

Project2_3L_NN(Expedia)

April 3, 2022

***** Exploratory Data Analysis *****

----- Displaying head -----

| | id | region | latitude | longitude | accommodation_type | cost | \ |
|---|-------|-----------|----------|-----------|--------------------|------|---|
| 0 | 13232 | Manhattan | 40.71854 | -74.00439 | Entire home/apt | 170 | |
| 1 | 246 | Brooklyn | 40.64446 | -73.95030 | Entire home/apt | 65 | |
| 2 | 19091 | Queens | 40.78573 | -73.81062 | Private room | 85 | |
| 3 | 34305 | Manhattan | 40.73863 | -73.98002 | Private room | 210 | |
| 4 | 444 | Manhattan | 40.82426 | -73.94630 | Shared room | 75 | |

| | minimum_nights | number_of_reviews | reviews_per_month | owner_id | \ |
|---|----------------|-------------------|-------------------|-----------|---|
| 0 | 5 | 7 | 0.56 | 929983 | |
| 1 | 3 | 238 | 2.30 | 281764 | |
| 2 | 1 | 0 | NaN | 19923341 | |
| 3 | 30 | 0 | NaN | 200380610 | |
| 4 | 3 | 38 | 0.42 | 745069 | |

| | owned_hotels | yearly_availability |
|---|--------------|---------------------|
| 0 | 1 | 0 |
| 1 | 1 | 0 |
| 2 | 1 | 1 |
| 3 | 65 | 1 |
| 4 | 3 | 1 |

----- Dimensions of dataset -----

(2870, 12)

----- Contents of dataset -----

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2870 entries, 0 to 2869
Data columns (total 12 columns):
#   Column                Non-Null Count  Dtype
#   :                _____:                _____:
#   0   id                    2870 non-null    int64
#   1   region                2870 non-null    object
#   2   latitude              2870 non-null    float64
#   3   longitude              2870 non-null    float64
#   4   accommodation_type    2870 non-null    object
#   5   cost                  2870 non-null    int64
#   6   minimum_nights        2870 non-null    int64
#   7   number_of_reviews      2870 non-null    int64
#   8   reviews_per_month     2870 non-null    float64
#   9   owner_id              2870 non-null    int64
#   10  owned_hotels           2870 non-null    int64
#   11  yearly_availability    2870 non-null    int64
```

```

---  -----
0   id                2870 non-null   int64
1   region            2870 non-null   object
2   latitude          2870 non-null   float64
3   longitude         2870 non-null   float64
4   accommodation_type 2870 non-null   object
5   cost              2870 non-null   int64
6   minimum_nights    2870 non-null   int64
7   number_of_reviews 2870 non-null   int64
8   reviews_per_month 2194 non-null   float64
9   owner_id          2870 non-null   int64
10  owned_hotels      2870 non-null   int64
11  yearly_availability 2870 non-null   int64

```

dtypes: float64(3), int64(7), object(2)

memory usage: 269.2+ KB

None

----- Summary of Numerical feature -----

| | Feature_name | datatype | Count | min | quartile1 \ |
|---|---------------------|----------|-------|------------|---------------|
| 0 | id | int64 | 2870 | 0.00000 | 1.593175e+04 |
| 1 | latitude | float64 | 2870 | 40.50708 | 4.069246e+01 |
| 2 | longitude | float64 | 2870 | -74.24285 | -7.398400e+01 |
| 3 | cost | int64 | 2870 | 10.00000 | 7.500000e+01 |
| 4 | minimum_nights | int64 | 2870 | 1.00000 | 1.000000e+00 |
| 5 | number_of_reviews | int64 | 2870 | 0.00000 | 1.000000e+00 |
| 6 | reviews_per_month | float64 | 2194 | 0.01000 | 2.400000e-01 |
| 7 | owner_id | int64 | 2870 | 2787.00000 | 7.388002e+06 |
| 8 | owned_hotels | int64 | 2870 | 1.00000 | 1.000000e+00 |
| 9 | yearly_availability | int64 | 2870 | 0.00000 | 0.000000e+00 |

| | Mean | Median | quartile3 | max | Std dev \ |
|---|---------------|---------------|---------------|---------------|-------------|
| 0 | 2.676066e+04 | 2.894650e+04 | 3.847850e+04 | 4.889300e+04 | 14140.93 |
| 1 | 4.073122e+01 | 4.072825e+01 | 4.076266e+01 | 4.089873e+01 | 0.05 |
| 2 | -7.395016e+01 | -7.395672e+01 | -7.393420e+01 | -7.372173e+01 | 0.05 |
| 3 | 1.959432e+02 | 1.200000e+02 | 2.000000e+02 | 9.999000e+03 | 406.18 |
| 4 | 1.153031e+01 | 3.000000e+00 | 6.000000e+00 | 9.990000e+02 | 37.97 |
| 5 | 1.631533e+01 | 4.000000e+00 | 1.600000e+01 | 3.950000e+02 | 32.48 |
| 6 | 1.157502e+00 | 6.500000e-01 | 1.530000e+00 | 1.037000e+01 | 1.36 |
| 7 | 7.202195e+07 | 3.352708e+07 | 1.207625e+08 | 2.738123e+08 | 80765157.57 |
| 8 | 8.411498e+00 | 1.000000e+00 | 3.000000e+00 | 3.270000e+02 | 27.11 |
| 9 | 4.986063e-01 | 0.000000e+00 | 1.000000e+00 | 1.000000e+00 | 0.50 |

| | Skewness | Kurtosis | Range | IQR | skewness comment \ |
|---|----------|----------|--------------|--------------|----------------------------|
| 0 | -0.31 | -1.08 | 4.889300e+04 | 2.254675e+04 | Fairly symmetric(negative) |
| 1 | 0.17 | 0.21 | 3.916500e-01 | 7.019500e-02 | Fairly symmetric(positive) |

| | | | | | |
|---|-------|--------|--------------|--------------|----------------------------|
| 2 | 1.36 | 4.43 | 5.211200e-01 | 4.980000e-02 | High positive skewed |
| 3 | 13.01 | 232.35 | 9.989000e+03 | 1.250000e+02 | High positive skewed |
| 4 | 11.87 | 210.77 | 9.980000e+02 | 5.000000e+00 | High positive skewed |
| 5 | 4.27 | 25.44 | 3.950000e+02 | 1.500000e+01 | High positive skewed |
| 6 | 2.16 | 5.81 | 1.036000e+01 | 1.290000e+00 | High positive skewed |
| 7 | 1.05 | -0.25 | 2.738095e+08 | 1.133744e+08 | High positive skewed |
| 8 | 6.95 | 62.60 | 3.260000e+02 | 2.000000e+00 | High positive skewed |
| 9 | 0.01 | -2.00 | 1.000000e+00 | 1.000000e+00 | Fairly symmetric(positive) |

outlier comment

| | |
|---|--------------|
| 0 | No outliers |
| 1 | Has outliers |
| 2 | Has outliers |
| 3 | Has outliers |
| 4 | Has outliers |
| 5 | Has outliers |
| 6 | Has outliers |
| 7 | No outliers |
| 8 | Has outliers |
| 9 | No outliers |

<class 'pandas.core.frame.DataFrame'>

RangeIndex: 2870 entries, 0 to 2869

Data columns (total 10 columns):

| # | Column | Non-Null Count | Dtype |
|---|---------------------|----------------|---------|
| 0 | region | 2870 non-null | object |
| 1 | latitude | 2870 non-null | float64 |
| 2 | longitude | 2870 non-null | float64 |
| 3 | accommodation_type | 2870 non-null | object |
| 4 | cost | 2870 non-null | int64 |
| 5 | minimum_nights | 2870 non-null | int64 |
| 6 | number_of_reviews | 2870 non-null | int64 |
| 7 | reviews_per_month | 2194 non-null | float64 |
| 8 | owned_hotels | 2870 non-null | int64 |
| 9 | yearly_availability | 2870 non-null | int64 |

dtypes: float64(3), int64(5), object(2)

memory usage: 224.3+ KB

----- Summary of Numerical feature -----

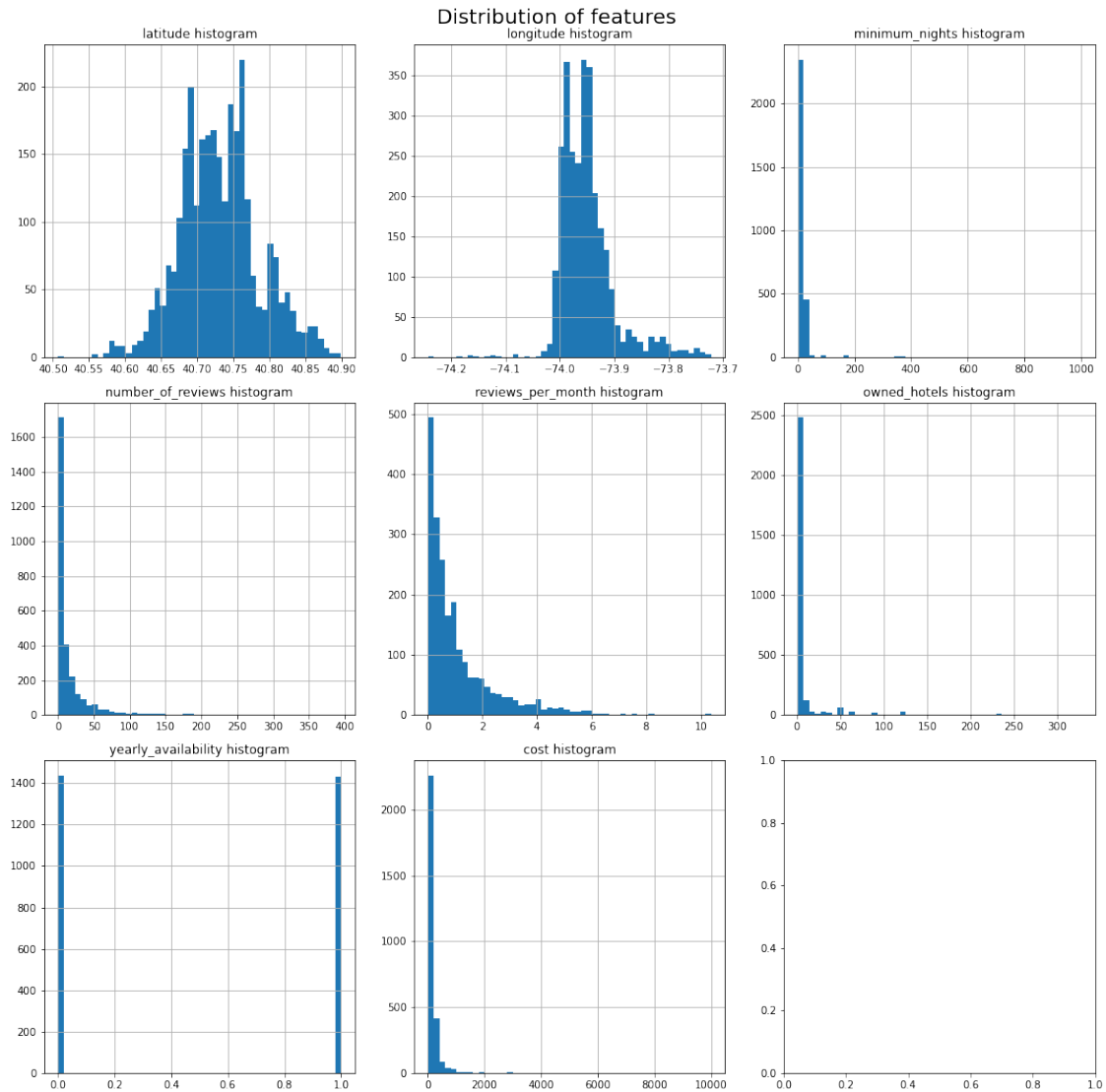
| | Feature_name | datatype | Count | min | quartile1 | Mean \ |
|---|-------------------|----------|-------|-----------|------------|------------|
| 0 | latitude | float64 | 2870 | 40.50708 | 40.692463 | 40.731224 |
| 1 | longitude | float64 | 2870 | -74.24285 | -73.984003 | -73.950158 |
| 2 | cost | int64 | 2870 | 10.00000 | 75.000000 | 195.943206 |
| 3 | minimum_nights | int64 | 2870 | 1.00000 | 1.000000 | 11.530314 |
| 4 | number_of_reviews | int64 | 2870 | 0.00000 | 1.000000 | 16.315331 |

| | | | | | | |
|---|---------------------|---------|------|---------|----------|----------|
| 5 | reviews_per_month | float64 | 2194 | 0.01000 | 0.240000 | 1.157502 |
| 6 | owned_hotels | int64 | 2870 | 1.00000 | 1.000000 | 8.411498 |
| 7 | yearly_availability | int64 | 2870 | 0.00000 | 0.000000 | 0.498606 |

| | Median | quartile3 | max | Std dev | Skewness | Kurtosis | Range \ |
|---|-----------|------------|------------|---------|----------|----------|------------|
| 0 | 40.72825 | 40.762658 | 40.89873 | 0.05 | 0.17 | 0.21 | 0.39165 |
| 1 | -73.95672 | -73.934202 | -73.72173 | 0.05 | 1.36 | 4.43 | 0.52112 |
| 2 | 120.00000 | 200.000000 | 9999.00000 | 406.18 | 13.01 | 232.35 | 9989.00000 |
| 3 | 3.00000 | 6.000000 | 999.00000 | 37.97 | 11.87 | 210.77 | 998.00000 |
| 4 | 4.00000 | 16.000000 | 395.00000 | 32.48 | 4.27 | 25.44 | 395.00000 |
| 5 | 0.65000 | 1.530000 | 10.37000 | 1.36 | 2.16 | 5.81 | 10.36000 |
| 6 | 1.00000 | 3.000000 | 327.00000 | 27.11 | 6.95 | 62.60 | 326.00000 |
| 7 | 0.00000 | 1.000000 | 1.00000 | 0.50 | 0.01 | -2.00 | 1.00000 |

| | IQR | skewness comment | outlier comment |
|---|------------|----------------------------|-----------------|
| 0 | 0.070195 | Fairly symmetric(positive) | Has outilers |
| 1 | 0.049800 | High positive skewed | Has outilers |
| 2 | 125.000000 | High positive skewed | Has outilers |
| 3 | 5.000000 | High positive skewed | Has outilers |
| 4 | 15.000000 | High positive skewed | Has outilers |
| 5 | 1.290000 | High positive skewed | Has outilers |
| 6 | 2.000000 | High positive skewed | Has outilers |
| 7 | 1.000000 | Fairly symmetric(positive) | No outliers |

None



```
[9]: latitude      0
      longitude    0
      minimum_nights 0
      number_of_reviews 0
      reviews_per_month 676
      owned_hotels 0
      yearly_availability 0
      cost         0
      dtype: int64
```

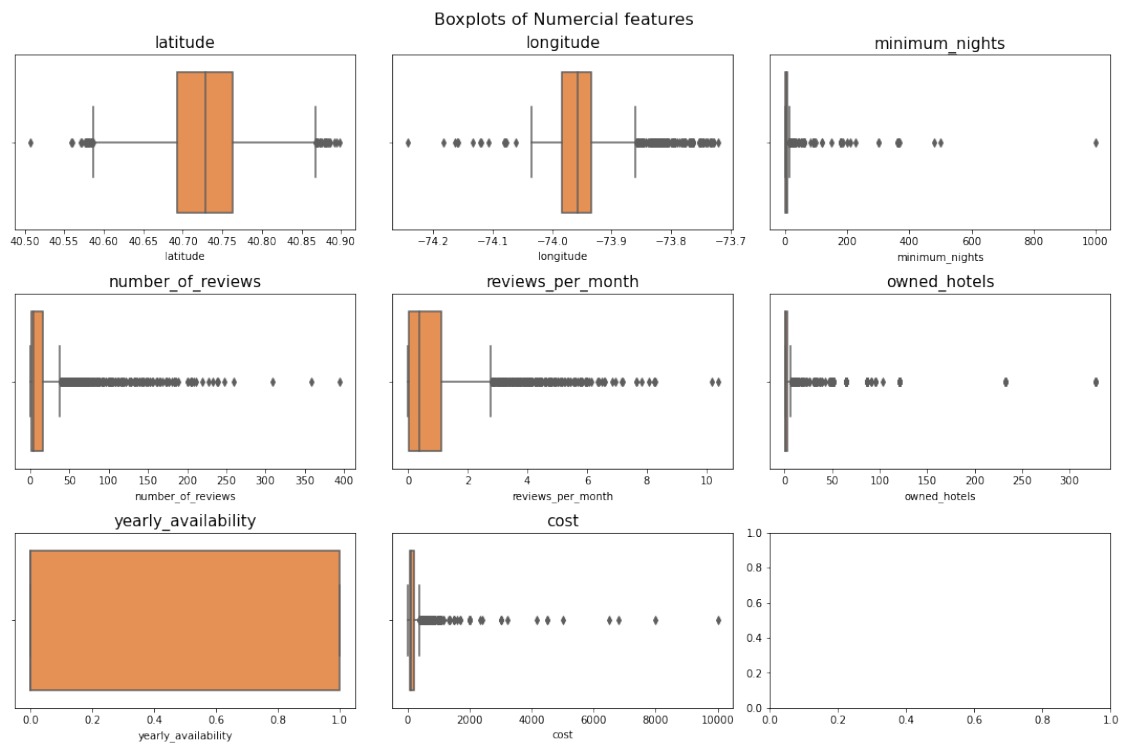
```
[10]: latitude      0
       longitude    0
       minimum_nights 0
```

```

number_of_reviews    0
reviews_per_month    0
owned_hotels         0
yearly_availability  0
cost                 0
dtype: int64

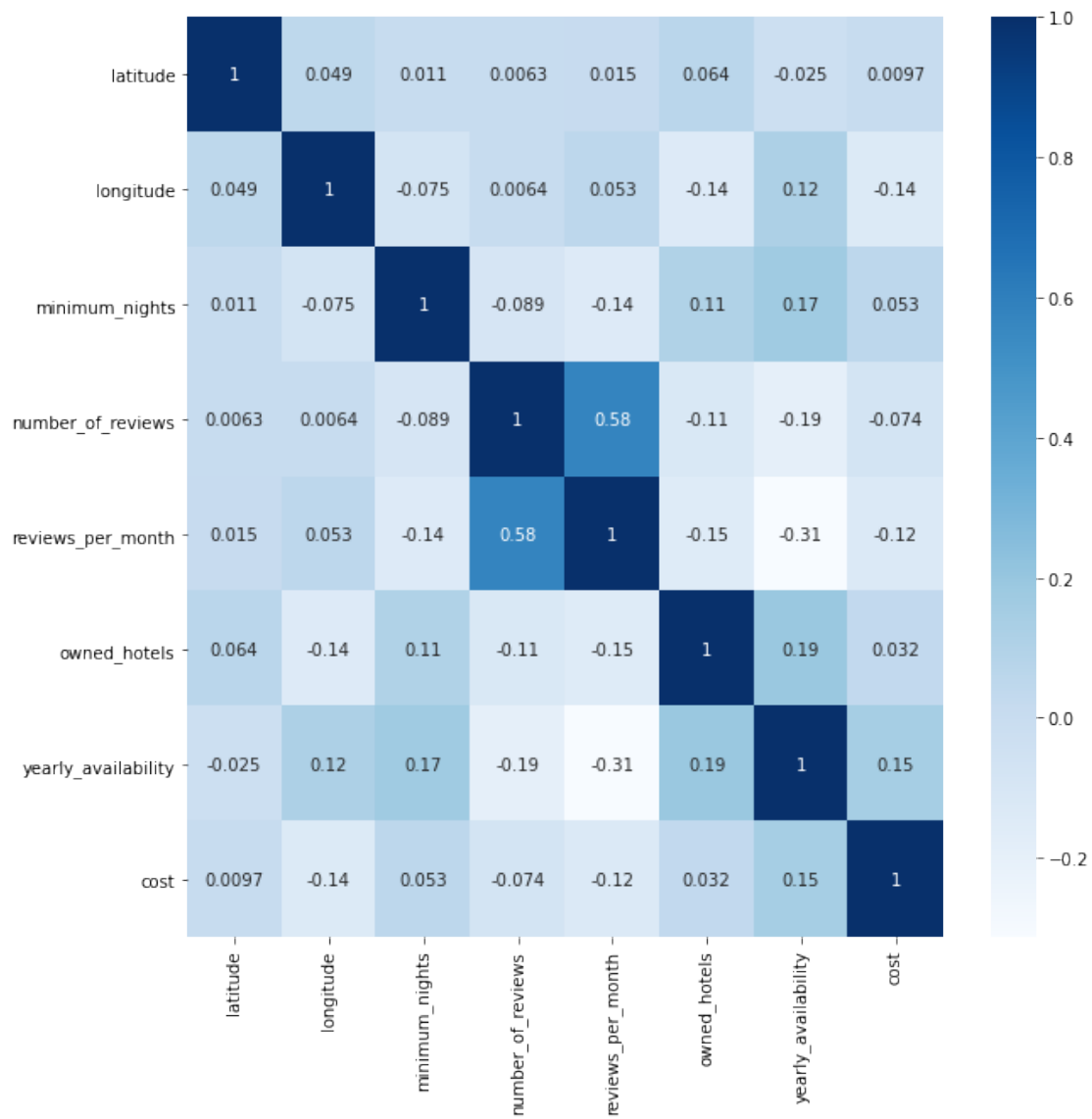
```

None



[12]: <AxesSubplot:>

Correlation Matrix of features



```
[14]:
latitude longitude minimum_nights number_of_reviews \
0 40.71854 -74.00439 5 7
1 40.64446 -73.95030 3 238
2 40.78573 -73.81062 1 0
3 40.73863 -73.98002 30 0
4 40.82426 -73.94630 3 38
...
2865 40.74316 -73.98038 2 0
2866 40.73523 -73.99465 3 2
```

| | | | | |
|------|----------|-----------|----|----|
| 2867 | 40.76619 | -73.98987 | 3 | 17 |
| 2868 | 40.74637 | -73.97207 | 30 | 0 |
| 2869 | 40.79208 | -73.96482 | 30 | 24 |

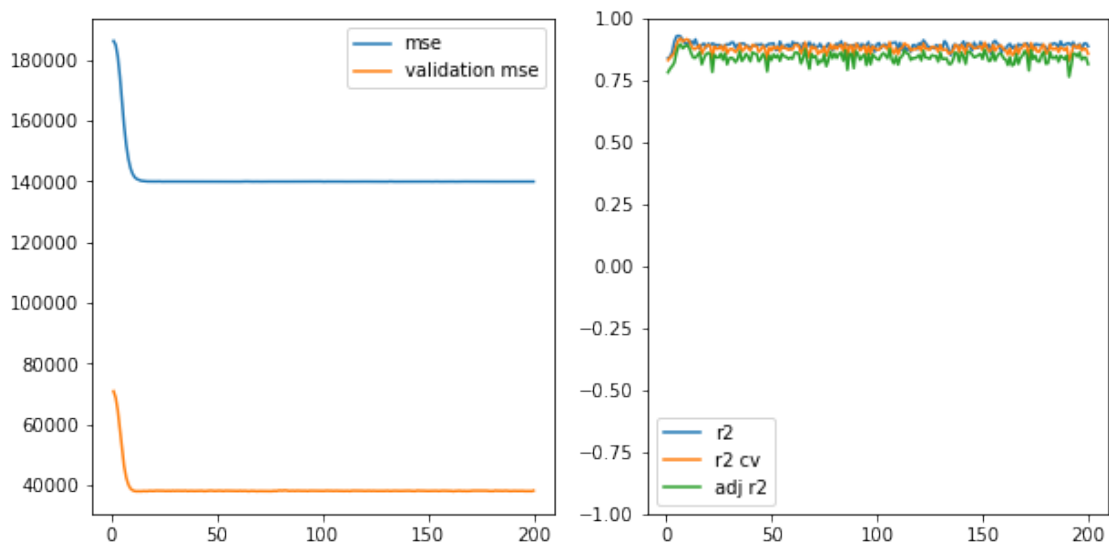
| | reviews_per_month | owned_hotels | yearly_availability | cost |
|------|-------------------|--------------|---------------------|------|
| 0 | 0.56 | 1 | 0 | 170 |
| 1 | 2.30 | 1 | 0 | 65 |
| 2 | 0.00 | 1 | 1 | 85 |
| 3 | 0.00 | 65 | 1 | 210 |
| 4 | 0.42 | 3 | 1 | 75 |
| ... | ... | ... | ... | ... |
| 2865 | 0.00 | 1 | 1 | 400 |
| 2866 | 0.07 | 1 | 1 | 180 |
| 2867 | 0.67 | 1 | 0 | 179 |
| 2868 | 0.00 | 49 | 1 | 200 |
| 2869 | 0.33 | 11 | 1 | 1000 |

[2870 rows x 8 columns]

```
[18]: ['latitude',
        'longitude',
        'number_of_reviews',
        'reviews_per_month',
        'yearly_availability']
```

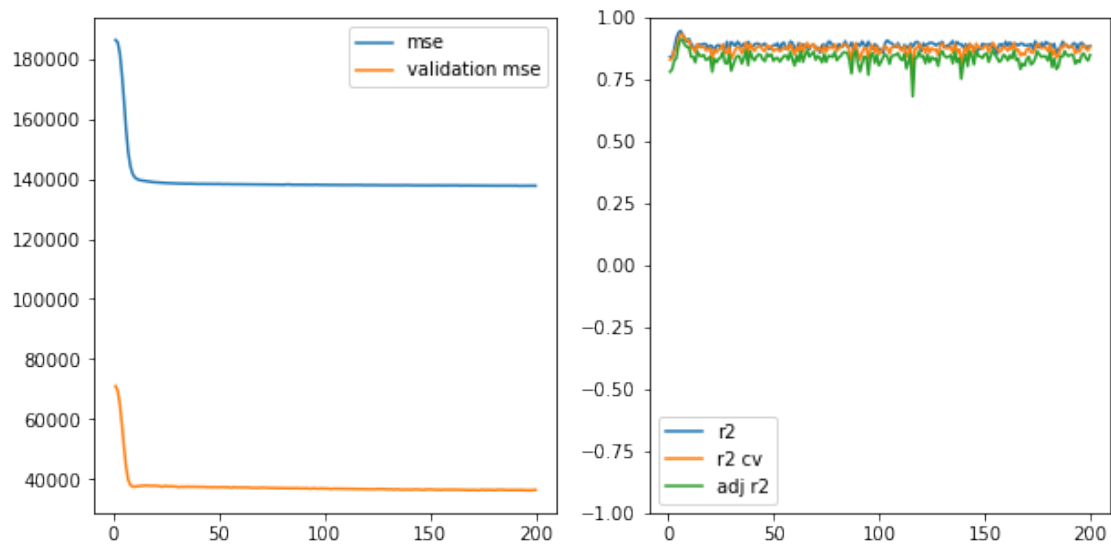
Building Neural nets with linear activation function

3L Neural net with linear activation function



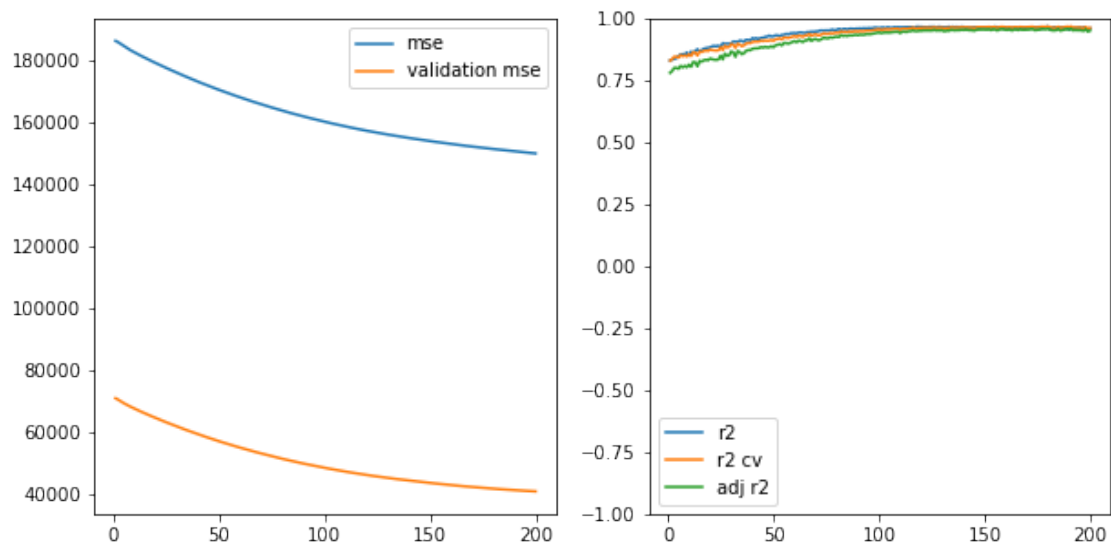
Building Neural nets with relu activation function

3L Neural net with relu activation function



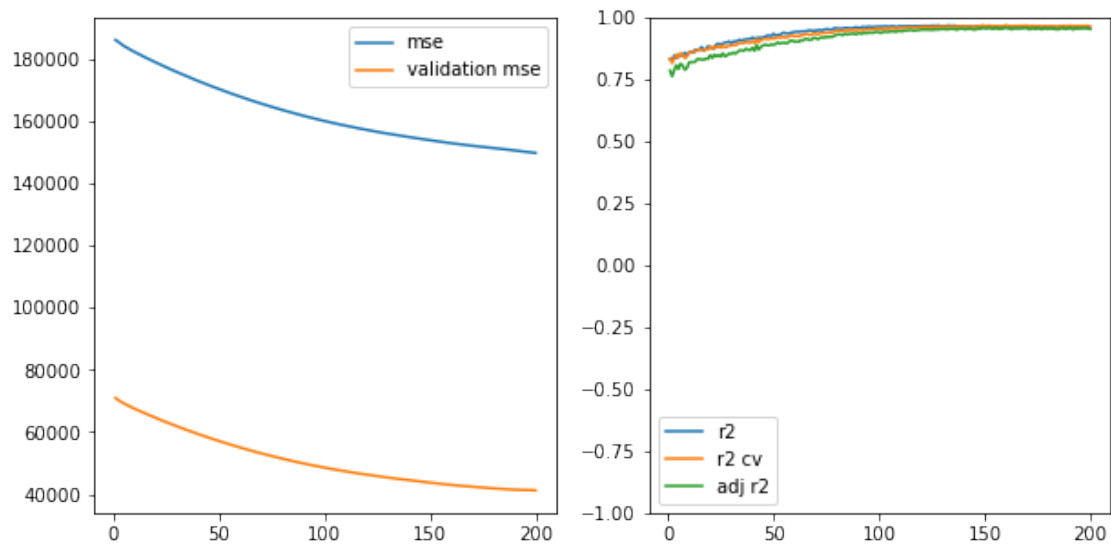
Building Neural nets with sigmoid activation function

3L Neural net with sigmoid activation function



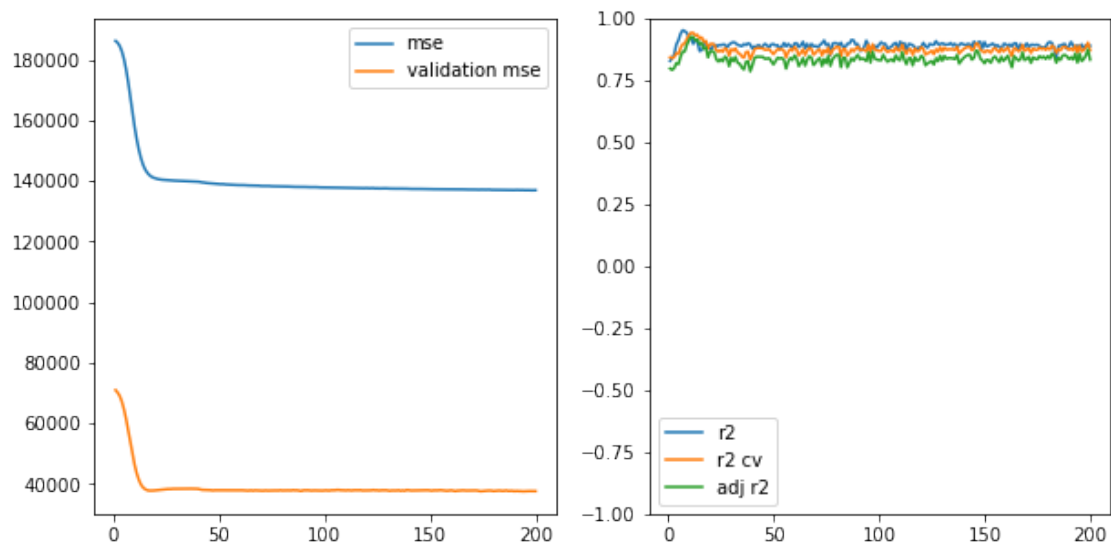
Building Neural nets with tanh activation function

3L Neural net with tanh activation function



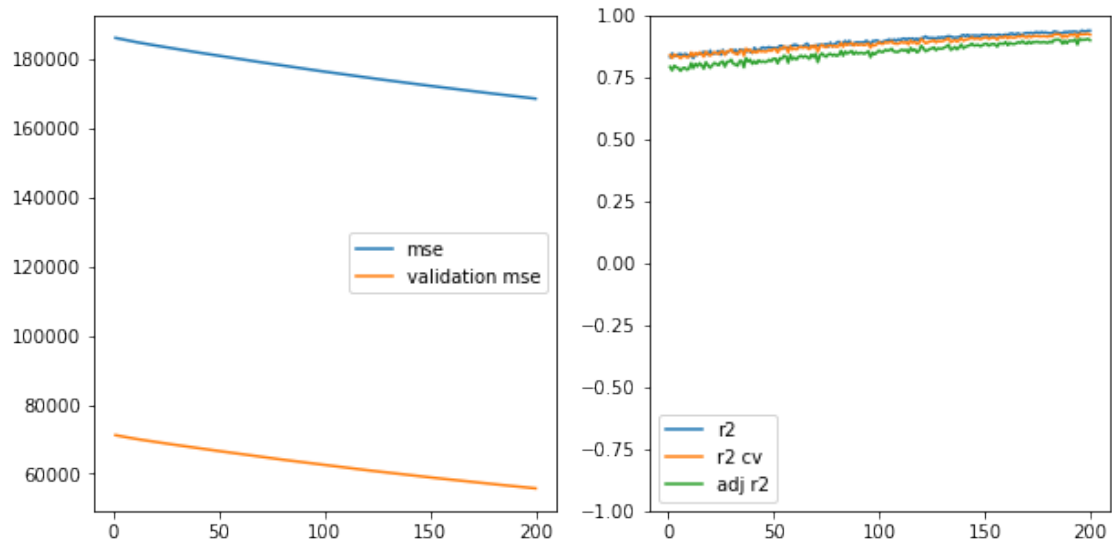
Building Neural nets with elu activation function

3L Neural net with elu activation function



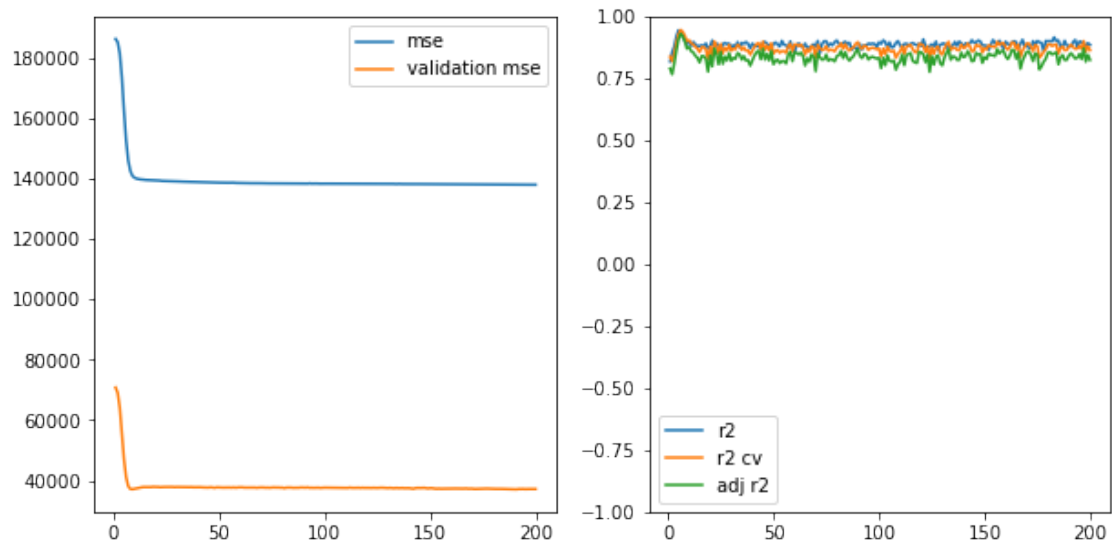
Building Neural nets with softmax activation function

3L Neural net with softmax activation function



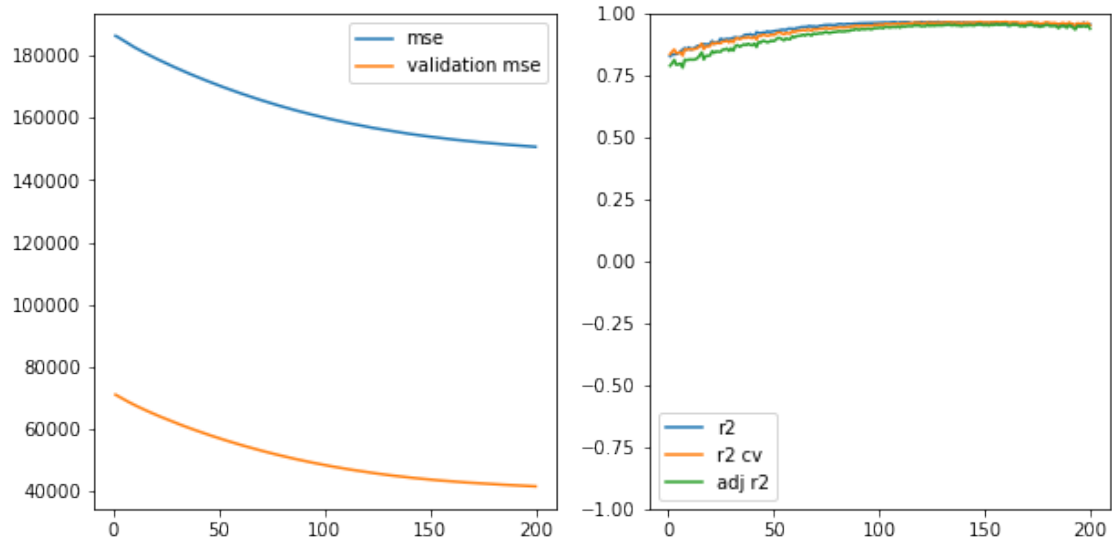
Building Neural nets with softplus activation function

3L Neural net with softplus activation function



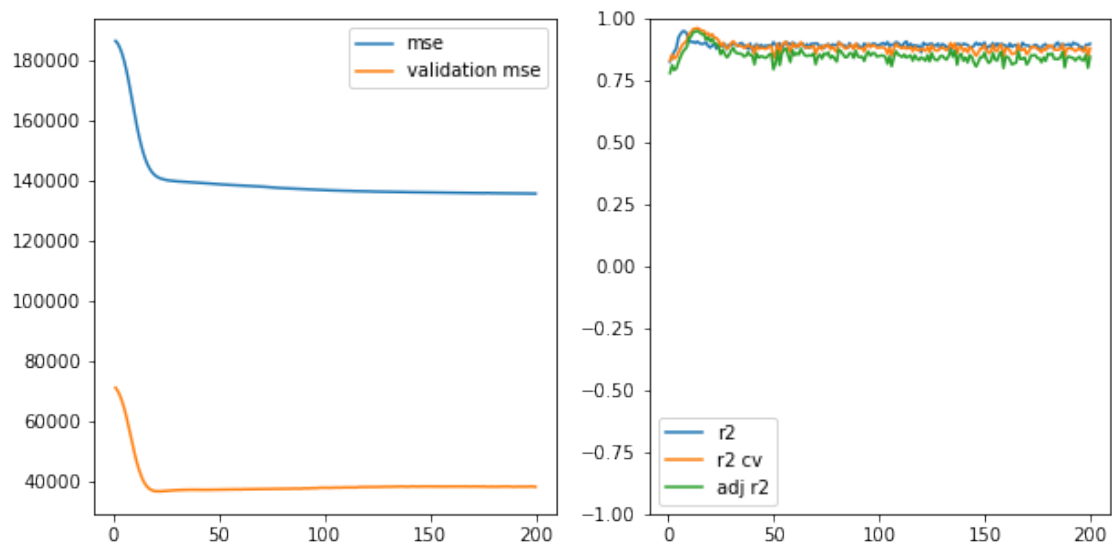
Building Neural nets with softsign activation function

3L Neural net with softsign activation function



Building Neural nets with selu activation function

3L Neural net with selu activation function



Building Neural nets with exponential activation function

***** R2 scores of various activation functions

R2 for NN using linear activation is 4.103879218669126
Adj R2 for NN using linear activation is 3.912374234582594
R2 CV for NN using linear activation is 4.162251719513099

R2 for NN using relu activation is 5.99632274924674
Adj R2 for NN using relu activation is 5.808596983394009
R2 CV for NN using relu activation is 5.922106731234111

R2 for NN using sigmoid activation is 0.08397019808000783
Adj R2 for NN using sigmoid activation is -0.11556256238314244
R2 CV for NN using sigmoid activation is -1.2838785157971877

R2 for NN using tanh activation is -0.021890618552489194
Adj R2 for NN using tanh activation is -0.22163478354211286
R2 CV for NN using tanh activation is -1.228467023926183

R2 for NN using elu activation is 6.766079708935624
Adj R2 for NN using elu activation is 6.579891151190109
R2 CV for NN using elu activation is 7.122269331685304

R2 for NN using softmax activation is -7.963731815602482
Adj R2 for NN using softmax activation is -8.179335873147364
R2 CV for NN using softmax activation is -9.469286332801152

R2 for NN using softplus activation is 5.773359667472933
Adj R2 for NN using softplus activation is 5.5851886433440745
R2 CV for NN using softplus activation is 5.873168402499596

R2 for NN using softsign activation is -0.8099693351650616
Adj R2 for NN using softsign activation is -1.0112872968927933
R2 CV for NN using softsign activation is -1.5426560871556028

R2 for NN using selu activation is 6.357356240894796

Adj R2 for NN using selu activation is 6.170351460547108
R2 CV for NN using selu activation is 1.452417648353499

R2 for NN using exponential activation is 4.8608961979719645
Adj R2 for NN using exponential activation is 4.67090298019458
R2 CV for NN using exponential activation is 6.398381141586129

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[NbConvertApp] Writing 399873 bytes to Project2_3L_NN(Expedia).pdf