Predicting house prices with machine learning

September 9, 2021

1 Data pre-processing

```
[4]: import pandas as pd
     import numpy as np
[5]: train=open('/Users/kaharbawa/Documents/ANAL 535 ML II/train.csv')
     test= open('/Users/kaharbawa/Documents/ANAL 535 ML II/test.csv')
[6]: train=pd.read_csv(train)
     test=pd.read_csv(test)
[9]: train[:2]
[9]:
            MSSubClass MSZoning LotFrontage LotArea Street Alley LotShape \
         1
                     60
                              RL
                                          65.0
                                                    8450
     0
                                                           Pave
                                                                   NaN
                                                                            Reg
     1
         2
                     20
                              RL
                                          0.08
                                                    9600
                                                           Pave
                                                                   NaN
                                                                            Reg
       LandContour Utilities
                               ... PoolArea PoolQC Fence MiscFeature MiscVal MoSold
               Lvl
                       AllPub
                               ...
                                         0
                                              NaN
                                                     NaN
                                                                 NaN
                                                                            0
                                                                                    2
     1
               Lvl
                       AllPub
                                         0
                                              NaN
                                                                 NaN
                                                                            0
                                                                                    5
                                                     NaN
       YrSold
               SaleType
                          SaleCondition SalePrice
     0
         2008
                      WD
                                             208500
                                 Normal
         2007
                      WD
                                  Normal
                                             181500
     [2 rows x 81 columns]
[8]:
      test[:2]
[8]:
          Ιd
              MSSubClass MSZoning
                                    LotFrontage
                                                 LotArea Street Alley LotShape \
        1461
                       20
                                RH
                                            80.0
                                                     11622
                                                                     NaN
                                                             Pave
                                                                              Reg
     1 1462
                       20
                                RL
                                            81.0
                                                     14267
                                                             Pave
                                                                     NaN
                                                                              IR1
       LandContour Utilities
                               ... ScreenPorch PoolArea PoolQC
                                                                Fence MiscFeature
     0
               Lvl
                       AllPub
                                          120
                                                      0
                                                           NaN
                                                                MnPrv
                                                                               NaN
               Lvl
                       AllPub
                                            0
                                                           NaN
                                                                   NaN
                                                                              Gar2
     1
```

```
MiscVal MoSold YrSold SaleType
                                             SaleCondition
      0
               0
                      6
                            2010
                                         WD
                                                     Normal
          12500
                      6
                            2010
                                         WD
                                                     Normal
      [2 rows x 80 columns]
 [7]: target=train['SalePrice']
      train.drop(['SalePrice','Id'], axis=1, inplace=True)
      combined=train.append(test)
      combined.head()
 [8]:
 [8]:
         MSSubClass MSZoning
                               LotFrontage LotArea Street Alley LotShape \
      0
                  60
                            RL
                                        65.0
                                                  8450
                                                         Pave
                                                                 NaN
                                                                           Reg
      1
                  20
                            RL
                                        80.0
                                                  9600
                                                         Pave
                                                                 NaN
                                                                           Reg
                                        68.0
      2
                  60
                            R.T.
                                                 11250
                                                                 NaN
                                                                           IR1
                                                         Pave
      3
                  70
                            RL
                                        60.0
                                                  9550
                                                          Pave
                                                                 NaN
                                                                           IR1
      4
                  60
                            RL
                                        84.0
                                                 14260
                                                         Pave
                                                                 NaN
                                                                           IR1
        LandContour Utilities LotConfig ... PoolArea PoolQC Fence MiscFeature
                 Lvl
                         AllPub
                                    Inside ...
                                                      0
                                                            NaN
                                                                  NaN
                                                                               NaN
                 Lvl
                         AllPub
                                       FR2
                                                      0
                                                            NaN
                                                                               NaN
      1
                                                                  NaN
      2
                 Lvl
                         AllPub
                                    Inside ...
                                                      0
                                                            {\tt NaN}
                                                                  NaN
                                                                               NaN
      3
                 Lvl
                                                            {\tt NaN}
                                                                               NaN
                         AllPub
                                    Corner
                                                      0
                                                                  NaN
      4
                 Lvl
                         AllPub
                                       FR2
                                                      0
                                                            {\tt NaN}
                                                                  NaN
                                                                               NaN
                                  SaleType
        MiscVal MoSold YrSold
                                             SaleCondition Id
      0
               0
                      2
                            2008
                                         WD
                                                     Normal NaN
      1
               0
                      5
                            2007
                                         WD
                                                     Normal NaN
      2
               0
                            2008
                                         WD
                                                     Normal NaN
                      9
      3
               0
                      2
                            2006
                                         WD
                                                    Abnorml NaN
      4
               0
                     12
                            2008
                                         WD
                                                     Normal NaN
      [5 rows x 80 columns]
 [9]: target.head()
 [9]: 0
            208500
            181500
      1
      2
            223500
      3
            140000
      4
            250000
      Name: SalePrice, dtype: int64
      combined.info()
[79]:
```

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

Int64Index: 2919 entries, 0 to 1458
Data columns (total 80 columns):

#	Column	Non-Null Count	Dtype
0	MSSubClass	2919 non-null	int64
1	MSZoning	2915 non-null	object
2	LotFrontage	2433 non-null	float64
3	LotArea	2919 non-null	int64
4	Street	2919 non-null	object
5	Alley	198 non-null	object
6	LotShape	2919 non-null	object
7	LandContour	2919 non-null	object
8	Utilities	2917 non-null	object
9	LotConfig	2919 non-null	object
10	LandSlope	2919 non-null	object
11	Neighborhood	2919 non-null	object
12	Condition1	2919 non-null	object
13	Condition2	2919 non-null	object
14	BldgType	2919 non-null	object
15	HouseStyle	2919 non-null	object
16	OverallQual	2919 non-null	int64
17	OverallCond	2919 non-null	int64
18	YearBuilt	2919 non-null	int64
19	${\tt YearRemodAdd}$	2919 non-null	int64
20	RoofStyle	2919 non-null	object
21	RoofMatl	2919 non-null	object
22	Exterior1st	2918 non-null	object
23	Exterior2nd	2918 non-null	object
24	${ t MasVnrType}$	2895 non-null	object
25	MasVnrArea	2896 non-null	float64
26	ExterQual	2919 non-null	object
27	ExterCond	2919 non-null	object
28	Foundation	2919 non-null	object
29	BsmtQual	2838 non-null	object
30	${\tt BsmtCond}$	2837 non-null	object
31	${\tt BsmtExposure}$	2837 non-null	object
32	${\tt BsmtFinType1}$	2840 non-null	object
33	BsmtFinSF1	2918 non-null	float64
34	${\tt BsmtFinType2}$	2839 non-null	object
35	BsmtFinSF2	2918 non-null	float64
36	BsmtUnfSF	2918 non-null	float64
37	${\tt TotalBsmtSF}$	2918 non-null	float64
38	Heating	2919 non-null	object
39	${\tt HeatingQC}$	2919 non-null	object
40	CentralAir	2919 non-null	object
41	Electrical	2918 non-null	object
42	1stFlrSF	2919 non-null	int64
43	2ndFlrSF	2919 non-null	int64

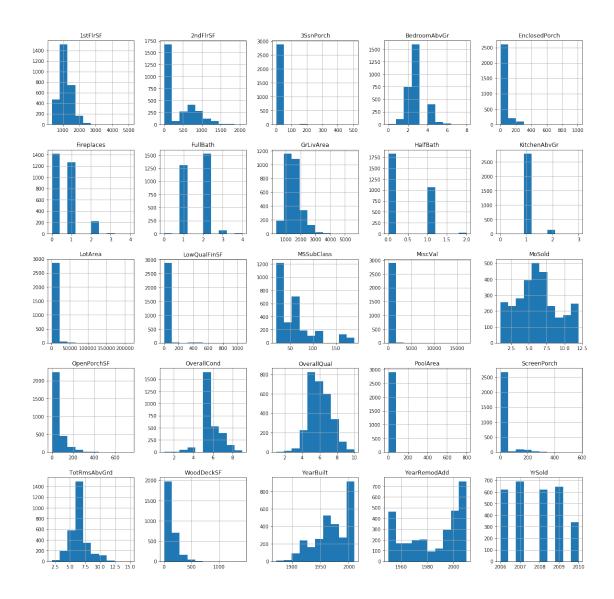
```
LowQualFinSF
                    2919 non-null
                                     int64
 44
                                     int64
 45
     GrLivArea
                     2919 non-null
 46
     BsmtFullBath
                    2917 non-null
                                     float64
 47
     BsmtHalfBath
                    2917 non-null
                                     float64
                    2919 non-null
 48
    FullBath
                                     int64
    HalfBath
                    2919 non-null
                                     int64
 49
 50
     BedroomAbvGr
                    2919 non-null
                                     int64
 51
    KitchenAbvGr
                    2919 non-null
                                     int64
 52 KitchenQual
                    2918 non-null
                                     object
 53
    TotRmsAbvGrd
                    2919 non-null
                                     int64
 54 Functional
                    2917 non-null
                                     object
    Fireplaces
                    2919 non-null
                                     int64
 55
 56
     FireplaceQu
                    1499 non-null
                                     object
 57
     GarageType
                    2762 non-null
                                     object
     GarageYrBlt
 58
                    2760 non-null
                                     float64
     GarageFinish
                    2760 non-null
                                     object
 60
     GarageCars
                    2918 non-null
                                     float64
 61
     GarageArea
                    2918 non-null
                                     float64
 62
     GarageQual
                    2760 non-null
                                     object
 63
     GarageCond
                    2760 non-null
                                     object
     PavedDrive
 64
                    2919 non-null
                                     object
                    2919 non-null
                                     int64
 65
     WoodDeckSF
     OpenPorchSF
                    2919 non-null
                                     int64
     EnclosedPorch
                    2919 non-null
                                     int64
 67
 68
     3SsnPorch
                    2919 non-null
                                     int64
     ScreenPorch
                    2919 non-null
 69
                                     int64
 70
     PoolArea
                    2919 non-null
                                     int64
 71
     PoolQC
                    10 non-null
                                     object
 72
     Fence
                    571 non-null
                                     object
 73
     MiscFeature
                    105 non-null
                                     object
 74
     MiscVal
                    2919 non-null
                                     int64
 75
    MoSold
                    2919 non-null
                                     int64
 76
    YrSold
                    2919 non-null
                                     int64
 77
                    2918 non-null
     SaleType
                                     object
 78
     SaleCondition 2919 non-null
                                     object
 79
     Ιd
                     1459 non-null
                                     float64
dtypes: float64(12), int64(25), object(43)
memory usage: 1.8+ MB
```

2 Descriptive statistics

clearly from the above output we can see that we have a lot of missing values in some of our features both from the training and test data. We shall drop the missing values going forward.

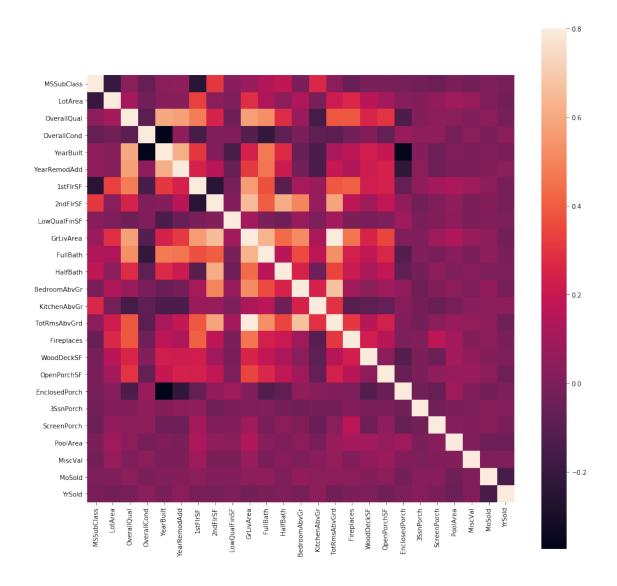
```
[10]: # Droping missing values
def get_cols_with_no_nans(df,col_type):
```

```
if (col_type == 'num'):
              predictors = df.select_dtypes(exclude=['object'])
          elif (col_type == 'no_num'):
              predictors = df.select_dtypes(include=['object'])
          elif (col_type == 'all'):
              predictors = df
          else :
              print('Error : choose a type (num, no_num, all)')
              return 0
          cols_with_no_nans = []
          for col in predictors.columns:
              if not df[col].isnull().any():
                  cols_with_no_nans.append(col)
          return cols_with_no_nans
[11]: # Call the function
      num cols = get cols with no nans(combined , 'num')
      cat_cols = get_cols_with_no_nans(combined , 'no_num')
[12]: # How many columns we got
      print ('Number of numerical columns with no nan values =',len(num cols))
      print ('Number of non-numerical columns with no nan values =',len(cat_cols))
     Number of numerical columns with no nan values = 25
     Number of non-numerical columns with no nan values = 20
[13]: combined[num_cols].shape, combined[cat_cols].shape
[13]: ((2919, 25), (2919, 20))
[14]: # we now have 45 colums (features) after droping features with missing values.
[16]: # Graphs
      import matplotlib.pyplot as plt
      combined=combined[num_cols+cat_cols]
      combined.hist(figsize=(20,20))
      plt.show()
```



```
[17]: import seaborn as sb
# How many of features are correlated
train = train[num_cols + cat_cols]

C_mat = combined.corr()
fig = plt.figure(figsize = (15,15))
sb.heatmap(C_mat, vmax = .8, square = True)
plt.show()
# Looks like 15 correlated features
```



```
import numpy as np
# We will encode the categorical features using one hot encoding.
def oneHotEncode(df,colNames):
    for col in colNames:
        if( df[col].dtype == np.dtype('object')):
            dummies = pd.get_dummies(df[col],prefix=col)
            df = pd.concat([df,dummies],axis=1)

#drop the encoded column
            df.drop([col],axis = 1 , inplace=True)
    return df
```

There were 45 columns before encoding categorical features There are 149 columns after encoding categorical features

```
[45]: # Split data to train and test
def split_combined():
    global combined
    train = combined[:1460]
    test = combined[1460:]

    return train , test

train, test = split_combined()
```

```
[46]: target.shape, train.shape
```

```
[46]: ((1460,), (1460, 149))
```

```
[21]: train.shape
```

[21]: (1460, 149)

3 Neuron Network

```
# The Output Layer :
    NN model.add(Dense(1, kernel_initializer='normal',activation='linear'))
    # Compile the network :
    NN_model.compile(loss='mean_absolute_error', optimizer='adam',_
     →metrics=['mean_absolute_error'])
[48]: NN_model.summary()
    Model: "sequential_2"
    Layer (type)
                  Output Shape
    ______
    dense_10 (Dense)
                         (None, 128)
                                             19200
    _____
    dense_11 (Dense)
                         (None, 256)
                                             33024
    dense_12 (Dense)
                         (None, 256)
                                             65792
                   (None, 256)
    dense 13 (Dense)
                                             65792
    -----
    dense_14 (Dense) (None, 1)
                                             257
    Total params: 184,065
    Trainable params: 184,065
    Non-trainable params: 0
                     _____
[50]: from tensorflow.keras.callbacks import ModelCheckpoint
    # Define a checkpoint to save the data
    checkpoint_name = '/Users/kaharbawa/Documents/MyCodes.h5'
    checkpoint = ModelCheckpoint(checkpoint name, monitor='val loss', verbose = 1, u
     →save_best_only = True, mode = 'auto')
    callbacks list = [checkpoint]
[51]: # Train the model
    hist = NN_model.fit(train, target, epochs=250, batch_size=32, validation_split_
     ⇒= 0.2, callbacks=callbacks_list)
    Train on 1168 samples, validate on 292 samples
    Epoch 1/250
    mean_absolute_error: 155239.0156
    Epoch 00001: val_loss improved from inf to 52783.98108, saving model to
    /Users/kaharbawa/Documents/MyCodes.h5
```

```
- mean_absolute_error: 128478.5781 - val_loss: 52783.9811 -
val_mean_absolute_error: 52783.9805
Epoch 2/250
mean absolute error: 55352.2930
Epoch 00002: val_loss improved from 52783.98108 to 47707.56475, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 52077.3633 - val_loss: 47707.5647 -
val_mean_absolute_error: 47707.5703
Epoch 3/250
mean_absolute_error: 46907.0391
Epoch 00003: val_loss did not improve from 47707.56475
mean_absolute_error: 45860.2422 - val_loss: 50140.1920 -
val_mean_absolute_error: 50140.1953
Epoch 4/250
mean absolute error: 43118.4570
Epoch 00004: val_loss improved from 47707.56475 to 41528.14838, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 41902.4062 - val_loss: 41528.1484 -
val_mean_absolute_error: 41528.1484
Epoch 5/250
mean_absolute_error: 38390.5430
Epoch 00005: val_loss improved from 41528.14838 to 39698.84241, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 38544.0312 - val_loss: 39698.8424 -
val_mean_absolute_error: 39698.8398
Epoch 6/250
mean_absolute_error: 36328.9922
Epoch 00006: val loss did not improve from 39698.84241
mean_absolute_error: 37554.8594 - val_loss: 41136.5752 -
val_mean_absolute_error: 41136.5742
Epoch 7/250
mean_absolute_error: 35088.1055
Epoch 00007: val_loss improved from 39698.84241 to 39246.20698, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 34691.3711 - val_loss: 39246.2070 -
val_mean_absolute_error: 39246.2031
```

```
Epoch 8/250
mean_absolute_error: 33782.4766
Epoch 00008: val_loss did not improve from 39246.20698
mean_absolute_error: 33910.9961 - val_loss: 39380.3196 -
val_mean_absolute_error: 39380.3203
Epoch 9/250
mean_absolute_error: 34037.6562
Epoch 00009: val_loss improved from 39246.20698 to 36159.34182, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 32732.9648 - val_loss: 36159.3418 -
val_mean_absolute_error: 36159.3438
Epoch 10/250
mean_absolute_error: 32205.5430
Epoch 00010: val_loss improved from 36159.34182 to 36025.50985, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 33625.6328 - val_loss: 36025.5098 -
val_mean_absolute_error: 36025.5078
Epoch 11/250
mean_absolute_error: 31571.6055
Epoch 00011: val_loss did not improve from 36025.50985
mean_absolute_error: 32565.4180 - val_loss: 36168.9882 -
val_mean_absolute_error: 36168.9844
Epoch 12/250
mean_absolute_error: 31467.2012
Epoch 00012: val_loss improved from 36025.50985 to 35202.24181, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 32078.8184 - val_loss: 35202.2418 -
val_mean_absolute_error: 35202.2383
Epoch 13/250
mean_absolute_error: 32010.1152
Epoch 00013: val_loss improved from 35202.24181 to 34765.00797, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 32000.7676 - val_loss: 34765.0080 -
val_mean_absolute_error: 34765.0117
Epoch 14/250
```

```
mean_absolute_error: 32083.0742
Epoch 00014: val_loss did not improve from 34765.00797
mean_absolute_error: 32840.7031 - val_loss: 35498.8957 -
val_mean_absolute_error: 35498.9023
Epoch 15/250
mean_absolute_error: 34441.9492
Epoch 00015: val_loss did not improve from 34765.00797
mean_absolute_error: 33027.8594 - val_loss: 35102.0847 -
val_mean_absolute_error: 35102.0859
Epoch 16/250
mean_absolute_error: 31983.6934
Epoch 00016: val_loss improved from 34765.00797 to 34269.78435, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 33850.6875 - val_loss: 34269.7844 -
val_mean_absolute_error: 34269.7891
Epoch 17/250
mean_absolute_error: 32578.9355
Epoch 00017: val_loss did not improve from 34269.78435
mean_absolute_error: 35887.4219 - val_loss: 35436.8008 -
val_mean_absolute_error: 35436.7969
Epoch 18/250
mean_absolute_error: 31925.5332
Epoch 00018: val_loss did not improve from 34269.78435
mean_absolute_error: 32457.5078 - val_loss: 35823.1813 -
val_mean_absolute_error: 35823.1797
Epoch 19/250
mean absolute error: 32656.2363
Epoch 00019: val_loss improved from 34269.78435 to 34247.51423, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 31744.5859 - val_loss: 34247.5142 -
val_mean_absolute_error: 34247.5156
Epoch 20/250
mean_absolute_error: 31064.1387
Epoch 00020: val_loss did not improve from 34247.51423
mean_absolute_error: 32093.8867 - val_loss: 34808.3695 -
```

```
val_mean_absolute_error: 34808.3711
Epoch 21/250
mean_absolute_error: 31067.8379
Epoch 00021: val_loss improved from 34247.51423 to 34152.17230, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 32365.9082 - val_loss: 34152.1723 -
val_mean_absolute_error: 34152.1719
Epoch 22/250
mean_absolute_error: 32092.6719
Epoch 00022: val_loss did not improve from 34152.17230
mean_absolute_error: 31883.4141 - val_loss: 34690.0455 -
val_mean_absolute_error: 34690.0469
Epoch 23/250
mean_absolute_error: 31261.2871
Epoch 00023: val loss did not improve from 34152.17230
mean_absolute_error: 31776.4688 - val_loss: 38688.5477 -
val_mean_absolute_error: 38688.5430
Epoch 24/250
mean_absolute_error: 31990.6074
Epoch 00024: val_loss did not improve from 34152.17230
mean_absolute_error: 32122.6738 - val_loss: 35869.7930 -
val_mean_absolute_error: 35869.7969
Epoch 25/250
mean_absolute_error: 31042.9531
Epoch 00025: val_loss did not improve from 34152.17230
mean_absolute_error: 31208.7988 - val_loss: 36447.2992 -
val_mean_absolute_error: 36447.2969
Epoch 26/250
mean_absolute_error: 30573.3477
Epoch 00026: val_loss did not improve from 34152.17230
mean_absolute_error: 30815.9004 - val_loss: 34891.8291 -
val_mean_absolute_error: 34891.8281
Epoch 27/250
mean_absolute_error: 30683.6719
Epoch 00027: val_loss did not improve from 34152.17230
```

```
mean_absolute_error: 30769.0996 - val_loss: 34861.5043 -
val_mean_absolute_error: 34861.5039
Epoch 28/250
mean_absolute_error: 31790.7520
Epoch 00028: val loss did not improve from 34152.17230
mean_absolute_error: 30868.3594 - val_loss: 34809.4110 -
val_mean_absolute_error: 34809.4102
Epoch 29/250
mean_absolute_error: 32037.5078
Epoch 00029: val_loss improved from 34152.17230 to 33879.64266, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 31187.5586 - val_loss: 33879.6427 -
val_mean_absolute_error: 33879.6445
Epoch 30/250
mean_absolute_error: 30656.0156
Epoch 00030: val loss did not improve from 33879.64266
mean_absolute_error: 30841.4219 - val_loss: 33933.8530 -
val_mean_absolute_error: 33933.8516
Epoch 31/250
mean_absolute_error: 30272.0352
Epoch 00031: val_loss improved from 33879.64266 to 33683.85814, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 30634.7949 - val_loss: 33683.8581 -
val_mean_absolute_error: 33683.8555
Epoch 32/250
mean_absolute_error: 28133.9297
Epoch 00032: val loss did not improve from 33683.85814
mean_absolute_error: 30247.0449 - val_loss: 34183.8638 -
val_mean_absolute_error: 34183.8633
Epoch 33/250
mean_absolute_error: 28833.1953
Epoch 00033: val_loss did not improve from 33683.85814
mean_absolute_error: 30182.7363 - val_loss: 34910.8970 -
val_mean_absolute_error: 34910.8984
Epoch 34/250
```

```
mean_absolute_error: 31071.3438
Epoch 00034: val_loss did not improve from 33683.85814
mean_absolute_error: 30793.9043 - val_loss: 35072.8215 -
val_mean_absolute_error: 35072.8203
Epoch 35/250
mean_absolute_error: 32088.3359
Epoch 00035: val_loss improved from 33683.85814 to 33531.69719, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 31683.3730 - val_loss: 33531.6972 -
val_mean_absolute_error: 33531.6992
Epoch 36/250
mean_absolute_error: 30715.6895
Epoch 00036: val_loss did not improve from 33531.69719
mean_absolute_error: 30353.8262 - val_loss: 34468.4051 -
val_mean_absolute_error: 34468.4023
Epoch 37/250
mean_absolute_error: 29844.6016
Epoch 00037: val_loss did not improve from 33531.69719
mean_absolute_error: 29948.4863 - val_loss: 34436.5104 -
val_mean_absolute_error: 34436.5117
Epoch 38/250
mean_absolute_error: 29199.1504
Epoch 00038: val_loss did not improve from 33531.69719
mean_absolute_error: 29746.2715 - val_loss: 33810.1345 -
val_mean_absolute_error: 33810.1328
Epoch 39/250
mean_absolute_error: 32082.6621
Epoch 00039: val_loss improved from 33531.69719 to 32692.27841, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 30771.8359 - val_loss: 32692.2784 -
val_mean_absolute_error: 32692.2773
Epoch 40/250
mean_absolute_error: 30001.1270
Epoch 00040: val_loss did not improve from 32692.27841
```

```
mean_absolute_error: 30184.5078 - val_loss: 33231.6824 -
val_mean_absolute_error: 33231.6797
Epoch 41/250
mean absolute error: 30575.4902
Epoch 00041: val_loss did not improve from 32692.27841
mean_absolute_error: 29526.9961 - val_loss: 33303.2532 -
val_mean_absolute_error: 33303.2461
Epoch 42/250
mean_absolute_error: 30323.6016
Epoch 00042: val_loss did not improve from 32692.27841
mean_absolute_error: 29964.0859 - val_loss: 35299.2802 -
val_mean_absolute_error: 35299.2812
Epoch 43/250
mean_absolute_error: 33907.3398
Epoch 00043: val loss did not improve from 32692.27841
mean_absolute_error: 32346.1055 - val_loss: 35919.7090 -
val_mean_absolute_error: 35919.7109
Epoch 44/250
mean_absolute_error: 32144.5820
Epoch 00044: val_loss did not improve from 32692.27841
mean_absolute_error: 30599.6328 - val_loss: 34119.4879 -
val_mean_absolute_error: 34119.4883
Epoch 45/250
mean_absolute_error: 29475.3535
Epoch 00045: val_loss improved from 32692.27841 to 32191.44785, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 29448.4043 - val_loss: 32191.4479 -
val_mean_absolute_error: 32191.4492
Epoch 46/250
mean_absolute_error: 30861.9668
Epoch 00046: val_loss did not improve from 32191.44785
mean_absolute_error: 29732.2598 - val_loss: 36661.7276 -
val_mean_absolute_error: 36661.7305
Epoch 47/250
mean_absolute_error: 30258.8613
```

```
Epoch 00047: val_loss did not improve from 32191.44785
mean_absolute_error: 30151.8867 - val_loss: 34888.8101 -
val_mean_absolute_error: 34888.8125
Epoch 48/250
mean absolute error: 28193.4043
Epoch 00048: val_loss did not improve from 32191.44785
mean_absolute_error: 29787.6875 - val_loss: 33360.7427 -
val_mean_absolute_error: 33360.7422
Epoch 49/250
mean_absolute_error: 29762.7773
Epoch 00049: val_loss did not improve from 32191.44785
mean_absolute_error: 29536.5918 - val_loss: 33385.5704 -
val_mean_absolute_error: 33385.5703
Epoch 50/250
mean_absolute_error: 29709.3008
Epoch 00050: val loss did not improve from 32191.44785
mean_absolute_error: 29781.2676 - val_loss: 36468.0219 -
val_mean_absolute_error: 36468.0195
Epoch 51/250
mean_absolute_error: 29554.8359
Epoch 00051: val_loss did not improve from 32191.44785
mean_absolute_error: 29825.8867 - val_loss: 33015.5004 -
val_mean_absolute_error: 33015.5039
Epoch 52/250
mean absolute error: 29154.7480
Epoch 00052: val_loss did not improve from 32191.44785
mean_absolute_error: 29176.9629 - val_loss: 33229.2054 -
val_mean_absolute_error: 33229.2070
Epoch 53/250
mean_absolute_error: 28539.8145
Epoch 00053: val_loss did not improve from 32191.44785
mean_absolute_error: 29762.3320 - val_loss: 33550.7125 -
val_mean_absolute_error: 33550.7109
Epoch 54/250
```

```
mean_absolute_error: 29177.8223
Epoch 00054: val_loss did not improve from 32191.44785
mean_absolute_error: 29166.0645 - val_loss: 32246.5001 -
val_mean_absolute_error: 32246.5000
Epoch 55/250
mean_absolute_error: 29534.4199
Epoch 00055: val_loss did not improve from 32191.44785
mean_absolute_error: 29087.1641 - val_loss: 32746.5761 -
val_mean_absolute_error: 32746.5762
Epoch 56/250
mean_absolute_error: 29023.2539
Epoch 00056: val_loss improved from 32191.44785 to 32123.87607, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 28824.4961 - val_loss: 32123.8761 -
val_mean_absolute_error: 32123.8730
Epoch 57/250
mean_absolute_error: 28043.3125
Epoch 00057: val_loss improved from 32123.87607 to 31453.59525, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 28235.9727 - val_loss: 31453.5952 -
val_mean_absolute_error: 31453.5957
Epoch 58/250
mean_absolute_error: 28493.4004
Epoch 00058: val_loss did not improve from 31453.59525
mean_absolute_error: 28052.4043 - val_loss: 31511.9160 -
val_mean_absolute_error: 31511.9180
Epoch 59/250
mean_absolute_error: 29309.2090
Epoch 00059: val_loss did not improve from 31453.59525
mean_absolute_error: 28635.8086 - val_loss: 32666.0611 -
val_mean_absolute_error: 32666.0625
mean_absolute_error: 29304.5352
Epoch 00060: val_loss did not improve from 31453.59525
mean_absolute_error: 28829.5176 - val_loss: 35145.4313 -
```

```
val_mean_absolute_error: 35145.4258
Epoch 61/250
mean_absolute_error: 27982.6719
Epoch 00061: val loss did not improve from 31453.59525
mean_absolute_error: 28948.8555 - val_loss: 31664.3407 -
val_mean_absolute_error: 31664.3398
Epoch 62/250
mean_absolute_error: 28123.9160
Epoch 00062: val_loss did not improve from 31453.59525
mean_absolute_error: 28522.0352 - val_loss: 31719.4104 -
val_mean_absolute_error: 31719.4102
Epoch 63/250
mean_absolute_error: 28923.3027
Epoch 00063: val_loss did not improve from 31453.59525
mean_absolute_error: 28867.9102 - val_loss: 32136.6000 -
val_mean_absolute_error: 32136.5996
Epoch 64/250
mean_absolute_error: 27920.0781
Epoch 00064: val_loss did not improve from 31453.59525
mean_absolute_error: 28452.1562 - val_loss: 31740.8403 -
val_mean_absolute_error: 31740.8418
Epoch 65/250
mean_absolute_error: 29620.6328
Epoch 00065: val_loss did not improve from 31453.59525
mean absolute error: 27965.2148 - val loss: 32025.3690 -
val_mean_absolute_error: 32025.3691
Epoch 66/250
mean_absolute_error: 26611.1074
Epoch 00066: val_loss improved from 31453.59525 to 30396.13040, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 27656.5625 - val_loss: 30396.1304 -
val_mean_absolute_error: 30396.1309
Epoch 67/250
mean_absolute_error: 26974.0586
Epoch 00067: val_loss did not improve from 30396.13040
```

```
mean_absolute_error: 28380.8750 - val_loss: 32038.7288 -
val_mean_absolute_error: 32038.7324
Epoch 68/250
mean_absolute_error: 29313.4375
Epoch 00068: val loss did not improve from 30396.13040
mean_absolute_error: 28583.4980 - val_loss: 31435.1298 -
val_mean_absolute_error: 31435.1309
Epoch 69/250
mean_absolute_error: 27821.4141
Epoch 00069: val_loss did not improve from 30396.13040
mean_absolute_error: 28331.1895 - val_loss: 36308.2609 -
val_mean_absolute_error: 36308.2656
Epoch 70/250
mean absolute error: 28550.6055
Epoch 00070: val_loss did not improve from 30396.13040
mean_absolute_error: 28963.0898 - val_loss: 30985.0016 -
val_mean_absolute_error: 30985.0000
Epoch 71/250
mean_absolute_error: 27088.7090
Epoch 00071: val_loss did not improve from 30396.13040
mean_absolute_error: 27110.6465 - val_loss: 31495.4121 -
val_mean_absolute_error: 31495.4102
Epoch 72/250
544/1168 [=========>...] - ETA: Os - loss: 28391.5043 -
mean_absolute_error: 28391.5059
Epoch 00072: val loss improved from 30396.13040 to 29859.44954, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 27174.8418 - val_loss: 29859.4495 -
val_mean_absolute_error: 29859.4492
Epoch 73/250
mean_absolute_error: 27376.4199
Epoch 00073: val_loss did not improve from 29859.44954
mean_absolute_error: 26931.3652 - val_loss: 29874.1511 -
val_mean_absolute_error: 29874.1504
Epoch 74/250
```

```
mean_absolute_error: 26053.7617
Epoch 00074: val_loss did not improve from 29859.44954
mean_absolute_error: 26694.0762 - val_loss: 30336.8198 -
val_mean_absolute_error: 30336.8184
Epoch 75/250
mean_absolute_error: 27134.2832
Epoch 00075: val_loss did not improve from 29859.44954
mean_absolute_error: 27388.9824 - val_loss: 30115.7128 -
val_mean_absolute_error: 30115.7129
Epoch 76/250
mean_absolute_error: 26785.3145
Epoch 00076: val_loss did not improve from 29859.44954
mean_absolute_error: 26558.9375 - val_loss: 30569.8814 -
val_mean_absolute_error: 30569.8809
Epoch 77/250
mean absolute error: 27082.6289
Epoch 00077: val_loss did not improve from 29859.44954
mean_absolute_error: 26328.9980 - val_loss: 30457.8235 -
val_mean_absolute_error: 30457.8223
Epoch 78/250
mean_absolute_error: 25680.7812
Epoch 00078: val_loss improved from 29859.44954 to 29268.49112, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 25820.3555 - val_loss: 29268.4911 -
val_mean_absolute_error: 29268.4922
Epoch 79/250
mean absolute error: 27035.1387
Epoch 00079: val_loss improved from 29268.49112 to 29058.21987, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 26599.5137 - val_loss: 29058.2199 -
val_mean_absolute_error: 29058.2188
Epoch 80/250
mean_absolute_error: 26038.1094
Epoch 00080: val_loss did not improve from 29058.21987
mean_absolute_error: 26635.0215 - val_loss: 34346.3440 -
```

```
val_mean_absolute_error: 34346.3477
Epoch 81/250
mean_absolute_error: 25001.7246
Epoch 00081: val_loss improved from 29058.21987 to 28590.50436, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 25798.7520 - val_loss: 28590.5044 -
val_mean_absolute_error: 28590.5039
Epoch 82/250
mean_absolute_error: 26163.7500
Epoch 00082: val_loss did not improve from 28590.50436
mean_absolute_error: 26115.3203 - val_loss: 29249.6795 -
val_mean_absolute_error: 29249.6777
Epoch 83/250
mean_absolute_error: 26001.3379
Epoch 00083: val_loss improved from 28590.50436 to 28066.30249, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 25898.2285 - val_loss: 28066.3025 -
val_mean_absolute_error: 28066.3027
Epoch 84/250
mean_absolute_error: 24342.9062
Epoch 00084: val_loss did not improve from 28066.30249
mean_absolute_error: 25472.3184 - val_loss: 28323.5153 -
val_mean_absolute_error: 28323.5156
Epoch 85/250
608/1168 [=========>...] - ETA: Os - loss: 24728.6521 -
mean_absolute_error: 24728.6504
Epoch 00085: val loss did not improve from 28066.30249
mean_absolute_error: 25624.1035 - val_loss: 32125.9868 -
val_mean_absolute_error: 32125.9863
Epoch 86/250
mean_absolute_error: 25808.6504
Epoch 00086: val_loss did not improve from 28066.30249
mean_absolute_error: 24948.2422 - val_loss: 28419.2021 -
val_mean_absolute_error: 28419.2012
Epoch 87/250
mean_absolute_error: 24653.6855
```

```
Epoch 00087: val_loss improved from 28066.30249 to 27091.84594, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
1168/1168 [============== ] - Os 108us/sample - loss: 25435.1467
- mean_absolute_error: 25435.1445 - val_loss: 27091.8459 -
val_mean_absolute_error: 27091.8477
Epoch 88/250
mean_absolute_error: 24846.3828
Epoch 00088: val_loss did not improve from 27091.84594
mean_absolute_error: 24662.5430 - val_loss: 27265.7107 -
val_mean_absolute_error: 27265.7090
Epoch 89/250
mean_absolute_error: 24262.1328
Epoch 00089: val_loss did not improve from 27091.84594
mean_absolute_error: 24001.2988 - val_loss: 28213.9228 -
val_mean_absolute_error: 28213.9238
Epoch 90/250
mean absolute error: 24094.0039
Epoch 00090: val_loss did not improve from 27091.84594
mean_absolute_error: 25307.5137 - val_loss: 34392.2221 -
val_mean_absolute_error: 34392.2227
Epoch 91/250
mean_absolute_error: 25568.5391
Epoch 00091: val_loss improved from 27091.84594 to 26806.25177, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 25089.6562 - val_loss: 26806.2518 -
val_mean_absolute_error: 26806.2520
Epoch 92/250
mean absolute error: 22283.9102
Epoch 00092: val_loss did not improve from 26806.25177
mean_absolute_error: 24069.7344 - val_loss: 27002.1516 -
val_mean_absolute_error: 27002.1523
Epoch 93/250
mean_absolute_error: 24119.8398
Epoch 00093: val_loss did not improve from 26806.25177
mean_absolute_error: 23737.2832 - val_loss: 30623.9830 -
val_mean_absolute_error: 30623.9824
```

```
Epoch 94/250
mean_absolute_error: 26852.7031
Epoch 00094: val_loss improved from 26806.25177 to 26597.68688, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 26279.5625 - val_loss: 26597.6869 -
val_mean_absolute_error: 26597.6855
Epoch 95/250
mean_absolute_error: 24836.8145
Epoch 00095: val_loss did not improve from 26597.68688
mean_absolute_error: 24899.3633 - val_loss: 34937.4534 -
val_mean_absolute_error: 34937.4531
Epoch 96/250
mean_absolute_error: 24487.6660
Epoch 00096: val_loss improved from 26597.68688 to 26531.65154, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
1168/1168 [============== ] - Os 104us/sample - loss: 24320.0374
- mean_absolute_error: 24320.0391 - val_loss: 26531.6515 -
val_mean_absolute_error: 26531.6523
Epoch 97/250
mean_absolute_error: 23386.7891
Epoch 00097: val_loss did not improve from 26531.65154
mean_absolute_error: 22791.4863 - val_loss: 26937.6725 -
val_mean_absolute_error: 26937.6719
Epoch 98/250
mean_absolute_error: 22113.7129
Epoch 00098: val_loss did not improve from 26531.65154
mean_absolute_error: 22280.2168 - val_loss: 28046.9335 -
val_mean_absolute_error: 28046.9355
Epoch 99/250
mean_absolute_error: 21868.8184
Epoch 00099: val_loss did not improve from 26531.65154
mean_absolute_error: 23061.9863 - val_loss: 28384.1050 -
val_mean_absolute_error: 28384.1035
Epoch 100/250
mean_absolute_error: 22207.0410
Epoch 00100: val_loss did not improve from 26531.65154
```

```
- mean_absolute_error: 22228.3965 - val_loss: 27225.8003 -
val_mean_absolute_error: 27225.7988
Epoch 101/250
mean_absolute_error: 22861.6797
Epoch 00101: val loss did not improve from 26531.65154
mean_absolute_error: 22924.0840 - val_loss: 27096.1870 -
val_mean_absolute_error: 27096.1855
Epoch 102/250
mean_absolute_error: 22051.6855
Epoch 00102: val_loss improved from 26531.65154 to 25890.31312, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 21598.7285 - val_loss: 25890.3131 -
val_mean_absolute_error: 25890.3145
Epoch 103/250
mean_absolute_error: 21989.7891
Epoch 00103: val loss did not improve from 25890.31312
mean_absolute_error: 22339.5215 - val_loss: 27879.9181 -
val_mean_absolute_error: 27879.9199
Epoch 104/250
mean_absolute_error: 21676.3262
Epoch 00104: val_loss improved from 25890.31312 to 24789.74007, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 22134.8496 - val_loss: 24789.7401 -
val_mean_absolute_error: 24789.7402
Epoch 105/250
mean_absolute_error: 20858.4922
Epoch 00105: val loss did not improve from 24789.74007
mean_absolute_error: 21189.8828 - val_loss: 31342.0813 -
val_mean_absolute_error: 31342.0820
Epoch 106/250
mean_absolute_error: 21765.5273
Epoch 00106: val_loss improved from 24789.74007 to 24719.48250, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 21706.0781 - val_loss: 24719.4825 -
val_mean_absolute_error: 24719.4824
```

```
Epoch 107/250
mean_absolute_error: 24459.3223
Epoch 00107: val_loss did not improve from 24719.48250
mean_absolute_error: 23975.7285 - val_loss: 25556.4242 -
val_mean_absolute_error: 25556.4238
Epoch 108/250
mean_absolute_error: 21111.7324
Epoch 00108: val_loss improved from 24719.48250 to 23805.30536, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 22217.0684 - val_loss: 23805.3054 -
val_mean_absolute_error: 23805.3066
Epoch 109/250
mean_absolute_error: 21224.2480
Epoch 00109: val_loss did not improve from 23805.30536
mean_absolute_error: 21178.0586 - val_loss: 24515.7794 -
val_mean_absolute_error: 24515.7793
Epoch 110/250
mean_absolute_error: 20727.1543
Epoch 00110: val_loss did not improve from 23805.30536
mean_absolute_error: 20542.8125 - val_loss: 25246.8221 -
val_mean_absolute_error: 25246.8203
Epoch 111/250
mean_absolute_error: 25014.5000
Epoch 00111: val_loss did not improve from 23805.30536
mean absolute error: 25502.8418 - val loss: 34583.6106 -
val_mean_absolute_error: 34583.6133
Epoch 112/250
mean_absolute_error: 26070.7988
Epoch 00112: val_loss did not improve from 23805.30536
mean_absolute_error: 25927.0488 - val_loss: 28042.8798 -
val_mean_absolute_error: 28042.8809
Epoch 113/250
mean_absolute_error: 22611.9648
Epoch 00113: val_loss did not improve from 23805.30536
```

```
mean_absolute_error: 22780.5820 - val_loss: 24306.1200 -
val_mean_absolute_error: 24306.1172
Epoch 114/250
mean_absolute_error: 22761.8887
Epoch 00114: val_loss improved from 23805.30536 to 23100.27796, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 21782.5547 - val_loss: 23100.2780 -
val_mean_absolute_error: 23100.2773
Epoch 115/250
mean_absolute_error: 21764.7832
Epoch 00115: val_loss improved from 23100.27796 to 23067.81512, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 21908.0410 - val_loss: 23067.8151 -
val_mean_absolute_error: 23067.8164
Epoch 116/250
mean_absolute_error: 19465.7539
Epoch 00116: val loss did not improve from 23067.81512
mean_absolute_error: 20628.8223 - val_loss: 24601.0605 -
val_mean_absolute_error: 24601.0605
Epoch 117/250
mean_absolute_error: 19253.1582
Epoch 00117: val_loss did not improve from 23067.81512
mean_absolute_error: 20264.2930 - val_loss: 24639.3166 -
val_mean_absolute_error: 24639.3184
Epoch 118/250
mean absolute error: 19621.6348
Epoch 00118: val_loss did not improve from 23067.81512
mean_absolute_error: 20397.6953 - val_loss: 23339.5667 -
val_mean_absolute_error: 23339.5645
Epoch 119/250
mean_absolute_error: 19662.1172
Epoch 00119: val_loss did not improve from 23067.81512
mean_absolute_error: 20037.8613 - val_loss: 24140.8602 -
val_mean_absolute_error: 24140.8594
Epoch 120/250
```

```
mean_absolute_error: 21638.4355
Epoch 00120: val_loss improved from 23067.81512 to 22102.50016, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean absolute error: 20832.2617 - val loss: 22102.5002 -
val_mean_absolute_error: 22102.4980
Epoch 121/250
mean_absolute_error: 20538.2715
Epoch 00121: val_loss did not improve from 22102.50016
mean_absolute_error: 20640.0586 - val_loss: 23395.8467 -
val_mean_absolute_error: 23395.8457
Epoch 122/250
mean_absolute_error: 21400.6426
Epoch 00122: val_loss did not improve from 22102.50016
mean_absolute_error: 21010.7480 - val_loss: 24280.0088 -
val_mean_absolute_error: 24280.0117
Epoch 123/250
mean_absolute_error: 19955.5176
Epoch 00123: val_loss did not improve from 22102.50016
mean_absolute_error: 20293.5625 - val_loss: 27554.9056 -
val_mean_absolute_error: 27554.9043
Epoch 124/250
mean_absolute_error: 21808.9961
Epoch 00124: val_loss did not improve from 22102.50016
mean_absolute_error: 21424.3340 - val_loss: 24271.3734 -
val_mean_absolute_error: 24271.3750
Epoch 125/250
mean absolute error: 26837.0762
Epoch 00125: val_loss did not improve from 22102.50016
mean_absolute_error: 24166.1953 - val_loss: 32443.8119 -
val_mean_absolute_error: 32443.8125
Epoch 126/250
mean_absolute_error: 21507.3945
Epoch 00126: val_loss did not improve from 22102.50016
mean_absolute_error: 21599.5957 - val_loss: 23149.8836 -
val_mean_absolute_error: 23149.8828
```

```
Epoch 127/250
mean_absolute_error: 19684.1191
Epoch 00127: val_loss did not improve from 22102.50016
mean_absolute_error: 20402.4746 - val_loss: 27723.7597 -
val_mean_absolute_error: 27723.7598
Epoch 128/250
mean_absolute_error: 23910.2168
Epoch 00128: val_loss did not improve from 22102.50016
mean_absolute_error: 21677.1426 - val_loss: 23025.2301 -
val_mean_absolute_error: 23025.2305
Epoch 129/250
mean_absolute_error: 19723.8262
Epoch 00129: val_loss did not improve from 22102.50016
mean_absolute_error: 20158.5645 - val_loss: 24015.9341 -
val_mean_absolute_error: 24015.9355
Epoch 130/250
608/1168 [=========>...] - ETA: Os - loss: 21562.4300 -
mean_absolute_error: 21562.4316
Epoch 00130: val_loss improved from 22102.50016 to 21860.83136, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 20455.1875 - val_loss: 21860.8314 -
val_mean_absolute_error: 21860.8320
Epoch 131/250
mean_absolute_error: 18892.0879
Epoch 00131: val_loss did not improve from 21860.83136
mean absolute error: 19752.6641 - val loss: 26712.7371 -
val_mean_absolute_error: 26712.7363
Epoch 132/250
mean_absolute_error: 20529.6543
Epoch 00132: val_loss did not improve from 21860.83136
mean_absolute_error: 20803.7793 - val_loss: 23587.3076 -
val_mean_absolute_error: 23587.3086
Epoch 133/250
mean_absolute_error: 19203.2734
Epoch 00133: val_loss did not improve from 21860.83136
```

```
mean_absolute_error: 19414.7012 - val_loss: 24253.6875 -
val_mean_absolute_error: 24253.6875
Epoch 134/250
mean absolute error: 18868.4102
Epoch 00134: val_loss did not improve from 21860.83136
mean_absolute_error: 19272.9102 - val_loss: 22083.5247 -
val_mean_absolute_error: 22083.5234
Epoch 135/250
mean_absolute_error: 18602.3613
Epoch 00135: val_loss did not improve from 21860.83136
mean_absolute_error: 18372.6250 - val_loss: 26234.2895 -
val_mean_absolute_error: 26234.2910
Epoch 136/250
mean_absolute_error: 19060.4980
Epoch 00136: val loss did not improve from 21860.83136
mean_absolute_error: 19935.2656 - val_loss: 23476.5864 -
val_mean_absolute_error: 23476.5840
Epoch 137/250
mean_absolute_error: 17637.4961
Epoch 00137: val_loss did not improve from 21860.83136
mean_absolute_error: 18703.2363 - val_loss: 22350.7202 -
val_mean_absolute_error: 22350.7207
Epoch 138/250
mean_absolute_error: 19737.5566
Epoch 00138: val_loss did not improve from 21860.83136
mean_absolute_error: 19680.2988 - val_loss: 25673.3472 -
val_mean_absolute_error: 25673.3457
Epoch 139/250
mean_absolute_error: 19180.5918
Epoch 00139: val_loss improved from 21860.83136 to 21758.16647, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 19372.2305 - val_loss: 21758.1665 -
val_mean_absolute_error: 21758.1680
Epoch 140/250
mean_absolute_error: 21499.8301
```

```
Epoch 00140: val_loss did not improve from 21758.16647
mean_absolute_error: 20927.2285 - val_loss: 23883.9484 -
val_mean_absolute_error: 23883.9492
Epoch 141/250
mean absolute error: 19430.5156
Epoch 00141: val_loss did not improve from 21758.16647
mean_absolute_error: 19350.5938 - val_loss: 24154.9088 -
val_mean_absolute_error: 24154.9102
Epoch 142/250
mean_absolute_error: 19986.5020
Epoch 00142: val_loss did not improve from 21758.16647
mean_absolute_error: 19844.2578 - val_loss: 22009.6251 -
val_mean_absolute_error: 22009.6250
Epoch 143/250
mean_absolute_error: 18241.7715
Epoch 00143: val loss did not improve from 21758.16647
mean_absolute_error: 18489.2695 - val_loss: 24902.4632 -
val_mean_absolute_error: 24902.4629
Epoch 144/250
mean_absolute_error: 19415.1797
Epoch 00144: val_loss did not improve from 21758.16647
mean_absolute_error: 19588.4805 - val_loss: 22329.5984 -
val_mean_absolute_error: 22329.6016
Epoch 145/250
mean absolute error: 21802.0898
Epoch 00145: val_loss did not improve from 21758.16647
mean_absolute_error: 20603.3672 - val_loss: 23801.6936 -
val_mean_absolute_error: 23801.6953
Epoch 146/250
mean_absolute_error: 20238.7930
Epoch 00146: val_loss did not improve from 21758.16647
mean_absolute_error: 19414.9023 - val_loss: 26328.6353 -
val_mean_absolute_error: 26328.6328
Epoch 147/250
```

```
mean_absolute_error: 19069.4395
Epoch 00147: val_loss did not improve from 21758.16647
mean_absolute_error: 19532.7559 - val_loss: 28161.5980 -
val mean absolute error: 28161.5996
Epoch 148/250
mean_absolute_error: 21736.3379
Epoch 00148: val_loss did not improve from 21758.16647
mean_absolute_error: 20868.9473 - val_loss: 22125.1976 -
val_mean_absolute_error: 22125.1973
Epoch 149/250
mean_absolute_error: 17728.0215
Epoch 00149: val_loss did not improve from 21758.16647
mean_absolute_error: 17919.7578 - val_loss: 22104.3024 -
val_mean_absolute_error: 22104.3027
Epoch 150/250
mean absolute error: 17810.5000
Epoch 00150: val_loss did not improve from 21758.16647
mean_absolute_error: 17913.1855 - val_loss: 25473.8711 -
val_mean_absolute_error: 25473.8691
Epoch 151/250
mean_absolute_error: 18793.9961
Epoch 00151: val_loss did not improve from 21758.16647
mean_absolute_error: 18821.9297 - val_loss: 21887.2107 -
val_mean_absolute_error: 21887.2129
Epoch 152/250
mean_absolute_error: 19964.0605
Epoch 00152: val loss did not improve from 21758.16647
mean_absolute_error: 19680.2324 - val_loss: 22069.4081 -
val_mean_absolute_error: 22069.4082
Epoch 153/250
mean_absolute_error: 20175.7070
Epoch 00153: val_loss did not improve from 21758.16647
mean_absolute_error: 19510.0371 - val_loss: 22237.5995 -
val_mean_absolute_error: 22237.6035
Epoch 154/250
```

```
mean_absolute_error: 17734.5762
Epoch 00154: val_loss did not improve from 21758.16647
mean absolute error: 17628.5098 - val loss: 22325.0433 -
val_mean_absolute_error: 22325.0449
Epoch 155/250
mean_absolute_error: 18325.7734
Epoch 00155: val_loss did not improve from 21758.16647
mean_absolute_error: 19212.1816 - val_loss: 28604.5817 -
val_mean_absolute_error: 28604.5820
Epoch 156/250
mean_absolute_error: 23485.0098
Epoch 00156: val_loss did not improve from 21758.16647
mean_absolute_error: 22870.5898 - val_loss: 22181.6767 -
val_mean_absolute_error: 22181.6777
Epoch 157/250
mean_absolute_error: 19764.0723
Epoch 00157: val_loss did not improve from 21758.16647
mean_absolute_error: 19146.3301 - val_loss: 22338.7362 -
val_mean_absolute_error: 22338.7363
Epoch 158/250
mean_absolute_error: 18919.3047
Epoch 00158: val_loss did not improve from 21758.16647
mean_absolute_error: 18456.9688 - val_loss: 26859.6839 -
val_mean_absolute_error: 26859.6855
Epoch 159/250
mean_absolute_error: 19223.9180
Epoch 00159: val_loss did not improve from 21758.16647
mean_absolute_error: 18893.6328 - val_loss: 22346.7836 -
val_mean_absolute_error: 22346.7852
Epoch 160/250
mean_absolute_error: 18017.6895
Epoch 00160: val_loss did not improve from 21758.16647
mean_absolute_error: 17781.8125 - val_loss: 25464.6784 -
val_mean_absolute_error: 25464.6777
```

```
Epoch 161/250
mean_absolute_error: 20230.0762
Epoch 00161: val_loss did not improve from 21758.16647
mean_absolute_error: 19704.3535 - val_loss: 22455.4426 -
val_mean_absolute_error: 22455.4414
Epoch 162/250
mean_absolute_error: 18716.3672
Epoch 00162: val_loss did not improve from 21758.16647
mean_absolute_error: 18934.2031 - val_loss: 23905.8033 -
val_mean_absolute_error: 23905.8008
Epoch 163/250
mean_absolute_error: 20563.4434
Epoch 00163: val_loss did not improve from 21758.16647
mean_absolute_error: 20100.9336 - val_loss: 22326.7544 -
val_mean_absolute_error: 22326.7539
Epoch 164/250
mean_absolute_error: 17305.2441
Epoch 00164: val_loss did not improve from 21758.16647
mean_absolute_error: 18330.6816 - val_loss: 24552.4972 -
val_mean_absolute_error: 24552.4980
Epoch 165/250
mean_absolute_error: 16960.8848
Epoch 00165: val_loss did not improve from 21758.16647
mean_absolute_error: 17307.0430 - val_loss: 26595.4969 -
val mean absolute error: 26595.4980
Epoch 166/250
mean_absolute_error: 18225.4492
Epoch 00166: val_loss did not improve from 21758.16647
mean_absolute_error: 18027.9316 - val_loss: 22126.6791 -
val_mean_absolute_error: 22126.6797
Epoch 167/250
mean_absolute_error: 20417.1191
Epoch 00167: val_loss did not improve from 21758.16647
mean_absolute_error: 20759.6953 - val_loss: 24854.6229 -
```

```
val_mean_absolute_error: 24854.6211
Epoch 168/250
mean_absolute_error: 22466.9688
Epoch 00168: val loss did not improve from 21758.16647
mean_absolute_error: 21705.4395 - val_loss: 25636.1815 -
val_mean_absolute_error: 25636.1816
Epoch 169/250
mean_absolute_error: 17589.7930
Epoch 00169: val_loss did not improve from 21758.16647
mean_absolute_error: 17608.4883 - val_loss: 22991.2714 -
val_mean_absolute_error: 22991.2715
Epoch 170/250
mean_absolute_error: 19767.4941
Epoch 00170: val_loss did not improve from 21758.16647
mean_absolute_error: 19273.2852 - val_loss: 22084.1723 -
val_mean_absolute_error: 22084.1738
Epoch 171/250
mean_absolute_error: 18276.6641
Epoch 00171: val_loss did not improve from 21758.16647
mean_absolute_error: 18633.2539 - val_loss: 36940.4101 -
val_mean_absolute_error: 36940.4102
Epoch 172/250
mean_absolute_error: 19677.7285
Epoch 00172: val_loss improved from 21758.16647 to 21590.63514, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 19676.6719 - val_loss: 21590.6351 -
val_mean_absolute_error: 21590.6348
Epoch 173/250
mean_absolute_error: 18818.5469
Epoch 00173: val_loss did not improve from 21590.63514
mean_absolute_error: 17832.8359 - val_loss: 21609.0084 -
val_mean_absolute_error: 21609.0078
Epoch 174/250
mean_absolute_error: 18506.9238
Epoch 00174: val_loss did not improve from 21590.63514
```

```
mean_absolute_error: 18061.1777 - val_loss: 22472.5650 -
val_mean_absolute_error: 22472.5645
Epoch 175/250
mean_absolute_error: 18392.4336
Epoch 00175: val loss did not improve from 21590.63514
mean_absolute_error: 18586.1211 - val_loss: 22518.4406 -
val_mean_absolute_error: 22518.4414
Epoch 176/250
mean_absolute_error: 19033.3184
Epoch 00176: val_loss did not improve from 21590.63514
mean_absolute_error: 18284.2715 - val_loss: 22064.8051 -
val_mean_absolute_error: 22064.8066
Epoch 177/250
mean absolute error: 18012.4551
Epoch 00177: val_loss did not improve from 21590.63514
mean_absolute_error: 17998.1094 - val_loss: 24577.4174 -
val_mean_absolute_error: 24577.4180
Epoch 178/250
mean_absolute_error: 18948.8496
Epoch 00178: val_loss did not improve from 21590.63514
mean_absolute_error: 18911.1016 - val_loss: 21834.5219 -
val_mean_absolute_error: 21834.5215
Epoch 179/250
mean_absolute_error: 17848.7344
Epoch 00179: val loss improved from 21590.63514 to 20928.08966, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 17676.7637 - val_loss: 20928.0897 -
val_mean_absolute_error: 20928.0898
Epoch 180/250
mean_absolute_error: 19935.2441
Epoch 00180: val_loss did not improve from 20928.08966
mean_absolute_error: 20107.3418 - val_loss: 26767.9408 -
val_mean_absolute_error: 26767.9414
Epoch 181/250
```

```
mean_absolute_error: 19209.0977
Epoch 00181: val_loss improved from 20928.08966 to 20833.20283, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 18659.7285 - val_loss: 20833.2028 -
val_mean_absolute_error: 20833.2012
Epoch 182/250
mean_absolute_error: 17633.0742
Epoch 00182: val_loss did not improve from 20833.20283
mean_absolute_error: 18044.8301 - val_loss: 21306.1127 -
val_mean_absolute_error: 21306.1113
Epoch 183/250
mean_absolute_error: 18652.6211
Epoch 00183: val_loss did not improve from 20833.20283
mean_absolute_error: 18738.3535 - val_loss: 25804.6838 -
val_mean_absolute_error: 25804.6855
Epoch 184/250
mean_absolute_error: 18053.4219
Epoch 00184: val_loss did not improve from 20833.20283
mean_absolute_error: 17957.6035 - val_loss: 22025.9081 -
val_mean_absolute_error: 22025.9082
Epoch 185/250
mean_absolute_error: 18679.7773
Epoch 00185: val_loss did not improve from 20833.20283
mean_absolute_error: 18368.8672 - val_loss: 25140.2103 -
val_mean_absolute_error: 25140.2090
Epoch 186/250
mean absolute error: 17784.8926
Epoch 00186: val_loss did not improve from 20833.20283
mean_absolute_error: 17520.6738 - val_loss: 21292.1362 -
val_mean_absolute_error: 21292.1367
Epoch 187/250
mean_absolute_error: 17373.0723
Epoch 00187: val_loss did not improve from 20833.20283
mean_absolute_error: 16926.1895 - val_loss: 21428.2431 -
val_mean_absolute_error: 21428.2441
```

```
Epoch 188/250
mean_absolute_error: 16963.6465
Epoch 00188: val_loss did not improve from 20833.20283
mean_absolute_error: 18157.8223 - val_loss: 27683.9163 -
val_mean_absolute_error: 27683.9160
Epoch 189/250
mean_absolute_error: 22397.9199
Epoch 00189: val_loss did not improve from 20833.20283
mean_absolute_error: 21290.3613 - val_loss: 21601.5065 -
val_mean_absolute_error: 21601.5078
Epoch 190/250
mean_absolute_error: 18377.1133
Epoch 00190: val_loss did not improve from 20833.20283
mean_absolute_error: 18013.7012 - val_loss: 21000.5319 -
val_mean_absolute_error: 21000.5332
Epoch 191/250
mean_absolute_error: 17573.0977
Epoch 00191: val_loss did not improve from 20833.20283
mean_absolute_error: 17588.3340 - val_loss: 21319.2951 -
val_mean_absolute_error: 21319.2949
Epoch 192/250
mean_absolute_error: 17941.5918
Epoch 00192: val_loss did not improve from 20833.20283
mean_absolute_error: 17972.4102 - val_loss: 20856.4723 -
val_mean_absolute_error: 20856.4707
Epoch 193/250
mean_absolute_error: 17610.2734
Epoch 00193: val_loss did not improve from 20833.20283
mean_absolute_error: 18207.2715 - val_loss: 21504.4618 -
val_mean_absolute_error: 21504.4629
Epoch 194/250
mean_absolute_error: 19260.1934
Epoch 00194: val_loss did not improve from 20833.20283
mean_absolute_error: 19545.0586 - val_loss: 22009.4876 -
```

```
val_mean_absolute_error: 22009.4883
Epoch 195/250
mean_absolute_error: 18304.8457
Epoch 00195: val loss did not improve from 20833.20283
mean_absolute_error: 18295.0156 - val_loss: 25165.4835 -
val_mean_absolute_error: 25165.4824
Epoch 196/250
mean_absolute_error: 17871.2109
Epoch 00196: val_loss improved from 20833.20283 to 20794.07062, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 17378.7207 - val_loss: 20794.0706 -
val_mean_absolute_error: 20794.0703
Epoch 197/250
mean_absolute_error: 16260.4150
Epoch 00197: val loss did not improve from 20794.07062
mean_absolute_error: 16851.2461 - val_loss: 24246.4317 -
val_mean_absolute_error: 24246.4297
Epoch 198/250
mean_absolute_error: 17848.2246
Epoch 00198: val_loss did not improve from 20794.07062
mean_absolute_error: 17453.0273 - val_loss: 23276.1639 -
val_mean_absolute_error: 23276.1621
Epoch 199/250
mean_absolute_error: 17551.1309
Epoch 00199: val_loss did not improve from 20794.07062
mean_absolute_error: 17878.3477 - val_loss: 25060.3456 -
val_mean_absolute_error: 25060.3438
Epoch 200/250
mean_absolute_error: 17282.0039
Epoch 00200: val_loss did not improve from 20794.07062
mean_absolute_error: 17715.9141 - val_loss: 26574.1148 -
val_mean_absolute_error: 26574.1172
Epoch 201/250
mean_absolute_error: 20803.1602
Epoch 00201: val_loss did not improve from 20794.07062
```

```
mean_absolute_error: 19927.4648 - val_loss: 24883.4936 -
val_mean_absolute_error: 24883.4941
Epoch 202/250
mean_absolute_error: 20373.9629
Epoch 00202: val loss did not improve from 20794.07062
mean_absolute_error: 19499.0625 - val_loss: 21566.1659 -
val_mean_absolute_error: 21566.1660
Epoch 203/250
mean_absolute_error: 18257.0078
Epoch 00203: val_loss did not improve from 20794.07062
mean_absolute_error: 18294.1738 - val_loss: 21035.2694 -
val_mean_absolute_error: 21035.2695
Epoch 204/250
mean absolute error: 18658.2988
Epoch 00204: val_loss did not improve from 20794.07062
- mean_absolute_error: 18354.9492 - val_loss: 24251.3471 -
val_mean_absolute_error: 24251.3438
Epoch 205/250
mean_absolute_error: 17334.3574
Epoch 00205: val_loss did not improve from 20794.07062
mean_absolute_error: 17076.7520 - val_loss: 21313.6296 -
val_mean_absolute_error: 21313.6289
Epoch 206/250
mean_absolute_error: 17995.2168
Epoch 00206: val_loss improved from 20794.07062 to 20653.62714, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 18191.1816 - val_loss: 20653.6271 -
val_mean_absolute_error: 20653.6289
Epoch 207/250
mean_absolute_error: 17574.8418
Epoch 00207: val_loss did not improve from 20653.62714
mean_absolute_error: 17064.6035 - val_loss: 21829.7119 -
val_mean_absolute_error: 21829.7109
Epoch 208/250
```

```
mean_absolute_error: 21229.4102
Epoch 00208: val_loss did not improve from 20653.62714
mean_absolute_error: 21296.2520 - val_loss: 23710.7719 -
val_mean_absolute_error: 23710.7715
Epoch 209/250
mean_absolute_error: 19908.2188
Epoch 00209: val_loss did not improve from 20653.62714
mean_absolute_error: 20518.3105 - val_loss: 21651.9265 -
val_mean_absolute_error: 21651.9277
Epoch 210/250
mean_absolute_error: 18068.5664
Epoch 00210: val_loss did not improve from 20653.62714
mean_absolute_error: 18095.9043 - val_loss: 22538.3958 -
val_mean_absolute_error: 22538.3965
Epoch 211/250
mean_absolute_error: 16622.6973
Epoch 00211: val_loss improved from 20653.62714 to 20627.51980, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
- mean_absolute_error: 16627.5098 - val_loss: 20627.5198 -
val_mean_absolute_error: 20627.5215
Epoch 212/250
mean_absolute_error: 18760.7480
Epoch 00212: val_loss did not improve from 20627.51980
mean_absolute_error: 18391.6133 - val_loss: 22512.5501 -
val_mean_absolute_error: 22512.5488
Epoch 213/250
mean absolute error: 17983.5684
Epoch 00213: val_loss did not improve from 20627.51980
mean_absolute_error: 18084.1172 - val_loss: 24373.3469 -
val_mean_absolute_error: 24373.3477
Epoch 214/250
mean_absolute_error: 17102.5781
Epoch 00214: val_loss did not improve from 20627.51980
mean_absolute_error: 17173.6934 - val_loss: 25150.4392 -
val_mean_absolute_error: 25150.4375
```

```
Epoch 215/250
mean_absolute_error: 18849.0566
Epoch 00215: val_loss did not improve from 20627.51980
mean_absolute_error: 18945.8398 - val_loss: 22506.5017 -
val_mean_absolute_error: 22506.5000
Epoch 216/250
mean_absolute_error: 17796.5645
Epoch 00216: val_loss did not improve from 20627.51980
mean_absolute_error: 18768.2402 - val_loss: 21284.9703 -
val_mean_absolute_error: 21284.9688
Epoch 217/250
mean_absolute_error: 17352.4395
Epoch 00217: val_loss did not improve from 20627.51980
mean_absolute_error: 17714.0176 - val_loss: 24828.7583 -
val_mean_absolute_error: 24828.7578
Epoch 218/250
mean_absolute_error: 16900.8457
Epoch 00218: val_loss improved from 20627.51980 to 20393.85951, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 17007.6973 - val_loss: 20393.8595 -
val_mean_absolute_error: 20393.8594
Epoch 219/250
mean_absolute_error: 16399.3867
Epoch 00219: val_loss did not improve from 20393.85951
mean absolute error: 16550.0996 - val loss: 21474.0181 -
val_mean_absolute_error: 21474.0176
Epoch 220/250
mean_absolute_error: 15347.1318
Epoch 00220: val_loss did not improve from 20393.85951
mean_absolute_error: 16116.3574 - val_loss: 21685.4331 -
val_mean_absolute_error: 21685.4336
Epoch 221/250
mean_absolute_error: 16663.5684
Epoch 00221: val_loss did not improve from 20393.85951
```

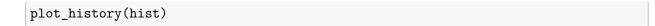
```
mean_absolute_error: 16849.7324 - val_loss: 21032.2286 -
val_mean_absolute_error: 21032.2266
Epoch 222/250
mean absolute error: 15829.6709
Epoch 00222: val_loss did not improve from 20393.85951
mean_absolute_error: 16238.1064 - val_loss: 21431.7338 -
val_mean_absolute_error: 21431.7344
Epoch 223/250
mean_absolute_error: 16441.6152
Epoch 00223: val_loss did not improve from 20393.85951
mean_absolute_error: 17193.6348 - val_loss: 21652.1862 -
val_mean_absolute_error: 21652.1875
Epoch 224/250
mean_absolute_error: 16387.6914
Epoch 00224: val loss did not improve from 20393.85951
mean_absolute_error: 16575.1875 - val_loss: 20841.6282 -
val_mean_absolute_error: 20841.6270
Epoch 225/250
mean_absolute_error: 18452.3242
Epoch 00225: val_loss did not improve from 20393.85951
mean_absolute_error: 19567.5449 - val_loss: 24946.3156 -
val_mean_absolute_error: 24946.3184
Epoch 226/250
mean_absolute_error: 19900.6523
Epoch 00226: val_loss did not improve from 20393.85951
mean_absolute_error: 19586.1035 - val_loss: 21997.5196 -
val_mean_absolute_error: 21997.5215
Epoch 227/250
mean_absolute_error: 16783.6680
Epoch 00227: val_loss improved from 20393.85951 to 20226.47496, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 16548.2441 - val_loss: 20226.4750 -
val_mean_absolute_error: 20226.4746
Epoch 228/250
mean_absolute_error: 18158.1719
```

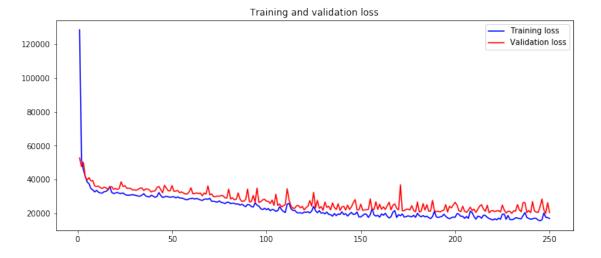
```
Epoch 00228: val_loss did not improve from 20226.47496
mean_absolute_error: 18809.7852 - val_loss: 21308.4269 -
val_mean_absolute_error: 21308.4277
Epoch 229/250
mean absolute error: 16338.9131
Epoch 00229: val_loss did not improve from 20226.47496
mean_absolute_error: 16433.1816 - val_loss: 21210.5707 -
val_mean_absolute_error: 21210.5723
Epoch 230/250
mean_absolute_error: 16654.5273
Epoch 00230: val_loss improved from 20226.47496 to 20019.53443, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
mean_absolute_error: 16283.4951 - val_loss: 20019.5344 -
val_mean_absolute_error: 20019.5332
Epoch 231/250
mean_absolute_error: 16091.9609
Epoch 00231: val_loss did not improve from 20019.53443
mean_absolute_error: 16613.8438 - val_loss: 21488.5842 -
val_mean_absolute_error: 21488.5859
Epoch 232/250
mean_absolute_error: 17123.8750
Epoch 00232: val_loss did not improve from 20019.53443
mean_absolute_error: 17425.4395 - val_loss: 21357.5112 -
val_mean_absolute_error: 21357.5117
Epoch 233/250
mean_absolute_error: 17954.3379
Epoch 00233: val loss did not improve from 20019.53443
mean_absolute_error: 17274.2109 - val_loss: 25229.8951 -
val_mean_absolute_error: 25229.8965
Epoch 234/250
mean_absolute_error: 16644.9883
Epoch 00234: val_loss did not improve from 20019.53443
mean_absolute_error: 16956.0898 - val_loss: 22133.7025 -
val_mean_absolute_error: 22133.7012
Epoch 235/250
```

```
mean_absolute_error: 16675.2422
Epoch 00235: val_loss did not improve from 20019.53443
mean absolute error: 16839.9863 - val loss: 20987.8189 -
val_mean_absolute_error: 20987.8184
Epoch 236/250
mean_absolute_error: 17280.1289
Epoch 00236: val_loss did not improve from 20019.53443
mean_absolute_error: 18741.7383 - val_loss: 26408.3555 -
val_mean_absolute_error: 26408.3555
Epoch 237/250
mean_absolute_error: 18964.8145
Epoch 00237: val_loss did not improve from 20019.53443
mean_absolute_error: 20525.7949 - val_loss: 26358.1613 -
val_mean_absolute_error: 26358.1602
Epoch 238/250
mean_absolute_error: 18962.9609
Epoch 00238: val_loss did not improve from 20019.53443
mean_absolute_error: 17611.6387 - val_loss: 20540.5583 -
val_mean_absolute_error: 20540.5586
Epoch 239/250
mean_absolute_error: 16689.1348
Epoch 00239: val_loss did not improve from 20019.53443
mean_absolute_error: 17016.3906 - val_loss: 21758.7282 -
val_mean_absolute_error: 21758.7285
Epoch 240/250
mean_absolute_error: 16511.8398
Epoch 00240: val_loss did not improve from 20019.53443
mean_absolute_error: 16638.0977 - val_loss: 20415.7549 -
val_mean_absolute_error: 20415.7578
Epoch 241/250
mean_absolute_error: 17162.4277
Epoch 00241: val_loss did not improve from 20019.53443
mean_absolute_error: 16816.5371 - val_loss: 27020.1182 -
val_mean_absolute_error: 27020.1172
```

```
Epoch 242/250
mean_absolute_error: 17137.6543
Epoch 00242: val_loss did not improve from 20019.53443
mean_absolute_error: 17159.5586 - val_loss: 21487.2253 -
val_mean_absolute_error: 21487.2246
Epoch 243/250
mean_absolute_error: 17816.8281
Epoch 00243: val_loss did not improve from 20019.53443
mean_absolute_error: 17026.8535 - val_loss: 20747.8689 -
val_mean_absolute_error: 20747.8672
Epoch 244/250
mean_absolute_error: 16229.2910
Epoch 00244: val_loss did not improve from 20019.53443
mean_absolute_error: 16043.3633 - val_loss: 20659.3072 -
val_mean_absolute_error: 20659.3086
Epoch 245/250
mean_absolute_error: 15823.5273
Epoch 00245: val_loss did not improve from 20019.53443
mean_absolute_error: 15673.1748 - val_loss: 24056.7379 -
val_mean_absolute_error: 24056.7383
Epoch 246/250
mean_absolute_error: 16177.7236
Epoch 00246: val_loss did not improve from 20019.53443
mean_absolute_error: 16258.7891 - val_loss: 28537.2214 -
val_mean_absolute_error: 28537.2246
Epoch 247/250
mean_absolute_error: 19701.8984
Epoch 00247: val_loss did not improve from 20019.53443
mean_absolute_error: 20254.8281 - val_loss: 22104.7307 -
val_mean_absolute_error: 22104.7305
Epoch 248/250
mean_absolute_error: 17834.8770
Epoch 00248: val_loss improved from 20019.53443 to 19997.77354, saving model to
/Users/kaharbawa/Documents/MyCodes.h5
```

```
mean_absolute_error: 17716.9668 - val_loss: 19997.7735 -
    val_mean_absolute_error: 19997.7734
    Epoch 249/250
    mean absolute error: 17587.5117
    Epoch 00249: val_loss did not improve from 19997.77354
    mean_absolute_error: 17522.9727 - val_loss: 26388.6846 -
    val_mean_absolute_error: 26388.6855
    Epoch 250/250
    mean_absolute_error: 16920.3496
    Epoch 00250: val_loss did not improve from 19997.77354
    mean_absolute_error: 16971.1465 - val_loss: 20523.8907 -
    val_mean_absolute_error: 20523.8906
[53]: House_file = '/Users/kaharbawa/Documents/MyCodes.h5'
    NN_model.load_weights(House_file)
[54]: NN_model.compile(loss='mean_absolute_error', optimizer='adam', ___
     →metrics=['mean_absolute_error'])
[55]: predictions = NN_model.predict(test)
    predictions
[55]: array([[122182.695],
          [162764.84],
          [179755.69],
          ...,
          [166039.2],
          [144203.3],
          [213050.84]], dtype=float32)
[58]: def plot_history(history):
        loss = history.history['loss']
        val_loss = history.history['val_loss']
        x = range(1, len(loss) + 1)
        plt.figure(figsize=(12, 5))
        plt.plot(x, loss, 'b', label='Training loss')
        plt.plot(x, val_loss, 'r', label='Validation loss')
        plt.title('Training and validation loss')
        plt.legend()
        plt.show()
```





4 Comment

pretty good fit! Our neuron network seem to be well predicting the house price for this given data.