFullBath}$ | False | False | False | False | False | |
| ${\tt BsmtHalfBath}$ | False | False | False | False | False | |
| FullBath | False | False | False | False | False | |
| HalfBath | False | False | False | False | False | |
| ${\tt BedroomAbvGr}$ | False | False | False | False | False | |
| KitchenAbvGr | False | False | False | False | False | |
| ${\tt TotRmsAbvGrd}$ | False | False | False | False | False | |
| Fireplaces | False | False | False | False | False | |
| ${\tt GarageYrBlt}$ | False | False | False | False | False | |
| GarageCars | True | True | False | False | False | |

| ${	t GarageArea}$ | True | True | False | False | False |
|-------------------|-------|-------|-------|-------|-------|
| WoodDeckSF | False | False | True | False | False |
| OpenPorchSF | False | False | False | True | False |
| EnclosedPorch | False | False | False | False | True |
| 3SsnPorch | False | False | False | False | False |
| ScreenPorch | False | False | False | False | False |
| PoolArea | False | False | False | False | False |

| | 3SsnPorch | ScreenPorch | PoolArea |
|----------------------|-----------|-------------|----------|
| LotFrontage | False | False | False |
| LotArea | False | False | False |
| BsmtFinSF1 | False | False | False |
| BsmtFinSF2 | False | False | False |
| BsmtUnfSF | False | False | False |
| TotalBsmtSF | False | False | False |
| 1stFlrSF | False | False | False |
| 2ndFlrSF | False | False | False |
| LowQualFinSF | False | False | False |
| GrLivArea | False | False | False |
| BsmtFullBath | False | False | False |
| BsmtHalfBath | False | False | False |
| FullBath | False | False | False |
| HalfBath | False | False | False |
| ${\tt BedroomAbvGr}$ | False | False | False |
| KitchenAbvGr | False | False | False |
| ${\tt TotRmsAbvGrd}$ | False | False | False |
| Fireplaces | False | False | False |
| GarageYrBlt | False | False | False |
| GarageCars | False | False | False |
| GarageArea | False | False | False |
| WoodDeckSF | False | False | False |
| OpenPorchSF | False | False | False |
| EnclosedPorch | False | False | False |
| 3SsnPorch | True | False | False |
| ScreenPorch | False | True | False |
| PoolArea | False | False | True |
| | | | |

Now, include stack and zip to create a more robust solution that will return the variable pairs from the correlation matrix that have correlations over .75, but less than 1.

```
# df.drop(index = ind, inplace = True)

corr_1 = df.iloc[0:len(ames_preprocessed.columns)].index
df.drop(index = corr_1, inplace = True)
df.reset_index(inplace = True)
df.head(15)
df.index

df
```

```
[7]:
          index
                         0
                                                      pairs
     0
             559
                  0.882475
                                  (GarageArea, GarageCars)
     1
            533
                  0.882475
                                  (GarageCars, GarageArea)
                                 (TotRmsAbvGrd, GrLivArea)
     2
            441
                  0.825489
     3
            259
                  0.825489
                                 (GrLivArea, TotRmsAbvGrd)
     4
                                   (1stFlrSF, TotalBsmtSF)
            167
                  0.819530
     5
                                   (TotalBsmtSF, 1stFlrSF)
            141
                  0.819530
                                      (GrLivArea, 2ndFlrSF)
     6
            250
                  0.687501
     7
             198
                  0.687501
                                     (2ndFlrSF, GrLivArea)
     8
            394
                  0.676620
                              (BedroomAbvGr, TotRmsAbvGrd)
     9
                              (TotRmsAbvGrd, BedroomAbvGr)
            446
                  0.676620
     10
             64
                  0.649212
                                (BsmtFinSF1, BsmtFullBath)
     11
            272
                  0.649212
                                (BsmtFullBath, BsmtFinSF1)
     12
            333
                  0.630012
                                     (FullBath, GrLivArea)
            255
                                     (GrLivArea, FullBath)
     13
                  0.630012
     14
             205
                  0.616423
                                  (2ndFlrSF, TotRmsAbvGrd)
                                  (TotRmsAbvGrd, 2ndFlrSF)
     15
            439
                  0.616423
     16
            202
                  0.609707
                                       (2ndFlrSF, HalfBath)
                                       (HalfBath, 2ndFlrSF)
     17
            358
                  0.609707
     18
            505
                  0.588920
                                 (GarageYrBlt, GarageCars)
     19
            531
                  0.588920
                                 (GarageCars, GarageYrBlt)
     20
                                     (1stFlrSF, GrLivArea)
            171
                  0.566024
     21
                                     (GrLivArea, 1stFlrSF)
            249
                  0.566024
                                 (GarageArea, GarageYrBlt)
     22
            558
                  0.564567
     23
            506
                  0.564567
                                 (GarageYrBlt, GarageArea)
     24
             340
                  0.554784
                                  (FullBath, TotRmsAbvGrd)
     25
            444
                  0.554784
                                  (TotRmsAbvGrd, FullBath)
     26
             59
                  0.522396
                                 (BsmtFinSF1, TotalBsmtSF)
     27
                                 (TotalBsmtSF, BsmtFinSF1)
            137
                  0.522396
     28
             387
                  0.521270
                                 (BedroomAbvGr, GrLivArea)
     29
                                 (GrLivArea, BedroomAbvGr)
             257
                  0.521270
     30
            385
                  0.502901
                                  (BedroomAbvGr, 2ndFlrSF)
     31
                                  (2ndFlrSF, BedroomAbvGr)
            203
                  0.502901
     32
            110
                  0.495251
                                   (BsmtUnfSF, BsmtFinSF1)
     33
             58
                  0.495251
                                   (BsmtFinSF1, BsmtUnfSF)
                                    (GarageArea, 1stFlrSF)
     34
            546
                  0.489782
                                    (1stFlrSF, GarageArea)
     35
            182
                  0.489782
```

```
36
       155
             0.486665
                            (TotalBsmtSF, GarageArea)
37
                            (GarageArea, TotalBsmtSF)
       545
             0.486665
38
       498
             0.484557
                              (GarageYrBlt, FullBath)
39
       342
             0.484557
                              (FullBath, GarageYrBlt)
40
       343
             0.469672
                               (FullBath, GarageCars)
                               (GarageCars, FullBath)
41
       525
             0.469672
42
       549
                              (GarageArea, GrLivArea)
             0.468997
                              (GrLivArea, GarageArea)
43
       263
             0.468997
                              (GrLivArea, GarageCars)
44
       262
             0.467247
45
                              (GarageCars, GrLivArea)
       522
             0.467247
                              (GrLivArea, Fireplaces)
46
       260
             0.461679
47
       468
             0.461679
                              (Fireplaces, GrLivArea)
48
         6
             0.457181
                              (LotFrontage, 1stFlrSF)
49
       162
             0.457181
                              (1stFlrSF, LotFrontage)
50
                             (TotalBsmtSF, GrLivArea)
       144
             0.454868
                             (GrLivArea, TotalBsmtSF)
51
       248
             0.454868
52
       164
             0.445863
                               (1stFlrSF, BsmtFinSF1)
53
                                (BsmtFinSF1, 1stFlrSF)
        60
             0.445863
54
       519
             0.439317
                                (GarageCars, 1stFlrSF)
55
       181
             0.439317
                                (1stFlrSF, GarageCars)
                            (TotalBsmtSF, GarageCars)
56
       154
             0.434585
                            (GarageCars, TotalBsmtSF)
57
       518
             0.434585
58
        27
             0.426095
                               (LotArea, LotFrontage)
59
                                (LotFrontage, LotArea)
         1
             0.426095
60
       118
             0.422900
                            (BsmtUnfSF, BsmtFullBath)
61
       274
             0.422900
                            (BsmtFullBath, BsmtUnfSF)
                                  (2ndFlrSF, FullBath)
62
       201
             0.421378
63
                                  (FullBath, 2ndFlrSF)
       331
             0.421378
64
       360
             0.415772
                                 (HalfBath, GrLivArea)
       256
                                 (GrLivArea, HalfBath)
65
             0.415772
                             (TotalBsmtSF, BsmtUnfSF)
66
       139
             0.415360
                             (BsmtUnfSF, TotalBsmtSF)
67
       113
             0.415360
                                (Fireplaces, 1stFlrSF)
68
       465
             0.410531
                                (1stFlrSF, Fireplaces)
69
       179
             0.410531
70
       438
             0.409516
                             (TotRmsAbvGrd, 1stFlrSF)
71
       178
             0.409516
                             (1stFlrSF, TotRmsAbvGrd)
72
       344
             0.405656
                               (FullBath, GarageArea)
73
       552
             0.405656
                                (GarageArea, FullBath)
74
         9
             0.402797
                             (LotFrontage, GrLivArea)
75
       243
                             (GrLivArea, LotFrontage)
             0.402797
76
                           (LotFrontage, TotalBsmtSF)
         5
             0.392075
77
       135
             0.392075
                           (TotalBsmtSF, LotFrontage)
78
       174
             0.380637
                                  (1stFlrSF, FullBath)
79
       330
             0.380637
                                  (FullBath, 1stFlrSF)
       390
                             (BedroomAbvGr, FullBath)
80
             0.363252
                             (FullBath, BedroomAbvGr)
       338
             0.363252
81
                           (TotRmsAbvGrd, GarageCars)
82
       451
             0.362289
```

```
83
       529
             0.362289
                           (GarageCars, TotRmsAbvGrd)
                          (TotRmsAbvGrd, LotFrontage)
84
       432
             0.352096
85
        16
             0.352096
                          (LotFrontage, TotRmsAbvGrd)
                            (GarageArea, LotFrontage)
86
       540
             0.344997
87
        20
             0.344997
                            (LotFrontage, GarageArea)
88
       367
             0.343415
                             (HalfBath, TotRmsAbvGrd)
       445
                             (TotRmsAbvGrd, HalfBath)
89
             0.343415
90
       152
             0.339519
                            (TotalBsmtSF, Fireplaces)
                            (Fireplaces, TotalBsmtSF)
91
       464
             0.339519
92
       556
                           (GarageArea, TotRmsAbvGrd)
             0.337822
                           (TotRmsAbvGrd, GarageArea)
93
       452
             0.337822
94
       603
             0.330224
                             (OpenPorchSF, GrLivArea)
95
       265
             0.330224
                             (GrLivArea, OpenPorchSF)
96
       475
             0.326114
                           (Fireplaces, TotRmsAbvGrd)
                           (TotRmsAbvGrd, Fireplaces)
97
       449
             0.326114
98
       329
             0.323722
                              (FullBath, TotalBsmtSF)
99
       147
             0.323722
                              (TotalBsmtSF, FullBath)
       491
             0.322445
                           (GarageYrBlt, TotalBsmtSF)
100
101
       153
             0.322445
                           (TotalBsmtSF, GarageYrBlt)
102
       114
             0.317987
                                (BsmtUnfSF, 1stFlrSF)
                                (1stFlrSF, BsmtUnfSF)
103
       166
             0.317987
104
             0.307351
                          (TotalBsmtSF, BsmtFullBath)
       145
105
       275
             0.307351
                          (BsmtFullBath, TotalBsmtSF)
                             (Fireplaces, GarageCars)
106
       478
             0.300789
107
       530
             0.300789
                             (GarageCars, Fireplaces)
108
        33
             0.299475
                                   (LotArea, 1stFlrSF)
                                   (1stFlrSF, LotArea)
109
       163
             0.299475
       509
             0.297003
                         (GarageYrBlt, EnclosedPorch)
110
111
       639
             0.297003
                         (EnclosedPorch, GarageYrBlt)
             0.296970
                             (BsmtFinSF1, GarageArea)
112
        74
       542
             0.296970
                             (GarageArea, BsmtFinSF1)
113
                                (FullBath, BsmtUnfSF)
114
       328
             0.288886
115
       120
             0.288886
                                (BsmtUnfSF, FullBath)
116
        19
             0.285691
                            (LotFrontage, GarageCars)
117
       513
             0.285691
                            (GarageCars, LotFrontage)
118
       437
             0.285573
                          (TotRmsAbvGrd, TotalBsmtSF)
             0.285573
                          (TotalBsmtSF, TotRmsAbvGrd)
119
       151
120
       460
             0.271364
                                (Fireplaces, LotArea)
121
        44
             0.271364
                                (LotArea, Fireplaces)
122
             0.269141
                             (Fireplaces, GarageArea)
       479
123
                             (GarageArea, Fireplaces)
       557
             0.269141
124
        17
             0.266639
                            (LotFrontage, Fireplaces)
125
       459
             0.266639
                            (Fireplaces, LotFrontage)
126
        14
             0.263170
                          (LotFrontage, BedroomAbvGr)
127
       378
                          (BedroomAbvGr, LotFrontage)
             0.263170
                                  (GrLivArea, LotArea)
128
       244
             0.263116
129
        36
             0.263116
                                  (LotArea, GrLivArea)
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130
        32
            0.260833
                               (LotArea, TotalBsmtSF)
                               (TotalBsmtSF, LotArea)
131
       136
            0.260833
                             (Fireplaces, BsmtFinSF1)
132
       461
             0.260011
                             (BsmtFinSF1, Fireplaces)
133
        71
            0.260011
            0.259977
                              (OpenPorchSF, FullBath)
134
       606
135
       346
            0.259977
                              (FullBath, OpenPorchSF)
                         (TotRmsAbvGrd, KitchenAbvGr)
136
       447
            0.256045
137
       421
            0.256045
                         (KitchenAbvGr, TotRmsAbvGrd)
                            (TotRmsAbvGrd, BsmtUnfSF)
138
       436
            0.250647
                            (BsmtUnfSF, TotRmsAbvGrd)
139
       124
            0.250647
                              (WoodDeckSF, GrLivArea)
140
       576
            0.247433
141
       264
            0.247433
                              (GrLivArea, WoodDeckSF)
142
       599
            0.247264
                           (OpenPorchSF, TotalBsmtSF)
143
       157
            0.247264
                           (TotalBsmtSF, OpenPorchSF)
                             (BsmtFullBath, 1stFlrSF)
144
       276
            0.244671
145
       172
            0.244671
                             (1stFlrSF, BsmtFullBath)
146
                               (FullBath, Fireplaces)
       341
             0.243671
                               (Fireplaces, FullBath)
147
       471
             0.243671
148
       562
            0.241435
                            (GarageArea, OpenPorchSF)
149
                            (OpenPorchSF, GarageArea)
       614
            0.241435
150
       247
             0.240257
                               (GrLivArea, BsmtUnfSF)
                               (BsmtUnfSF, GrLivArea)
151
       117
            0.240257
152
                               (WoodDeckSF, 1stFlrSF)
       573
            0.235459
                               (1stFlrSF, WoodDeckSF)
153
       183
            0.235459
154
                          (OpenPorchSF, TotRmsAbvGrd)
       610
            0.234192
155
       454
            0.234192
                          (TotRmsAbvGrd, OpenPorchSF)
156
         2
            0.233633
                            (LotFrontage, BsmtFinSF1)
            0.233633
                            (BsmtFinSF1, LotFrontage)
157
        54
158
       180
            0.233449
                              (1stFlrSF, GarageYrBlt)
                              (GarageYrBlt, 1stFlrSF)
159
       492
            0.233449
160
                            (WoodDeckSF, TotalBsmtSF)
       572
            0.232019
                            (TotalBsmtSF, WoodDeckSF)
161
            0.232019
       156
                             (GarageYrBlt, GrLivArea)
162
       495
            0.231197
163
       261
            0.231197
                             (GrLivArea, GarageYrBlt)
164
            0.228425
                           (GarageYrBlt, OpenPorchSF)
       508
165
       612
            0.228425
                           (OpenPorchSF, GarageYrBlt)
            0.226651
                             (BedroomAbvGr, HalfBath)
166
       391
167
            0.226651
                             (HalfBath, BedroomAbvGr)
       365
                             (WoodDeckSF, GarageCars)
168
       586
            0.226342
                             (GarageCars, WoodDeckSF)
169
       534
            0.226342
                             (GarageArea, WoodDeckSF)
170
       561
            0.224666
171
       587
            0.224666
                             (WoodDeckSF, GarageArea)
                            (WoodDeckSF, GarageYrBlt)
172
       585
            0.224577
173
       507
            0.224577
                            (GarageYrBlt, WoodDeckSF)
174
                             (GarageCars, BsmtFinSF1)
       515
            0.224054
                             (BsmtFinSF1, GarageCars)
175
        73
            0.224054
176
       526
            0.219178
                               (GarageCars, HalfBath)
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177
       370
             0.219178
                               (HalfBath, GarageCars)
                              (GarageCars, BsmtUnfSF)
178
       517
             0.214175
                              (BsmtUnfSF, GarageCars)
179
       127
             0.214175
                                (BsmtFinSF1, LotArea)
180
        55
             0.214103
                                (LotArea, BsmtFinSF1)
181
        29
             0.214103
182
             0.213569
                            (OpenPorchSF, GarageCars)
       613
                            (GarageCars, OpenPorchSF)
183
       535
             0.213569
                              (OpenPorchSF, 1stFlrSF)
184
       600
             0.211671
                              (1stFlrSF, OpenPorchSF)
185
             0.211671
       184
186
                              (BsmtFinSF2, BsmtUnfSF)
        85
             0.209294
                              (BsmtUnfSF, BsmtFinSF2)
187
       111
             0.209294
188
        63
             0.208171
                              (BsmtFinSF1, GrLivArea)
189
       245
             0.208171
                              (GrLivArea, BsmtFinSF1)
                              (OpenPorchSF, 2ndFlrSF)
190
       601
             0.208026
                              (2ndFlrSF, OpenPorchSF)
191
             0.208026
       211
192
       702
             0.206167
                              (PoolArea, LotFrontage)
193
        26
                              (LotFrontage, PoolArea)
             0.206167
                             (WoodDeckSF, BsmtFinSF1)
194
       569
             0.204306
195
        75
             0.204306
                             (BsmtFinSF1, WoodDeckSF)
196
       472
             0.203649
                               (Fireplaces, HalfBath)
197
       368
             0.203649
                               (HalfBath, Fireplaces)
                                  (2ndFlrSF, 1stFlrSF)
198
       195
             0.202646
199
             0.202646
                                  (1stFlrSF, 2ndFlrSF)
       169
                             (Fireplaces, WoodDeckSF)
200
       480
             0.200019
201
                             (WoodDeckSF, Fireplaces)
       584
             0.200019
202
       373
             0.199740
                              (HalfBath, OpenPorchSF)
203
       607
             0.199740
                              (OpenPorchSF, HalfBath)
204
                              (LotFrontage, FullBath)
        12
             0.198769
205
       324
             0.198769
                              (FullBath, LotFrontage)
                         (KitchenAbvGr, BedroomAbvGr)
206
       419
             0.198597
                         (BedroomAbvGr, KitchenAbvGr)
207
       393
             0.198597
208
       499
                              (GarageYrBlt, HalfBath)
             0.196785
                              (HalfBath, GarageYrBlt)
209
       369
             0.196785
                               (Fireplaces, 2ndFlrSF)
210
       466
             0.194561
       206
                               (2ndFlrSF, Fireplaces)
211
             0.194561
212
       490
             0.190708
                             (GarageYrBlt, BsmtUnfSF)
213
                             (BsmtUnfSF, GarageYrBlt)
       126
             0.190708
214
       433
                              (TotRmsAbvGrd, LotArea)
             0.190015
                              (LotArea, TotRmsAbvGrd)
215
        43
             0.190015
                               (FullBath, WoodDeckSF)
216
       345
             0.187703
                               (WoodDeckSF, FullBath)
217
       579
             0.187703
218
       484
             0.184530
                            (Fireplaces, ScreenPorch)
                            (ScreenPorch, Fireplaces)
219
       692
             0.184530
220
       520
             0.183926
                               (GarageCars, 2ndFlrSF)
                               (2ndFlrSF, GarageCars)
221
       208
             0.183926
                              (GarageArea, BsmtUnfSF)
222
       544
             0.183303
223
       128
             0.183303
                              (BsmtUnfSF, GarageArea)
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224
       541
             0.180403
                                (GarageArea, LotArea)
225
        47
             0.180403
                                (LotArea, GarageArea)
226
       290
             0.179189
                           (BsmtFullBath, GarageArea)
227
       550
             0.179189
                           (GarageArea, BsmtFullBath)
                           (BsmtFullBath, WoodDeckSF)
228
       291
             0.175315
229
       577
             0.175315
                           (WoodDeckSF, BsmtFullBath)
230
                              (2ndFlrSF, TotalBsmtSF)
       194
             0.174512
                              (TotalBsmtSF, 2ndFlrSF)
231
       142
             0.174512
                                (WoodDeckSF, LotArea)
232
       568
             0.171698
233
                                (LotArea, WoodDeckSF)
        48
             0.171698
                                (PoolArea, GrLivArea)
234
       711
             0.170205
235
       269
             0.170205
                                (GrLivArea, PoolArea)
236
       199
             0.169494
                             (2ndFlrSF, BsmtFullBath)
237
       277
             0.169494
                             (BsmtFullBath, 2ndFlrSF)
                            (OpenPorchSF, Fireplaces)
238
             0.169405
       611
239
       481
             0.169405
                            (Fireplaces, OpenPorchSF)
240
       382
             0.166643
                            (BedroomAbvGr, BsmtUnfSF)
241
                            (BsmtUnfSF, BedroomAbvGr)
       122
             0.166643
242
       453
             0.165984
                           (TotRmsAbvGrd, WoodDeckSF)
243
       583
                           (WoodDeckSF, TotRmsAbvGrd)
             0.165984
244
       371
             0.163549
                               (HalfBath, GarageArea)
245
                               (GarageArea, HalfBath)
       553
             0.163549
                           (BsmtFullBath, BsmtFinSF2)
246
       273
             0.158678
                           (BsmtFinSF2, BsmtFullBath)
247
        91
             0.158678
248
       271
                              (BsmtFullBath, LotArea)
             0.158155
249
        37
             0.158155
                              (LotArea, BsmtFullBath)
250
       514
             0.154871
                                (GarageCars, LotArea)
251
                                (LotArea, GarageCars)
        46
             0.154871
252
        72
             0.153484
                            (BsmtFinSF1, GarageYrBlt)
253
                            (GarageYrBlt, BsmtFinSF1)
       488
             0.153484
254
        22
                           (LotFrontage, OpenPorchSF)
             0.151972
                           (OpenPorchSF, LotFrontage)
255
       594
             0.151972
                          (GarageCars, EnclosedPorch)
256
       536
             0.151434
257
       640
             0.151434
                          (EnclosedPorch, GarageCars)
258
       284
             0.150673
                         (BsmtFullBath, BedroomAbvGr)
259
       388
             0.150673
                         (BedroomAbvGr, BsmtFullBath)
260
             0.148112
                          (TotRmsAbvGrd, GarageYrBlt)
       450
261
       502
             0.148112
                          (GarageYrBlt, TotRmsAbvGrd)
                         (BsmtHalfBath, BsmtFullBath)
262
       307
             0.147871
263
                         (BsmtFullBath, BsmtHalfBath)
       281
             0.147871
264
        80
             0.140491
                               (BsmtFinSF1, PoolArea)
265
       704
             0.140491
                               (PoolArea, BsmtFinSF1)
266
             0.138347
                               (GarageArea, 2ndFlrSF)
       547
267
       209
             0.138347
                               (2ndFlrSF, GarageArea)
268
                           (BsmtFullBath, Fireplaces)
       287
             0.137928
                           (Fireplaces, BsmtFullBath)
269
       469
             0.137928
270
       191
             0.137079
                               (2ndFlrSF, BsmtFinSF1)
```

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271
        61
             0.137079
                               (BsmtFinSF1, 2ndFlrSF)
272
                                  (FullBath, HalfBath)
       337
             0.136381
273
       363
             0.136381
                                  (HalfBath, FullBath)
                            (LowQualFinSF, GrLivArea)
274
       225
             0.134683
             0.134683
                            (GrLivArea, LowQualFinSF)
275
       251
                             (FullBath, KitchenAbvGr)
276
       339
             0.133115
277
                             (KitchenAbvGr, FullBath)
       417
             0.133115
                             (BsmtUnfSF, LotFrontage)
278
       108
             0.132644
                             (LotFrontage, BsmtUnfSF)
279
         4
             0.132644
280
       289
                           (BsmtFullBath, GarageCars)
             0.131881
                           (GarageCars, BsmtFullBath)
281
       523
             0.131881
282
             0.131525
                                  (1stFlrSF, PoolArea)
       188
283
       708
             0.131525
                                  (PoolArea, 1stFlrSF)
284
       232
             0.131185
                         (LowQualFinSF, TotRmsAbvGrd)
                         (TotRmsAbvGrd, LowQualFinSF)
285
       440
             0.131185
                             (BsmtUnfSF, OpenPorchSF)
286
       130
             0.129005
                             (OpenPorchSF, BsmtUnfSF)
287
       598
             0.129005
288
                             (BedroomAbvGr, 1stFlrSF)
       384
             0.127401
289
       176
             0.127401
                             (1stFlrSF, BedroomAbvGr)
290
       707
             0.126053
                              (PoolArea, TotalBsmtSF)
                              (TotalBsmtSF, PoolArea)
291
       161
             0.126053
292
             0.126031
                                   (LotArea, FullBath)
        39
293
       325
             0.126031
                                   (FullBath, LotArea)
294
                          (EnclosedPorch, WoodDeckSF)
       642
             0.125989
295
             0.125989
                          (WoodDeckSF, EnclosedPorch)
       590
296
       288
             0.124553
                          (BsmtFullBath, GarageYrBlt)
                          (GarageYrBlt, BsmtFullBath)
297
       496
             0.124553
298
             0.124411
                          (GarageYrBlt, KitchenAbvGr)
       501
299
       423
             0.124411
                          (KitchenAbvGr, GarageYrBlt)
             0.123936
                           (KitchenAbvGr, Fireplaces)
300
       422
301
       474
             0.123936
                           (Fireplaces, KitchenAbvGr)
                          (EnclosedPorch, GarageArea)
302
       641
             0.121777
303
                          (GarageArea, EnclosedPorch)
       563
             0.121777
                                  (1stFlrSF, HalfBath)
304
       175
             0.119916
305
       357
             0.119916
                                  (HalfBath, 1stFlrSF)
306
       379
             0.119690
                              (BedroomAbvGr, LotArea)
307
             0.119690
                              (LotArea, BedroomAbvGr)
        41
308
       633
             0.115093
                            (EnclosedPorch, FullBath)
                            (FullBath, EnclosedPorch)
309
       347
             0.115093
             0.111761
                            (BsmtFinSF1, OpenPorchSF)
310
        76
                            (OpenPorchSF, BsmtFinSF1)
311
       596
             0.111761
312
        82
             0.111170
                                (BsmtFinSF2, LotArea)
             0.111170
                                (LotArea, BsmtFinSF2)
313
        30
314
       580
             0.108080
                               (WoodDeckSF, HalfBath)
                               (HalfBath, WoodDeckSF)
315
       372
             0.108080
                           (Fireplaces, BedroomAbvGr)
       473
316
             0.107570
317
       395
             0.107570
                           (BedroomAbvGr, Fireplaces)
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318
        68
            0.107355
                           (BsmtFinSF1, BedroomAbvGr)
                           (BedroomAbvGr, BsmtFinSF1)
319
       380
            0.107355
                         (BedroomAbvGr, LowQualFinSF)
320
       386
             0.105607
                         (LowQualFinSF, BedroomAbvGr)
321
       230
             0.105607
322
                            (TotalBsmtSF, BsmtFinSF2)
       138
             0.104810
                            (BsmtFinSF2, TotalBsmtSF)
323
        86
             0.104810
324
       623
                          (EnclosedPorch, BsmtFinSF1)
             0.102303
                          (BsmtFinSF1, EnclosedPorch)
325
        77
             0.102303
                             (GrLivArea, ScreenPorch)
326
       268
            0.101510
                             (ScreenPorch, GrLivArea)
327
       684
             0.101510
                          (BsmtFullBath, LotFrontage)
328
       270
             0.100949
329
        10
             0.100949
                          (LotFrontage, BsmtFullBath)
330
       414
            0.100063
                            (KitchenAbvGr, GrLivArea)
331
       258
             0.100063
                            (GrLivArea, KitchenAbvGr)
                               (BsmtFinSF2, 2ndFlrSF)
332
        88
             0.099260
333
       192
            0.099260
                               (2ndFlrSF, BsmtFinSF2)
334
        87
                               (BsmtFinSF2, 1stFlrSF)
             0.097117
335
                               (1stFlrSF, BsmtFinSF2)
       165
             0.097117
336
       119
             0.095804
                            (BsmtUnfSF, BsmtHalfBath)
337
                            (BsmtHalfBath, BsmtUnfSF)
       301
             0.095804
                         (TotalBsmtSF, EnclosedPorch)
338
       158
             0.095478
                         (EnclosedPorch, TotalBsmtSF)
339
       626
             0.095478
340
                            (EnclosedPorch, HalfBath)
       634
            0.095317
                            (HalfBath, EnclosedPorch)
341
       374
             0.095317
342
                               (Fireplaces, PoolArea)
       485
             0.095074
343
       719
             0.095074
                               (PoolArea, Fireplaces)
                           (GarageCars, LowQualFinSF)
344
       521
             0.094480
345
                           (LowQualFinSF, GarageCars)
       235
             0.094480
346
       400
             0.093810
                          (BedroomAbvGr, OpenPorchSF)
                          (OpenPorchSF, BedroomAbvGr)
347
       608
            0.093810
348
                         (EnclosedPorch, OpenPorchSF)
       643
            0.093079
                         (OpenPorchSF, EnclosedPorch)
349
             0.093079
       617
350
       210
             0.092165
                               (2ndFlrSF, WoodDeckSF)
351
       574
             0.092165
                               (WoodDeckSF, 2ndFlrSF)
352
             0.090130
                           (WoodDeckSF, KitchenAbvGr)
       582
353
       426
             0.090130
                           (KitchenAbvGr, WoodDeckSF)
             0.088871
                            (BsmtFinSF2, ScreenPorch)
354
       106
355
       678
                            (ScreenPorch, BsmtFinSF2)
             0.088871
                              (1stFlrSF, ScreenPorch)
356
       187
             0.088758
                              (ScreenPorch, 1stFlrSF)
357
       681
             0.088758
                            (WoodDeckSF, LotFrontage)
358
       567
             0.088521
359
        21
             0.088521
                            (LotFrontage, WoodDeckSF)
360
       489
                            (GarageYrBlt, BsmtFinSF2)
             0.088011
361
        99
             0.088011
                            (BsmtFinSF2, GarageYrBlt)
362
                           (GarageCars, BedroomAbvGr)
       527
             0.086106
                           (BedroomAbvGr, GarageCars)
363
       397
             0.086106
364
        49
             0.084774
                               (LotArea, OpenPorchSF)
```

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365
       595
             0.084774
                               (OpenPorchSF, LotArea)
                           (ScreenPorch, TotalBsmtSF)
366
       680
            0.084489
367
       160
             0.084489
                           (TotalBsmtSF, ScreenPorch)
368
       458
             0.083757
                             (TotRmsAbvGrd, PoolArea)
                             (PoolArea, TotRmsAbvGrd)
369
       718
             0.083757
                         (ScreenPorch, EnclosedPorch)
370
       698
             0.082864
                         (EnclosedPorch, ScreenPorch)
371
       646
             0.082864
                                 (2ndFlrSF, PoolArea)
372
       215
             0.081487
                                 (PoolArea, 2ndFlrSF)
373
       709
            0.081487
374
                           (KitchenAbvGr, BsmtFinSF1)
       407
             0.081007
                           (BsmtFinSF1, KitchenAbvGr)
375
        69
             0.081007
376
       189
             0.080177
                              (2ndFlrSF, LotFrontage)
377
         7
             0.080177
                              (LotFrontage, 2ndFlrSF)
378
        53
             0.077672
                                  (LotArea, PoolArea)
                                  (PoolArea, LotArea)
379
       703
             0.077672
380
       497
             0.077464
                          (GarageYrBlt, BsmtHalfBath)
381
             0.077464
                          (BsmtHalfBath, GarageYrBlt)
       315
             0.076444
                               (FullBath, BsmtFinSF2)
382
       327
383
        93
             0.076444
                               (BsmtFinSF2, FullBath)
384
       693
            0.075418
                           (ScreenPorch, GarageYrBlt)
                           (GarageYrBlt, ScreenPorch)
385
       511
             0.075418
             0.074304
                           (ScreenPorch, OpenPorchSF)
386
       697
387
            0.074304
                           (OpenPorchSF, ScreenPorch)
       619
                            (WoodDeckSF, ScreenPorch)
388
       592
             0.074181
389
                            (ScreenPorch, WoodDeckSF)
       696
             0.074181
390
       593
             0.073378
                               (WoodDeckSF, PoolArea)
391
       723
            0.073378
                               (PoolArea, WoodDeckSF)
392
                              (ScreenPorch, HalfBath)
       688
             0.072426
393
       376
             0.072426
                              (HalfBath, ScreenPorch)
                           (BsmtHalfBath, BsmtFinSF2)
394
       300
            0.070948
395
                           (BsmtFinSF2, BsmtHalfBath)
        92
            0.070948
                              (2ndFlrSF, GarageYrBlt)
396
       207
             0.070832
                              (GarageYrBlt, 2ndFlrSF)
397
       493
             0.070832
                             (BedroomAbvGr, PoolArea)
398
       404
             0.070703
399
       716
             0.070703
                             (PoolArea, BedroomAbvGr)
400
        18
             0.070250
                           (LotFrontage, GarageYrBlt)
401
             0.070250
                           (GarageYrBlt, LotFrontage)
       486
402
       609
             0.070091
                          (OpenPorchSF, KitchenAbvGr)
                          (KitchenAbvGr, OpenPorchSF)
403
       427
             0.070091
404
                             (3SsnPorch, LotFrontage)
       648
             0.070029
                             (LotFrontage, 3SsnPorch)
405
        24
             0.070029
406
       410
             0.068901
                          (KitchenAbvGr, TotalBsmtSF)
407
             0.068901
                          (TotalBsmtSF, KitchenAbvGr)
       150
408
       366
             0.068263
                             (HalfBath, KitchenAbvGr)
409
                             (KitchenAbvGr, HalfBath)
       418
             0.068263
                             (1stFlrSF, KitchenAbvGr)
410
       177
             0.068101
411
       411
             0.068101
                             (KitchenAbvGr, 1stFlrSF)
```

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412
       570
            0.067898
                             (WoodDeckSF, BsmtFinSF2)
413
       102
                             (BsmtFinSF2, WoodDeckSF)
             0.067898
414
       296
             0.067616
                             (BsmtFullBath, PoolArea)
415
       712
             0.067616
                             (PoolArea, BsmtFullBath)
416
                           (GarageArea, LowQualFinSF)
       548
             0.067601
                           (LowQualFinSF, GarageArea)
417
       236
             0.067601
                           (BsmtHalfBath, BsmtFinSF1)
418
       299
             0.067418
419
        65
             0.067418
                           (BsmtFinSF1, BsmtHalfBath)
420
                          (BsmtFullBath, OpenPorchSF)
       292
             0.067341
421
                          (OpenPorchSF, BsmtFullBath)
       604
             0.067341
422
       627
             0.065292
                            (EnclosedPorch, 1stFlrSF)
423
             0.065292
                            (1stFlrSF, EnclosedPorch)
       185
424
       398
             0.065253
                           (BedroomAbvGr, GarageArea)
425
       554
             0.065253
                           (GarageArea, BedroomAbvGr)
426
       500
             0.064518
                          (GarageYrBlt, BedroomAbvGr)
                          (BedroomAbvGr, GarageYrBlt)
427
       396
            0.064518
428
                             (BsmtFullBath, FullBath)
       282
             0.064512
429
                             (FullBath, BsmtFullBath)
       334
             0.064512
430
        62
             0.064503
                           (BsmtFinSF1, LowQualFinSF)
431
             0.064503
                           (LowQualFinSF, BsmtFinSF1)
       218
432
       555
             0.064433
                           (GarageArea, KitchenAbvGr)
                           (KitchenAbvGr, GarageArea)
433
       425
             0.064433
434
                             (2ndFlrSF, LowQualFinSF)
       197
             0.063353
                             (LowQualFinSF, 2ndFlrSF)
435
       223
             0.063353
436
                             (PoolArea, LowQualFinSF)
       710
             0.062157
437
       242
             0.062157
                             (LowQualFinSF, PoolArea)
438
       677
             0.062021
                            (ScreenPorch, BsmtFinSF1)
439
        79
                            (BsmtFinSF1, ScreenPorch)
             0.062021
440
       628
             0.061989
                            (EnclosedPorch, 2ndFlrSF)
441
                            (2ndFlrSF, EnclosedPorch)
       212
             0.061989
442
                        (LowQualFinSF, EnclosedPorch)
       239
             0.061081
                        (EnclosedPorch, LowQualFinSF)
443
       629
             0.061081
444
                               (PoolArea, GarageArea)
       722
             0.061047
445
       566
             0.061047
                               (GarageArea, PoolArea)
446
             0.060762
                              (OpenPorchSF, PoolArea)
       620
447
       724
             0.060762
                              (PoolArea, OpenPorchSF)
448
                          (ScreenPorch, TotRmsAbvGrd)
       691
             0.059383
449
       457
                          (TotRmsAbvGrd, ScreenPorch)
             0.059383
                             (2ndFlrSF, KitchenAbvGr)
450
       204
             0.059306
451
                             (KitchenAbvGr, 2ndFlrSF)
       412
             0.059306
452
                            (OpenPorchSF, WoodDeckSF)
       615
             0.058661
453
       589
             0.058661
                            (WoodDeckSF, OpenPorchSF)
454
                               (BsmtFinSF1, FullBath)
        66
             0.058543
455
       326
             0.058543
                               (FullBath, BsmtFinSF1)
456
                                (1stFlrSF, 3SsnPorch)
       186
             0.056104
                                (3SsnPorch, 1stFlrSF)
457
       654
             0.056104
458
       309
             0.054536
                             (BsmtHalfBath, FullBath)
```

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459
       335
             0.054536
                             (FullBath, BsmtHalfBath)
460
       647
                            (EnclosedPorch, PoolArea)
             0.054203
461
       725
             0.054203
                            (PoolArea, EnclosedPorch)
462
       351
             0.053532
                              (HalfBath, LotFrontage)
463
                              (LotFrontage, HalfBath)
        13
             0.053532
464
       442
             0.053275
                         (TotRmsAbvGrd, BsmtFullBath)
                         (BsmtFullBath, TotRmsAbvGrd)
465
       286
             0.053275
                          (ScreenPorch, KitchenAbvGr)
466
       690
             0.051613
                          (KitchenAbvGr, ScreenPorch)
467
       430
             0.051613
468
                              (BsmtUnfSF, Fireplaces)
       125
             0.051575
                              (Fireplaces, BsmtUnfSF)
469
       463
             0.051575
470
       695
             0.051412
                            (ScreenPorch, GarageArea)
471
       565
             0.051412
                            (GarageArea, ScreenPorch)
472
       727
             0.051307
                              (PoolArea, ScreenPorch)
                              (ScreenPorch, PoolArea)
473
       701
             0.051307
474
        34
             0.050986
                                   (LotArea, 2ndFlrSF)
                                   (2ndFlrSF, LotArea)
475
       190
             0.050986
476
                           (GarageCars, KitchenAbvGr)
       528
             0.050634
477
       424
             0.050634
                           (KitchenAbvGr, GarageCars)
478
       694
             0.050494
                            (ScreenPorch, GarageCars)
479
                            (GarageCars, ScreenPorch)
       538
             0.050494
480
                          (TotalBsmtSF, BedroomAbvGr)
       149
             0.050450
481
                          (BedroomAbvGr, TotalBsmtSF)
       383
             0.050450
482
                             (BsmtFinSF1, BsmtFinSF2)
        57
             0.050117
483
        83
                             (BsmtFinSF2, BsmtFinSF1)
             0.050117
484
       293
             0.049911
                        (BsmtFullBath, EnclosedPorch)
                        (EnclosedPorch, BsmtFullBath)
             0.049911
485
       631
486
         3
             0.049900
                            (LotFrontage, BsmtFinSF2)
487
        81
             0.049900
                            (BsmtFinSF2, LotFrontage)
488
                                  (PoolArea, FullBath)
       714
             0.049604
489
                                  (FullBath, PoolArea)
       350
             0.049604
                              (TotalBsmtSF, HalfBath)
490
       148
             0.048804
491
                              (HalfBath, TotalBsmtSF)
       356
             0.048804
492
       298
             0.048046
                              (BsmtHalfBath, LotArea)
                              (LotArea, BsmtHalfBath)
493
             0.048046
        38
494
       278
             0.047143
                         (BsmtFullBath, LowQualFinSF)
495
       226
             0.047143
                         (LowQualFinSF, BsmtFullBath)
                             (BsmtFinSF2, Fireplaces)
496
        98
             0.046921
                             (Fireplaces, BsmtFinSF2)
497
       462
             0.046921
498
                           (WoodDeckSF, BedroomAbvGr)
       581
             0.046854
                           (BedroomAbvGr, WoodDeckSF)
499
       399
             0.046854
500
       477
             0.046822
                            (Fireplaces, GarageYrBlt)
501
             0.046822
                            (GarageYrBlt, Fireplaces)
       503
502
       389
             0.046519
                         (BedroomAbvGr, BsmtHalfBath)
503
                         (BsmtHalfBath, BedroomAbvGr)
             0.046519
       311
                           (BsmtFinSF1, TotRmsAbvGrd)
504
        70
             0.044316
505
       434
             0.044316
                           (TotRmsAbvGrd, BsmtFinSF1)
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506
       403
            0.044300
                          (BedroomAbvGr, ScreenPorch)
                          (ScreenPorch, BedroomAbvGr)
507
       689
            0.044300
508
        52
             0.043160
                               (LotArea, ScreenPorch)
509
       676
             0.043160
                               (ScreenPorch, LotArea)
510
                               (BsmtFinSF2, PoolArea)
       107
             0.041709
511
       705
             0.041709
                               (PoolArea, BsmtFinSF2)
512
                        (EnclosedPorch, BedroomAbvGr)
       635
             0.041570
513
       401
             0.041570
                        (BedroomAbvGr, EnclosedPorch)
                         (BsmtFullBath, KitchenAbvGr)
514
       285
            0.041503
                         (KitchenAbvGr, BsmtFullBath)
515
       415
             0.041503
                           (ScreenPorch, LotFrontage)
516
       675
             0.041383
517
             0.041383
                           (LotFrontage, ScreenPorch)
        25
518
       355
            0.041118
                                (HalfBath, BsmtUnfSF)
519
       121
             0.041118
                                (BsmtUnfSF, HalfBath)
                           (KitchenAbvGr, BsmtFinSF2)
520
       408
             0.040751
                           (BsmtFinSF2, KitchenAbvGr)
521
        96
            0.040751
522
            0.040606
                              (2ndFlrSF, ScreenPorch)
       214
523
                              (ScreenPorch, 2ndFlrSF)
       682
             0.040606
524
       578
             0.040161
                           (WoodDeckSF, BsmtHalfBath)
525
                           (BsmtHalfBath, WoodDeckSF)
       318
             0.040161
526
         8
             0.038469
                          (LotFrontage, LowQualFinSF)
       216
                          (LowQualFinSF, LotFrontage)
527
             0.038469
528
            0.038264
                             (BsmtFinSF2, GarageCars)
       100
                             (GarageCars, BsmtFinSF2)
529
       516
             0.038264
530
                         (KitchenAbvGr, BsmtHalfBath)
       416
             0.037944
531
       312
             0.037944
                         (BsmtHalfBath, KitchenAbvGr)
                             (3SsnPorch, TotalBsmtSF)
532
       653
            0.037384
             0.037384
                             (TotalBsmtSF, 3SsnPorch)
533
       159
534
       636
             0.037312
                        (EnclosedPorch, KitchenAbvGr)
                        (KitchenAbvGr, EnclosedPorch)
535
       428
            0.037312
                           (3SsnPorch, EnclosedPorch)
536
       671
             0.037305
                           (EnclosedPorch, 3SsnPorch)
537
       645
             0.037305
                          (EnclosedPorch, BsmtFinSF2)
538
       624
             0.036543
539
       104
             0.036543
                          (BsmtFinSF2, EnclosedPorch)
540
             0.036363
                          (LowQualFinSF, GarageYrBlt)
       234
541
       494
             0.036363
                          (GarageYrBlt, LowQualFinSF)
542
                              (GarageCars, 3SsnPorch)
       537
             0.035765
543
       667
                              (3SsnPorch, GarageCars)
             0.035765
                                (3SsnPorch, FullBath)
544
       660
             0.035353
                                (FullBath, 3SsnPorch)
545
       348
             0.035353
                           (BsmtFinSF2, TotRmsAbvGrd)
546
        97
             0.035227
547
       435
             0.035227
                           (TotRmsAbvGrd, BsmtFinSF2)
548
            0.035114
                            (3SsnPorch, BsmtHalfBath)
       659
549
       321
             0.035114
                            (BsmtHalfBath, 3SsnPorch)
550
                                (PoolArea, BsmtUnfSF)
       706
            0.035092
                                (BsmtUnfSF, PoolArea)
551
       134
             0.035092
552
       564
             0.035087
                              (GarageArea, 3SsnPorch)
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553
       668
             0.035087
                              (3SsnPorch, GarageArea)
554
                            (BsmtFullBath, GrLivArea)
       279
             0.034836
555
       253
             0.034836
                            (GrLivArea, BsmtFullBath)
                          (LowQualFinSF, TotalBsmtSF)
556
       221
             0.033245
             0.033245
                          (TotalBsmtSF, LowQualFinSF)
557
       143
                              (WoodDeckSF, 3SsnPorch)
558
       591
             0.032771
                              (3SsnPorch, WoodDeckSF)
559
       669
             0.032771
560
        94
             0.032148
                               (BsmtFinSF2, HalfBath)
                               (HalfBath, BsmtFinSF2)
561
       354
             0.032148
562
                          (ScreenPorch, BsmtHalfBath)
       686
             0.032121
                          (BsmtHalfBath, ScreenPorch)
563
       322
             0.032121
564
       699
             0.031436
                             (ScreenPorch, 3SsnPorch)
565
       673
             0.031436
                             (3SsnPorch, ScreenPorch)
566
       283
             0.030905
                             (BsmtFullBath, HalfBath)
                             (HalfBath, BsmtFullBath)
567
       361
             0.030905
                            (BsmtUnfSF, KitchenAbvGr)
568
       123
             0.030086
569
       409
                            (KitchenAbvGr, BsmtUnfSF)
             0.030086
570
                              (3SsnPorch, BsmtFinSF2)
       651
             0.029993
571
       105
             0.029993
                              (BsmtFinSF2, 3SsnPorch)
572
                           (BsmtHalfBath, Fireplaces)
       314
             0.028976
                           (Fireplaces, BsmtHalfBath)
573
       470
             0.028976
                            (BsmtUnfSF, LowQualFinSF)
574
       116
             0.028167
       220
             0.028167
                            (LowQualFinSF, BsmtUnfSF)
575
                             (HalfBath, LowQualFinSF)
576
       359
             0.027080
577
                             (LowQualFinSF, HalfBath)
       229
             0.027080
578
       241
             0.026799
                          (LowQualFinSF, ScreenPorch)
579
       683
             0.026799
                          (ScreenPorch, LowQualFinSF)
580
                              (3SsnPorch, BsmtFinSF1)
       650
             0.026451
581
        78
             0.026451
                              (BsmtFinSF1, 3SsnPorch)
             0.025444
                           (LowQualFinSF, WoodDeckSF)
582
       237
583
                           (WoodDeckSF, LowQualFinSF)
       575
             0.025444
                          (OpenPorchSF, BsmtHalfBath)
584
       605
             0.025324
585
                          (BsmtHalfBath, OpenPorchSF)
       319
             0.025324
                               (LotArea, GarageYrBlt)
586
        45
             0.024947
587
       487
             0.024947
                               (GarageYrBlt, LotArea)
588
       638
             0.024822
                          (EnclosedPorch, Fireplaces)
             0.024822
                          (Fireplaces, EnclosedPorch)
589
       482
590
       663
             0.024600
                            (3SsnPorch, KitchenAbvGr)
                            (KitchenAbvGr, 3SsnPorch)
591
       429
             0.024600
592
                           (BsmtHalfBath, GarageArea)
       317
             0.024536
593
                           (GarageArea, BsmtHalfBath)
       551
             0.024536
594
       402
             0.024478
                            (BedroomAbvGr, 3SsnPorch)
595
                            (3SsnPorch, BedroomAbvGr)
       662
             0.024478
596
       213
             0.024358
                                (2ndFlrSF, 3SsnPorch)
597
                                (3SsnPorch, 2ndFlrSF)
       655
             0.024358
                             (BsmtHalfBath, 2ndFlrSF)
598
       304
             0.023855
                             (2ndFlrSF, BsmtHalfBath)
599
       200
             0.023855
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600
       443
            0.023836
                         (TotRmsAbvGrd, BsmtHalfBath)
                         (BsmtHalfBath, TotRmsAbvGrd)
601
       313
            0.023836
                             (3SsnPorch, GarageYrBlt)
602
       666
             0.023544
                             (GarageYrBlt, 3SsnPorch)
603
       510
            0.023544
604
             0.023148
                          (BsmtFullBath, ScreenPorch)
       295
605
       685
             0.023148
                          (ScreenPorch, BsmtFullBath)
             0.022381
                                 (PoolArea, HalfBath)
606
       715
607
       377
             0.022381
                                 (HalfBath, PoolArea)
                           (Fireplaces, LowQualFinSF)
608
       467
             0.021272
609
       233
                           (LowQualFinSF, Fireplaces)
             0.021272
                               (GarageCars, PoolArea)
610
       539
             0.020934
611
       721
             0.020934
                               (PoolArea, GarageCars)
612
       524
            0.020891
                           (GarageCars, BsmtHalfBath)
613
       316
             0.020891
                           (BsmtHalfBath, GarageCars)
                               (3SsnPorch, BsmtUnfSF)
614
       652
            0.020764
615
       132
            0.020764
                               (BsmtUnfSF, 3SsnPorch)
       657
             0.020643
                               (3SsnPorch, GrLivArea)
616
                               (GrLivArea, 3SsnPorch)
617
       267
             0.020643
618
        51
             0.020423
                                 (LotArea, 3SsnPorch)
619
       649
            0.020423
                                 (3SsnPorch, LotArea)
                             (BsmtHalfBath, PoolArea)
620
       323
             0.020025
621
            0.020025
                             (PoolArea, BsmtHalfBath)
       713
622
            0.018918
                            (BsmtHalfBath, GrLivArea)
       306
623
                            (GrLivArea, BsmtHalfBath)
       254
            0.018918
624
            0.018340
                             (LotArea, EnclosedPorch)
        50
625
       622
             0.018340
                             (EnclosedPorch, LotArea)
626
       238
            0.018251
                          (LowQualFinSF, OpenPorchSF)
627
                          (OpenPorchSF, LowQualFinSF)
       602
            0.018251
628
       101
             0.018227
                             (BsmtFinSF2, GarageArea)
629
                             (GarageArea, BsmtFinSF2)
       543
            0.018227
630
                              (LotArea, KitchenAbvGr)
        42
            0.017784
                              (KitchenAbvGr, LotArea)
631
       406
            0.017784
632
                           (BedroomAbvGr, BsmtFinSF2)
       381
             0.015728
633
        95
            0.015728
                           (BsmtFinSF2, BedroomAbvGr)
634
       219
             0.014807
                           (LowQualFinSF, BsmtFinSF2)
635
        89
             0.014807
                           (BsmtFinSF2, LowQualFinSF)
             0.014525
                             (PoolArea, KitchenAbvGr)
636
       717
637
             0.014525
                             (KitchenAbvGr, PoolArea)
       431
638
       512
            0.014501
                              (GarageYrBlt, PoolArea)
639
                              (PoolArea, GarageYrBlt)
       720
             0.014501
                                  (HalfBath, LotArea)
640
       352
            0.014259
641
        40
            0.014259
                                  (LotArea, HalfBath)
642
            0.014241
                             (1stFlrSF, LowQualFinSF)
       170
643
       222
            0.014241
                             (LowQualFinSF, 1stFlrSF)
644
                             (BsmtUnfSF, ScreenPorch)
       133
            0.012579
                             (ScreenPorch, BsmtUnfSF)
645
       679
             0.012579
646
       362
            0.012340
                             (HalfBath, BsmtHalfBath)
```

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647
       310
            0.012340
                             (BsmtHalfBath, HalfBath)
                              (Fireplaces, 3SsnPorch)
648
       483
            0.011257
649
       665
             0.011257
                              (3SsnPorch, Fireplaces)
                         (EnclosedPorch, LotFrontage)
650
       621
             0.010700
651
            0.010700
                         (LotFrontage, EnclosedPorch)
        23
                              (BsmtFinSF2, GrLivArea)
652
        90
            0.009640
                              (GrLivArea, BsmtFinSF2)
653
       246
             0.009640
654
       266
             0.009113
                           (GrLivArea, EnclosedPorch)
                           (EnclosedPorch, GrLivArea)
655
       630
            0.009113
                        (BsmtHalfBath, EnclosedPorch)
656
       320
             0.008555
                        (EnclosedPorch, BsmtHalfBath)
657
       632
             0.008555
       349
             0.008106
                              (FullBath, ScreenPorch)
658
659
       687
             0.008106
                              (ScreenPorch, FullBath)
660
       726
             0.007992
                                (PoolArea, 3SsnPorch)
                                (3SsnPorch, PoolArea)
661
       674
             0.007992
                         (LowQualFinSF, KitchenAbvGr)
662
       231
             0.007522
                         (KitchenAbvGr, LowQualFinSF)
663
            0.007522
       413
             0.007234
                          (LotFrontage, BsmtHalfBath)
664
        11
665
       297
             0.007234
                          (BsmtHalfBath, LotFrontage)
666
       456
            0.006683
                            (TotRmsAbvGrd, 3SsnPorch)
667
       664
             0.006683
                            (3SsnPorch, TotRmsAbvGrd)
             0.006069
                          (LotFrontage, KitchenAbvGr)
668
        15
                          (KitchenAbvGr, LotFrontage)
669
       405
             0.006069
                             (OpenPorchSF, 3SsnPorch)
670
       618
            0.005842
671
       670
             0.005842
                             (3SsnPorch, OpenPorchSF)
672
       305
             0.005842
                         (BsmtHalfBath, LowQualFinSF)
                         (LowQualFinSF, BsmtHalfBath)
673
       227
             0.005842
674
             0.005316
                              (BsmtUnfSF, WoodDeckSF)
       129
675
       571
             0.005316
                              (WoodDeckSF, BsmtUnfSF)
                                (HalfBath, 3SsnPorch)
676
       375
            0.004972
677
                                (3SsnPorch, HalfBath)
       661
             0.004972
678
                              (LotArea, LowQualFinSF)
        35
             0.004779
                              (LowQualFinSF, LotArea)
679
       217
             0.004779
                                (BsmtUnfSF, 2ndFlrSF)
680
       115
             0.004469
681
       193
             0.004469
                                (2ndFlrSF, BsmtUnfSF)
682
       240
             0.004296
                            (LowQualFinSF, 3SsnPorch)
683
                            (3SsnPorch, LowQualFinSF)
       656
             0.004296
684
       353
             0.004262
                               (HalfBath, BsmtFinSF1)
                               (BsmtFinSF1, HalfBath)
685
        67
             0.004262
             0.004151
                        (TotRmsAbvGrd, EnclosedPorch)
686
       455
                        (EnclosedPorch, TotRmsAbvGrd)
687
       637
             0.004151
688
       597
             0.003093
                            (OpenPorchSF, BsmtFinSF2)
689
            0.003093
                            (BsmtFinSF2, OpenPorchSF)
       103
690
       109
            0.002618
                                 (BsmtUnfSF, LotArea)
691
             0.002618
                                 (LotArea, BsmtUnfSF)
        31
                           (EnclosedPorch, BsmtUnfSF)
692
       625
             0.002538
                           (BsmtUnfSF, EnclosedPorch)
693
       131
             0.002538
```

```
694
       173 0.001956
                           (1stFlrSF, BsmtHalfBath)
                           (BsmtHalfBath, 1stFlrSF)
695
       303 0.001956
696
       228 0.000710
                           (LowQualFinSF, FullBath)
                           (FullBath, LowQualFinSF)
697
       332 0.000710
698
       146 0.000315
                        (TotalBsmtSF, BsmtHalfBath)
                        (BsmtHalfBath, TotalBsmtSF)
699
       302 0.000315
700
                          (3SsnPorch, BsmtFullBath)
       658
            0.000106
                          (BsmtFullBath, 3SsnPorch)
701
       294
            0.000106
```

```
[8]: df1 = df.loc[df[0]>0.75]
df1.drop_duplicates(subset = [0], inplace = True)
```

<ipython-input-8-5ed87f2c7c19>:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy df1.drop_duplicates(subset = [0], inplace = True)

```
[9]: df1.head()
```

```
[9]:
        index
                       0
                                                pairs
     0
          559
                            (GarageArea, GarageCars)
               0.882475
     2
          441
               0.825489
                           (TotRmsAbvGrd, GrLivArea)
     4
                             (1stFlrSF, TotalBsmtSF)
          167
               0.819530
```

Which varibles are highly correlated in the Ames Housing data set?

```
[]: # write answer here

"""

There are three sets of variales that are highly correlated.

Garage Area with Garage Cars, Total Rooms Above Ground with Total Square

Feet of Living Space Above Ground, and First Floor Square Feet with Total

Basement Square Feet.

"""
```

1.6 Make a data decision

Now that you know which variables are correlated with eachother, which would you drop from the dataset?

```
[]: # write answer here
```

```
[]: #__SOLUTIOM__
```

Since three different pairs of variables are highly correlated, the correct approach would be to drop one variable from each pair.

One approach would be to drop Garage Area, Total Rooms, and Total Basement Square Feet.

Garage Area: The size of the garage is dependent on how many cars are in it.

If you wanted to still keep the information captured by Garage Area, you could create a new variable "Average space per car" before dropping Garage Area.

Total Rooms: There are other variables that count the number of kitchens, bathrooms, bedrooms, etc.

Total Basement Square Feet: The first floor of a building is usually built upon the foundation, which contains the basement.

To keep the information that there *is* a basement, you could create a variable "HasBasement", when TotalBsmtSF > 0, before deleting the original variable.

1.7 Address the colinearity

Remove the chosen variables from ames_preprocessed.


```
/opt/anaconda3/envs/learn-env/lib/python3.8/site-
packages/pandas/core/frame.py:4163: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame
```

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy return super().drop(

1.8 Summary

Good job! You got some hands-on practice creating and interpreting a scatter matrix and correlation matrix to identify if variables are collinear in the Ames Housing data set. You also edited the Ames Housing data set so highly correlated variables are removed.