

# NeuralNet

November 10, 2024

```
[156]: try:
        import os
        import glob
        import numpy as np
        import pandas as pd

        # Importing libraries for data visualization
        import seaborn as sns
        import matplotlib.pyplot as plt

        # Creating a model
        from tensorflow.keras.models import Sequential
        from tensorflow.keras.layers import Dense, Activation

        # Importing libraries for evaluation
        from sklearn.preprocessing import MinMaxScaler, OneHotEncoder
        from sklearn.model_selection import train_test_split
        from sklearn.metrics import
        ↪mean_squared_error, mean_absolute_error, explained_variance_score
        from sklearn.metrics import classification_report, confusion_matrix

    except Exception as e:
        print(f"Error : {e}")
```

```
[157]: # Find the CSV file in the Datasets directory
data_path = '../Datasets/*.csv'
file_list = glob.glob(data_path)

for file in file_list:
    print(f"Found file: {file}")

# Ensure there is exactly one file
if len(file_list) == 1:
    # Load the dataset
    df = pd.read_csv(file_list[0])
    print(f"Loaded dataset: {file_list[0]}")
else:
```

```
raise FileNotFoundError("No CSV file found or multiple CSV files found in_
↳the Datasets directory.")
```

Found file: ../Datasets/Dataset.csv  
Loaded dataset: ../Datasets/Dataset.csv

```
[158]: # File path to save the trained model
destination = '../Models/'
os.makedirs(destination, exist_ok=True)
print(f"Model will be saved to: {destination}")
```

Model will be saved to: ../Models/

```
[159]: categorical_cols_unified = ['partType', 'microstructure', 'seedLocation',_
↳'castType']

# Initialize and fit the encoder
encoder = OneHotEncoder(sparse_output=False, drop=None)
# Reshape the data to handle multiple categorical columns
encoded_data = encoder.fit_transform(df[categorical_cols_unified].values)

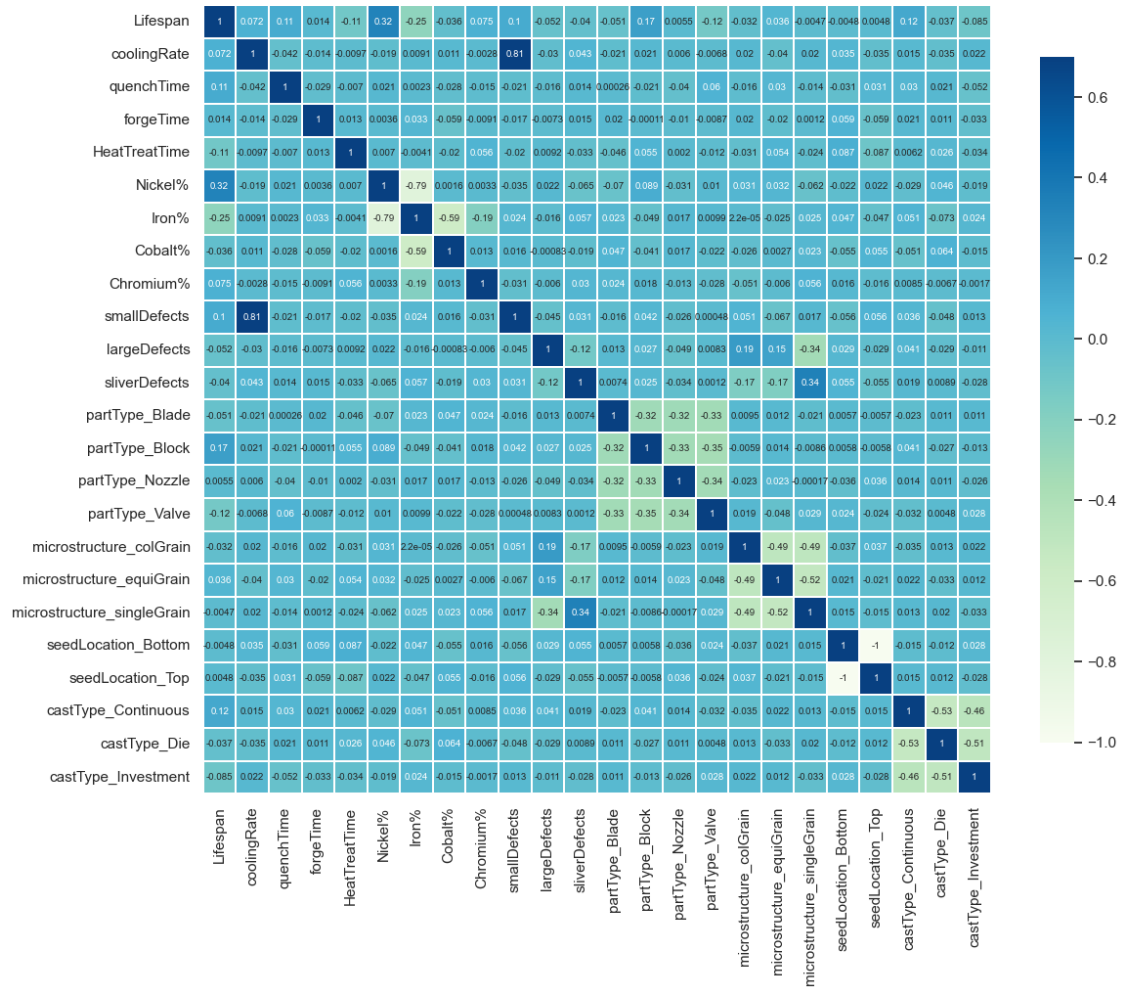
# Convert to DataFrame with feature names
encoded_df = pd.DataFrame(
    encoded_data,
    columns=encoder.get_feature_names_out(categorical_cols_unified)
)

# Combine with non-categorical columns if needed
df = pd.concat([df.drop(columns=categorical_cols_unified), encoded_df], axis=1)
```

```
[160]: sns.set(style="whitegrid", font_scale=1)

plt.figure(figsize=(13,13))
plt.title('Pearson Correlation Matrix',font_size=25)
sns.heatmap(df.corr(),linewidths=0.25,vmax=0.
↳7,square=True,cmap="GnBu",linecolor='w',
    annot=True, annot_kws={"size":7}, cbar_kws={"shrink": .7})
plt.show()
```

# Pearson Correlation Matrix



```
[161]: # Features
X = df.drop('Lifespan',axis=1)

# Target
y = df['Lifespan']

# Split
X_train, X_test, y_train, y_test = train_test_split(X,y,test_size=0.
↪3,random_state=101)
```

```
[162]: print(X_train.shape)
print(X_test.shape)
print(y_train.shape)
print(y_test.shape)
```

(700, 23)

```
(300, 23)
(700,)
(300,)
```

```
[ ]: # Create the scaler
scaler = MinMaxScaler()

# fit and transform
X_train = scaler.fit_transform(X_train)
X_test = scaler.transform(X_test)

# everything has been scaled between 1 and 0
print('Max: ', X_train.max())
print('Min: ', X_train.min())
```

```
Max:  1.0
Min:  0.0
```

```
[164]: model = Sequential()

# input layer
model.add(Dense(19, activation='relu'))

# hidden layers
model.add(Dense(19, activation='relu'))
model.add(Dense(19, activation='relu'))
model.add(Dense(19, activation='relu'))

# output layer
model.add(Dense(1))

model.compile(optimizer='adam', loss='mse')
```

```
[165]: model.fit(x=X_train, y=y_train.values,
                validation_data=(X_test, y_test.values),
                batch_size=128, epochs=400)
```

```
Epoch 1/400
6/6          1s 12ms/step - loss:
1819937.3750 - val_loss: 1775516.1250
Epoch 2/400
6/6          0s 3ms/step - loss:
1814551.7500 - val_loss: 1774902.5000
Epoch 3/400
6/6          0s 3ms/step - loss:
1834421.5000 - val_loss: 1774101.8750
Epoch 4/400
6/6          0s 3ms/step - loss:
1805315.2500 - val_loss: 1773027.5000
```

Epoch 5/400  
6/6            0s 3ms/step - loss:  
1821080.2500 - val\_loss: 1771558.0000  
Epoch 6/400  
6/6            0s 3ms/step - loss:  
1811977.6250 - val\_loss: 1769510.0000  
Epoch 7/400  
6/6            0s 3ms/step - loss:  
1787055.6250 - val\_loss: 1766659.2500  
Epoch 8/400  
6/6            0s 3ms/step - loss:  
1809282.1250 - val\_loss: 1762696.0000  
Epoch 9/400  
6/6            0s 3ms/step - loss:  
1771939.3750 - val\_loss: 1757192.3750  
Epoch 10/400  
6/6            0s 3ms/step - loss:  
1808698.8750 - val\_loss: 1749569.0000  
Epoch 11/400  
6/6            0s 3ms/step - loss:  
1798255.3750 - val\_loss: 1739071.8750  
Epoch 12/400  
6/6            0s 2ms/step - loss:  
1764121.3750 - val\_loss: 1724495.6250  
Epoch 13/400  
6/6            0s 2ms/step - loss:  
1756222.0000 - val\_loss: 1704358.2500  
Epoch 14/400  
6/6            0s 2ms/step - loss:  
1743637.8750 - val\_loss: 1677245.2500  
Epoch 15/400  
6/6            0s 2ms/step - loss:  
1680074.8750 - val\_loss: 1641304.7500  
Epoch 16/400  
6/6            0s 3ms/step - loss:  
1658027.6250 - val\_loss: 1594494.1250  
Epoch 17/400  
6/6            0s 3ms/step - loss:  
1639554.0000 - val\_loss: 1534604.0000  
Epoch 18/400  
6/6            0s 3ms/step - loss:  
1557717.5000 - val\_loss: 1459368.1250  
Epoch 19/400  
6/6            0s 8ms/step - loss:  
1481609.0000 - val\_loss: 1366699.6250  
Epoch 20/400  
6/6            0s 3ms/step - loss:  
1351851.0000 - val\_loss: 1254963.6250

Epoch 21/400  
6/6 0s 2ms/step - loss:  
1261172.0000 - val\_loss: 1123578.0000  
Epoch 22/400  
6/6 0s 2ms/step - loss:  
1145046.1250 - val\_loss: 973979.0625  
Epoch 23/400  
6/6 0s 3ms/step - loss:  
962898.1250 - val\_loss: 810491.9375  
Epoch 24/400  
6/6 0s 3ms/step - loss:  
795762.8125 - val\_loss: 640047.0625  
Epoch 25/400  
6/6 0s 2ms/step - loss:  
602934.6875 - val\_loss: 474673.9062  
Epoch 26/400  
6/6 0s 2ms/step - loss:  
456615.0000 - val\_loss: 327592.0625  
Epoch 27/400  
6/6 0s 3ms/step - loss:  
329896.8750 - val\_loss: 216190.3906  
Epoch 28/400  
6/6 0s 3ms/step - loss:  
210392.5781 - val\_loss: 150018.2031  
Epoch 29/400  
6/6 0s 2ms/step - loss:  
139606.6094 - val\_loss: 126251.6016  
Epoch 30/400  
6/6 0s 2ms/step - loss:  
122133.8672 - val\_loss: 128277.8906  
Epoch 31/400  
6/6 0s 3ms/step - loss:  
118853.2500 - val\_loss: 134069.2812  
Epoch 32/400  
6/6 0s 3ms/step - loss:  
120066.7578 - val\_loss: 134880.5156  
Epoch 33/400  
6/6 0s 3ms/step - loss:  
126691.8984 - val\_loss: 131026.4531  
Epoch 34/400  
6/6 0s 3ms/step - loss:  
123377.5234 - val\_loss: 127355.1875  
Epoch 35/400  
6/6 0s 2ms/step - loss:  
122658.8828 - val\_loss: 125090.9609  
Epoch 36/400  
6/6 0s 8ms/step - loss:  
119586.2500 - val\_loss: 124193.8828

Epoch 37/400  
6/6 0s 3ms/step - loss:  
123977.8906 - val\_loss: 123705.9609  
Epoch 38/400  
6/6 0s 2ms/step - loss:  
120168.4453 - val\_loss: 123560.2266  
Epoch 39/400  
6/6 0s 2ms/step - loss:  
119272.0781 - val\_loss: 123403.9609  
Epoch 40/400  
6/6 0s 2ms/step - loss:  
118913.3984 - val\_loss: 123631.5312  
Epoch 41/400  
6/6 0s 2ms/step - loss:  
114956.9297 - val\_loss: 123793.6797  
Epoch 42/400  
6/6 0s 3ms/step - loss:  
112836.9766 - val\_loss: 124052.1562  
Epoch 43/400  
6/6 0s 3ms/step - loss:  
117430.7734 - val\_loss: 123793.3594  
Epoch 44/400  
6/6 0s 3ms/step - loss:  
119202.6953 - val\_loss: 123380.8516  
Epoch 45/400  
6/6 0s 3ms/step - loss:  
118179.0312 - val\_loss: 123219.2031  
Epoch 46/400  
6/6 0s 3ms/step - loss:  
114825.2109 - val\_loss: 122854.6953  
Epoch 47/400  
6/6 0s 3ms/step - loss:  
111322.9453 - val\_loss: 122618.2969  
Epoch 48/400  
6/6 0s 3ms/step - loss:  
113135.3516 - val\_loss: 122291.9219  
Epoch 49/400  
6/6 0s 3ms/step - loss:  
119800.9297 - val\_loss: 122209.9219  
Epoch 50/400  
6/6 0s 3ms/step - loss:  
115347.8594 - val\_loss: 122118.2969  
Epoch 51/400  
6/6 0s 3ms/step - loss:  
117821.9062 - val\_loss: 121951.0781  
Epoch 52/400  
6/6 0s 4ms/step - loss:  
111437.2656 - val\_loss: 121581.5469

Epoch 53/400  
6/6 0s 3ms/step - loss:  
114550.1719 - val\_loss: 121260.6172  
Epoch 54/400  
6/6 0s 3ms/step - loss:  
110185.0547 - val\_loss: 121056.4922  
Epoch 55/400  
6/6 0s 3ms/step - loss:  
117154.5859 - val\_loss: 120902.5859  
Epoch 56/400  
6/6 0s 3ms/step - loss:  
116766.6953 - val\_loss: 120975.4141  
Epoch 57/400  
6/6 0s 4ms/step - loss:  
112272.4453 - val\_loss: 120992.7031  
Epoch 58/400  
6/6 0s 2ms/step - loss:  
109210.0391 - val\_loss: 120808.5625  
Epoch 59/400  
6/6 0s 2ms/step - loss:  
113178.0781 - val\_loss: 120832.6953  
Epoch 60/400  
6/6 0s 2ms/step - loss:  
111321.1719 - val\_loss: 120632.5625  
Epoch 61/400  
6/6 0s 3ms/step - loss:  
110396.7734 - val\_loss: 120427.5312  
Epoch 62/400  
6/6 0s 3ms/step - loss:  
110315.0078 - val\_loss: 120245.0391  
Epoch 63/400  
6/6 0s 3ms/step - loss:  
114655.0469 - val\_loss: 120052.5859  
Epoch 64/400  
6/6 0s 3ms/step - loss:  
109990.2031 - val\_loss: 119796.1875  
Epoch 65/400  
6/6 0s 3ms/step - loss:  
111900.3906 - val\_loss: 119798.3594  
Epoch 66/400  
6/6 0s 3ms/step - loss:  
108670.2266 - val\_loss: 119666.7500  
Epoch 67/400  
6/6 0s 3ms/step - loss:  
108652.0000 - val\_loss: 119499.3047  
Epoch 68/400  
6/6 0s 7ms/step - loss:  
109646.5625 - val\_loss: 119365.7891



Epoch 69/400  
6/6 0s 3ms/step - loss:  
107762.9375 - val\_loss: 119082.7734  
Epoch 70/400  
6/6 0s 2ms/step - loss:  
108786.6953 - val\_loss: 118916.2812  
Epoch 71/400  
6/6 0s 3ms/step - loss:  
107109.2500 - val\_loss: 118844.7969  
Epoch 72/400  
6/6 0s 3ms/step - loss:  
103020.8828 - val\_loss: 118322.2109  
Epoch 73/400  
6/6 0s 2ms/step - loss:  
110247.4375 - val\_loss: 118178.5469  
Epoch 74/400  
6/6 0s 2ms/step - loss:  
105024.7266 - val\_loss: 118669.9609  
Epoch 75/400  
6/6 0s 3ms/step - loss:  
106410.5234 - val\_loss: 119004.1094  
Epoch 76/400  
6/6 0s 2ms/step - loss:  
110367.5234 - val\_loss: 118685.4688  
Epoch 77/400  
6/6 0s 2ms/step - loss:  
101639.2031 - val\_loss: 118435.2109  
Epoch 78/400  
6/6 0s 2ms/step - loss:  
106626.4688 - val\_loss: 117821.2109  
Epoch 79/400  
6/6 0s 2ms/step - loss:  
104904.3828 - val\_loss: 117488.3438  
Epoch 80/400  
6/6 0s 2ms/step - loss:  
107230.8516 - val\_loss: 117617.6250  
Epoch 81/400  
6/6 0s 2ms/step - loss:  
104780.2188 - val\_loss: 117497.1562  
Epoch 82/400  
6/6 0s 2ms/step - loss:  
100462.8125 - val\_loss: 117661.3828  
Epoch 83/400  
6/6 0s 3ms/step - loss:  
111990.6328 - val\_loss: 117670.8828  
Epoch 84/400  
6/6 0s 4ms/step - loss:  
104479.3438 - val\_loss: 117386.9766

Epoch 85/400  
6/6 0s 3ms/step - loss:  
106663.9531 - val\_loss: 117102.7734  
Epoch 86/400  
6/6 0s 3ms/step - loss:  
111808.9453 - val\_loss: 116762.6797  
Epoch 87/400  
6/6 0s 2ms/step - loss:  
104954.0547 - val\_loss: 116893.6562  
Epoch 88/400  
6/6 0s 2ms/step - loss:  
109097.5234 - val\_loss: 116859.2266  
Epoch 89/400  
6/6 0s 2ms/step - loss:  
105312.4688 - val\_loss: 116788.6016  
Epoch 90/400  
6/6 0s 2ms/step - loss:  
107743.2109 - val\_loss: 116490.9062  
Epoch 91/400  
6/6 0s 2ms/step - loss:  
103914.7031 - val\_loss: 116475.5703  
Epoch 92/400  
6/6 0s 2ms/step - loss:  
102433.9062 - val\_loss: 116310.4766  
Epoch 93/400  
6/6 0s 2ms/step - loss:  
105096.9219 - val\_loss: 116133.1328  
Epoch 94/400  
6/6 0s 2ms/step - loss:  
101475.5469 - val\_loss: 116130.0703  
Epoch 95/400  
6/6 0s 2ms/step - loss:  
103310.3125 - val\_loss: 116069.2812  
Epoch 96/400  
6/6 0s 2ms/step - loss:  
102872.2734 - val\_loss: 116373.2266  
Epoch 97/400  
6/6 0s 2ms/step - loss:  
101132.0312 - val\_loss: 115884.9609  
Epoch 98/400  
6/6 0s 2ms/step - loss:  
106295.7266 - val\_loss: 115991.2109  
Epoch 99/400  
6/6 0s 2ms/step - loss:  
106143.9453 - val\_loss: 115673.0000  
Epoch 100/400  
6/6 0s 2ms/step - loss:  
103689.6094 - val\_loss: 115171.4141

Epoch 101/400  
6/6 0s 6ms/step - loss:  
102461.9688 - val\_loss: 115117.0156  
Epoch 102/400  
6/6 0s 4ms/step - loss:  
108110.4375 - val\_loss: 115261.6953  
Epoch 103/400  
6/6 0s 2ms/step - loss:  
104474.0312 - val\_loss: 114762.2812  
Epoch 104/400  
6/6 0s 2ms/step - loss:  
103253.9453 - val\_loss: 114856.6172  
Epoch 105/400  
6/6 0s 2ms/step - loss:  
102904.0391 - val\_loss: 114516.5234  
Epoch 106/400  
6/6 0s 2ms/step - loss:  
97545.2422 - val\_loss: 114559.7578  
Epoch 107/400  
6/6 0s 2ms/step - loss:  
98829.3047 - val\_loss: 114614.6406  
Epoch 108/400  
6/6 0s 2ms/step - loss:  
109854.3516 - val\_loss: 114887.8672  
Epoch 109/400  
6/6 0s 2ms/step - loss:  
102514.9453 - val\_loss: 114638.9062  
Epoch 110/400  
6/6 0s 2ms/step - loss:  
102045.7500 - val\_loss: 114962.2969  
Epoch 111/400  
6/6 0s 2ms/step - loss:  
98195.1016 - val\_loss: 114602.5312  
Epoch 112/400  
6/6 0s 2ms/step - loss:  
103257.7188 - val\_loss: 114540.7500  
Epoch 113/400  
6/6 0s 2ms/step - loss:  
98452.1875 - val\_loss: 114090.7031  
Epoch 114/400  
6/6 0s 2ms/step - loss:  
105622.2422 - val\_loss: 113950.6406  
Epoch 115/400  
6/6 0s 2ms/step - loss:  
98502.8906 - val\_loss: 113889.7969  
Epoch 116/400  
6/6 0s 2ms/step - loss:  
99989.9766 - val\_loss: 114129.1328

Epoch 117/400  
6/6 0s 2ms/step - loss:  
98660.0859 - val\_loss: 114246.1562  
Epoch 118/400  
6/6 0s 3ms/step - loss:  
98019.0781 - val\_loss: 114340.4922  
Epoch 119/400  
6/6 0s 2ms/step - loss:  
100036.4062 - val\_loss: 113745.6172  
Epoch 120/400  
6/6 0s 2ms/step - loss:  
97700.4453 - val\_loss: 113930.1562  
Epoch 121/400  
6/6 0s 2ms/step - loss:  
102860.2344 - val\_loss: 113651.6172  
Epoch 122/400  
6/6 0s 6ms/step - loss:  
104874.1016 - val\_loss: 113212.2266  
Epoch 123/400  
6/6 0s 2ms/step - loss:  
99323.6797 - val\_loss: 112685.4297  
Epoch 124/400  
6/6 0s 2ms/step - loss:  
101578.6797 - val\_loss: 112835.9453  
Epoch 125/400  
6/6 0s 2ms/step - loss:  
102078.9375 - val\_loss: 113092.4141  
Epoch 126/400  
6/6 0s 2ms/step - loss:  
102415.4219 - val\_loss: 113137.9062  
Epoch 127/400  
6/6 0s 2ms/step - loss:  
100358.6016 - val\_loss: 112316.4922  
Epoch 128/400  
6/6 0s 2ms/step - loss:  
99254.6719 - val\_loss: 112207.0156  
Epoch 129/400  
6/6 0s 2ms/step - loss:  
97217.8984 - val\_loss: 112444.8125  
Epoch 130/400  
6/6 0s 2ms/step - loss:  
97046.7812 - val\_loss: 112692.3750  
Epoch 131/400  
6/6 0s 2ms/step - loss:  
96367.3984 - val\_loss: 112710.8906  
Epoch 132/400  
6/6 0s 2ms/step - loss:  
98706.4922 - val\_loss: 112191.9062

Epoch 133/400  
6/6 0s 2ms/step - loss:  
98006.7109 - val\_loss: 111801.5000  
Epoch 134/400  
6/6 0s 2ms/step - loss:  
98361.1719 - val\_loss: 112207.3203  
Epoch 135/400  
6/6 0s 2ms/step - loss:  
98070.4766 - val\_loss: 112923.3359  
Epoch 136/400  
6/6 0s 2ms/step - loss:  
97748.4375 - val\_loss: 112546.8906  
Epoch 137/400  
6/6 0s 2ms/step - loss:  
98737.1406 - val\_loss: 112384.0156  
Epoch 138/400  
6/6 0s 2ms/step - loss:  
97716.1875 - val\_loss: 112085.3750  
Epoch 139/400  
6/6 0s 2ms/step - loss:  
98283.9141 - val\_loss: 111771.3516  
Epoch 140/400  
6/6 0s 2ms/step - loss:  
97093.0391 - val\_loss: 111548.3672  
Epoch 141/400  
6/6 0s 3ms/step - loss:  
95252.0156 - val\_loss: 111813.6016  
Epoch 142/400  
6/6 0s 2ms/step - loss:  
101327.4688 - val\_loss: 111369.0781  
Epoch 143/400  
6/6 0s 2ms/step - loss:  
94222.5703 - val\_loss: 111577.5703  
Epoch 144/400  
6/6 0s 2ms/step - loss:  
98134.1719 - val\_loss: 111690.7266  
Epoch 145/400  
6/6 0s 2ms/step - loss:  
100345.1484 - val\_loss: 111245.5312  
Epoch 146/400  
6/6 0s 2ms/step - loss:  
96658.1172 - val\_loss: 111506.8828  
Epoch 147/400  
6/6 0s 2ms/step - loss:  
96013.8203 - val\_loss: 110836.4297  
Epoch 148/400  
6/6 0s 2ms/step - loss:  
99181.6562 - val\_loss: 110508.7891

Epoch 149/400  
6/6 0s 2ms/step - loss:  
95296.0234 - val\_loss: 110899.4297  
Epoch 150/400  
6/6 0s 2ms/step - loss:  
94639.5469 - val\_loss: 111447.1953  
Epoch 151/400  
6/6 0s 2ms/step - loss:  
96391.1016 - val\_loss: 110918.3203  
Epoch 152/400  
6/6 0s 2ms/step - loss:  
96020.0078 - val\_loss: 110732.4922  
Epoch 153/400  
6/6 0s 2ms/step - loss:  
96805.9062 - val\_loss: 110833.1094  
Epoch 154/400  
6/6 0s 2ms/step - loss:  
96074.4844 - val\_loss: 110868.1250  
Epoch 155/400  
6/6 0s 2ms/step - loss:  
95204.5078 - val\_loss: 111120.7422  
Epoch 156/400  
6/6 0s 2ms/step - loss:  
96211.8594 - val\_loss: 110651.7109  
Epoch 157/400  
6/6 0s 2ms/step - loss:  
94772.8047 - val\_loss: 110540.0547  
Epoch 158/400  
6/6 0s 2ms/step - loss:  
94690.0234 - val\_loss: 110450.5312  
Epoch 159/400  
6/6 0s 6ms/step - loss:  
90832.4922 - val\_loss: 110214.1953  
Epoch 160/400  
6/6 0s 2ms/step - loss:  
96529.7734 - val\_loss: 110263.5859  
Epoch 161/400  
6/6 0s 2ms/step - loss:  
96774.3984 - val\_loss: 110681.6875  
Epoch 162/400  
6/6 0s 2ms/step - loss:  
97718.1406 - val\_loss: 110968.5078  
Epoch 163/400  
6/6 0s 2ms/step - loss:  
93428.1250 - val\_loss: 111002.3516  
Epoch 164/400  
6/6 0s 2ms/step - loss:  
93197.6484 - val\_loss: 110615.3594

Epoch 165/400  
6/6 0s 2ms/step - loss:  
98993.0234 - val\_loss: 110075.1172  
Epoch 166/400  
6/6 0s 2ms/step - loss:  
88931.4219 - val\_loss: 109576.2969  
Epoch 167/400  
6/6 0s 2ms/step - loss:  
94664.4531 - val\_loss: 109793.6484  
Epoch 168/400  
6/6 0s 2ms/step - loss:  
97629.1875 - val\_loss: 110226.7812  
Epoch 169/400  
6/6 0s 2ms/step - loss:  
94654.1328 - val\_loss: 110211.3750  
Epoch 170/400  
6/6 0s 3ms/step - loss:  
95436.6953 - val\_loss: 109094.2656  
Epoch 171/400  
6/6 0s 2ms/step - loss:  
97258.0078 - val\_loss: 109274.2344  
Epoch 172/400  
6/6 0s 2ms/step - loss:  
91902.5859 - val\_loss: 109177.8203  
Epoch 173/400  
6/6 0s 3ms/step - loss:  
90337.4688 - val\_loss: 109234.8281  
Epoch 174/400  
6/6 0s 5ms/step - loss:  
91576.4531 - val\_loss: 109292.8281  
Epoch 175/400  
6/6 0s 2ms/step - loss:  
99666.7109 - val\_loss: 109996.0781  
Epoch 176/400  
6/6 0s 2ms/step - loss:  
87911.8047 - val\_loss: 110105.1719  
Epoch 177/400  
6/6 0s 2ms/step - loss:  
92993.7109 - val\_loss: 109032.0078  
Epoch 178/400  
6/6 0s 3ms/step - loss:  
90627.9141 - val\_loss: 108420.7109  
Epoch 179/400  
6/6 0s 2ms/step - loss:  
88687.5078 - val\_loss: 109379.9453  
Epoch 180/400  
6/6 0s 2ms/step - loss:  
94302.1719 - val\_loss: 109765.6016

Epoch 181/400  
6/6 0s 2ms/step - loss:  
90971.7656 - val\_loss: 110365.1406  
Epoch 182/400  
6/6 0s 3ms/step - loss:  
94163.1484 - val\_loss: 109035.3047  
Epoch 183/400  
6/6 0s 3ms/step - loss:  
93391.6406 - val\_loss: 108550.4766  
Epoch 184/400  
6/6 0s 3ms/step - loss:  
94477.3516 - val\_loss: 108385.2500  
Epoch 185/400  
6/6 0s 2ms/step - loss:  
88947.7266 - val\_loss: 108207.7109  
Epoch 186/400  
6/6 0s 3ms/step - loss:  
89471.4219 - val\_loss: 108995.2734  
Epoch 187/400  
6/6 0s 4ms/step - loss:  
90249.4141 - val\_loss: 109544.1484  
Epoch 188/400  
6/6 0s 4ms/step - loss:  
94341.9062 - val\_loss: 108543.2812  
Epoch 189/400  
6/6 0s 5ms/step - loss:  
92137.7500 - val\_loss: 108487.3984  
Epoch 190/400  
6/6 0s 3ms/step - loss:  
92902.0859 - val\_loss: 108302.2109  
Epoch 191/400  
6/6 0s 3ms/step - loss:  
92276.5234 - val\_loss: 108629.5078  
Epoch 192/400  
6/6 0s 3ms/step - loss:  
88845.3438 - val\_loss: 108826.6016  
Epoch 193/400  
6/6 0s 2ms/step - loss:  
90887.9141 - val\_loss: 108592.0625  
Epoch 194/400  
6/6 0s 2ms/step - loss:  
89024.6641 - val\_loss: 108343.4141  
Epoch 195/400  
6/6 0s 3ms/step - loss:  
89592.8203 - val\_loss: 107940.2031  
Epoch 196/400  
6/6 0s 4ms/step - loss:  
88006.6484 - val\_loss: 108130.6484



Epoch 197/400  
6/6 0s 3ms/step - loss:  
93790.0234 - val\_loss: 108441.0156  
Epoch 198/400  
6/6 0s 3ms/step - loss:  
91230.0078 - val\_loss: 108442.4766  
Epoch 199/400  
6/6 0s 4ms/step - loss:  
89317.3828 - val\_loss: 108015.4375  
Epoch 200/400  
6/6 0s 3ms/step - loss:  
90899.8750 - val\_loss: 108223.6797  
Epoch 201/400  
6/6 0s 3ms/step - loss:  
89723.3125 - val\_loss: 107851.3516  
Epoch 202/400  
6/6 0s 21ms/step - loss:  
90614.9922 - val\_loss: 108597.1172  
Epoch 203/400  
6/6 0s 6ms/step - loss:  
87957.8594 - val\_loss: 108224.7109  
Epoch 204/400  
6/6 0s 3ms/step - loss:  
89541.8906 - val\_loss: 107575.3594  
Epoch 205/400  
6/6 0s 2ms/step - loss:  
92335.7031 - val\_loss: 107548.0391  
Epoch 206/400  
6/6 0s 2ms/step - loss:  
89110.9453 - val\_loss: 108462.7734  
Epoch 207/400  
6/6 0s 2ms/step - loss:  
96530.5547 - val\_loss: 108200.7500  
Epoch 208/400  
6/6 0s 2ms/step - loss:  
89586.0312 - val\_loss: 107559.1328  
Epoch 209/400  
6/6 0s 2ms/step - loss:  
89890.8047 - val\_loss: 107560.4766  
Epoch 210/400  
6/6 0s 3ms/step - loss:  
90282.8984 - val\_loss: 107990.6562  
Epoch 211/400  
6/6 0s 4ms/step - loss:  
93354.3438 - val\_loss: 107951.4062  
Epoch 212/400  
6/6 0s 4ms/step - loss:  
94410.2812 - val\_loss: 107660.7500

Epoch 213/400  
6/6 0s 3ms/step - loss:  
89824.8594 - val\_loss: 107443.6406  
Epoch 214/400  
6/6 0s 3ms/step - loss:  
89773.1250 - val\_loss: 107613.3984  
Epoch 215/400  
6/6 0s 3ms/step - loss:  
94100.9609 - val\_loss: 107716.5703  
Epoch 216/400  
6/6 0s 3ms/step - loss:  
90076.0312 - val\_loss: 107654.8516  
Epoch 217/400  
6/6 0s 2ms/step - loss:  
87924.8203 - val\_loss: 107329.6797  
Epoch 218/400  
6/6 0s 3ms/step - loss:  
90423.2656 - val\_loss: 108064.8047  
Epoch 219/400  
6/6 0s 3ms/step - loss:  
89514.8750 - val\_loss: 108202.2422  
Epoch 220/400  
6/6 0s 2ms/step - loss:  
93605.6094 - val\_loss: 107974.1172  
Epoch 221/400  
6/6 0s 3ms/step - loss:  
90389.1406 - val\_loss: 107418.7422  
Epoch 222/400  
6/6 0s 2ms/step - loss:  
87132.9531 - val\_loss: 107114.5547  
Epoch 223/400  
6/6 0s 4ms/step - loss:  
88393.7422 - val\_loss: 107487.3359  
Epoch 224/400  
6/6 0s 2ms/step - loss:  
87727.1719 - val\_loss: 107421.5156  
Epoch 225/400  
6/6 0s 2ms/step - loss:  
88609.5156 - val\_loss: 107607.2109  
Epoch 226/400  
6/6 0s 2ms/step - loss:  
90929.6953 - val\_loss: 107820.4453  
Epoch 227/400  
6/6 0s 2ms/step - loss:  
87169.1562 - val\_loss: 107220.6562  
Epoch 228/400  
6/6 0s 2ms/step - loss:  
89676.2656 - val\_loss: 107251.7969

Epoch 229/400  
6/6 0s 2ms/step - loss:  
93135.4062 - val\_loss: 107328.0859  
Epoch 230/400  
6/6 0s 2ms/step - loss:  
92025.5078 - val\_loss: 107570.8516  
Epoch 231/400  
6/6 0s 2ms/step - loss:  
90353.1172 - val\_loss: 107720.5078  
Epoch 232/400  
6/6 0s 2ms/step - loss:  
88645.4609 - val\_loss: 107009.6172  
Epoch 233/400  
6/6 0s 2ms/step - loss:  
86084.0156 - val\_loss: 106707.5156  
Epoch 234/400  
6/6 0s 2ms/step - loss:  
90035.9453 - val\_loss: 106854.4609  
Epoch 235/400  
6/6 0s 2ms/step - loss:  
88612.1875 - val\_loss: 107467.4062  
Epoch 236/400  
6/6 0s 4ms/step - loss:  
87730.5547 - val\_loss: 108081.1172  
Epoch 237/400  
6/6 0s 2ms/step - loss:  
85486.9375 - val\_loss: 107445.0391  
Epoch 238/400  
6/6 0s 3ms/step - loss:  
88752.3281 - val\_loss: 107267.3594  
Epoch 239/400  
6/6 0s 3ms/step - loss:  
90761.1953 - val\_loss: 107042.7969  
Epoch 240/400  
6/6 0s 3ms/step - loss:  
91484.7422 - val\_loss: 107884.6094  
Epoch 241/400  
6/6 0s 2ms/step - loss:  
89807.7344 - val\_loss: 107492.1016  
Epoch 242/400  
6/6 0s 3ms/step - loss:  
90370.1797 - val\_loss: 107244.0234  
Epoch 243/400  
6/6 0s 3ms/step - loss:  
88742.8359 - val\_loss: 106464.0703  
Epoch 244/400  
6/6 0s 3ms/step - loss:  
92070.2422 - val\_loss: 106486.4141

Epoch 245/400  
6/6 0s 2ms/step - loss:  
86635.8750 - val\_loss: 106664.3203  
Epoch 246/400  
6/6 0s 5ms/step - loss:  
91732.4531 - val\_loss: 106735.8516  
Epoch 247/400  
6/6 0s 4ms/step - loss:  
92798.2031 - val\_loss: 106645.3359  
Epoch 248/400  
6/6 0s 3ms/step - loss:  
91542.8047 - val\_loss: 106762.7969  
Epoch 249/400  
6/6 0s 2ms/step - loss:  
86597.5859 - val\_loss: 107078.5703  
Epoch 250/400  
6/6 0s 3ms/step - loss:  
89636.2188 - val\_loss: 106993.7656  
Epoch 251/400  
6/6 0s 3ms/step - loss:  
90184.1328 - val\_loss: 106695.2031  
Epoch 252/400  
6/6 0s 3ms/step - loss:  
93240.4297 - val\_loss: 107212.5703  
Epoch 253/400  
6/6 0s 3ms/step - loss:  
93983.4062 - val\_loss: 107194.0781  
Epoch 254/400  
6/6 0s 2ms/step - loss:  
92513.9766 - val\_loss: 106539.3984  
Epoch 255/400  
6/6 0s 2ms/step - loss:  
90359.2188 - val\_loss: 106379.8438  
Epoch 256/400  
6/6 0s 2ms/step - loss:  
87712.0547 - val\_loss: 106801.6250  
Epoch 257/400  
6/6 0s 3ms/step - loss:  
86235.2500 - val\_loss: 107970.7969  
Epoch 258/400  
6/6 0s 2ms/step - loss:  
89782.1172 - val\_loss: 107068.9766  
Epoch 259/400  
6/6 0s 5ms/step - loss:  
85534.7188 - val\_loss: 106406.3281  
Epoch 260/400  
6/6 0s 2ms/step - loss:  
89162.5547 - val\_loss: 106010.5703

Epoch 261/400  
6/6 0s 2ms/step - loss:  
88878.1641 - val\_loss: 106583.1719  
Epoch 262/400  
6/6 0s 3ms/step - loss:  
88761.0625 - val\_loss: 108115.5547  
Epoch 263/400  
6/6 0s 2ms/step - loss:  
85107.6641 - val\_loss: 106933.5000  
Epoch 264/400  
6/6 0s 2ms/step - loss:  
89114.9062 - val\_loss: 106439.2578  
Epoch 265/400  
6/6 0s 2ms/step - loss:  
86611.2109 - val\_loss: 106386.6953  
Epoch 266/400  
6/6 0s 2ms/step - loss:  
85674.8594 - val\_loss: 106805.9688  
Epoch 267/400  
6/6 0s 2ms/step - loss:  
90384.8594 - val\_loss: 107299.5156  
Epoch 268/400  
6/6 0s 2ms/step - loss:  
84610.0000 - val\_loss: 107476.0625  
Epoch 269/400  
6/6 0s 2ms/step - loss:  
85105.8828 - val\_loss: 106706.9609  
Epoch 270/400  
6/6 0s 2ms/step - loss:  
88928.1016 - val\_loss: 106373.4922  
Epoch 271/400  
6/6 0s 2ms/step - loss:  
91152.7422 - val\_loss: 106008.5312  
Epoch 272/400  
6/6 0s 2ms/step - loss:  
83982.1484 - val\_loss: 106419.0703  
Epoch 273/400  
6/6 0s 2ms/step - loss:  
88417.5391 - val\_loss: 107447.6641  
Epoch 274/400  
6/6 0s 2ms/step - loss:  
91683.7422 - val\_loss: 107242.0547  
Epoch 275/400  
6/6 0s 2ms/step - loss:  
92272.3516 - val\_loss: 106167.4453  
Epoch 276/400  
6/6 0s 2ms/step - loss:  
89277.7578 - val\_loss: 106196.9688

Epoch 277/400  
6/6 0s 3ms/step - loss:  
89609.6406 - val\_loss: 107005.3828  
Epoch 278/400  
6/6 0s 2ms/step - loss:  
92346.2578 - val\_loss: 107212.6641  
Epoch 279/400  
6/6 0s 2ms/step - loss:  
87587.0234 - val\_loss: 106831.1641  
Epoch 280/400  
6/6 0s 2ms/step - loss:  
88523.3203 - val\_loss: 106899.3516  
Epoch 281/400  
6/6 0s 2ms/step - loss:  
88081.6016 - val\_loss: 105867.9844  
Epoch 282/400  
6/6 0s 2ms/step - loss:  
86006.5156 - val\_loss: 106142.8359  
Epoch 283/400  
6/6 0s 2ms/step - loss:  
87802.6641 - val\_loss: 107503.8750  
Epoch 284/400  
6/6 0s 2ms/step - loss:  
89428.9062 - val\_loss: 108541.9219  
Epoch 285/400  
6/6 0s 2ms/step - loss:  
88372.9688 - val\_loss: 106855.8281  
Epoch 286/400  
6/6 0s 2ms/step - loss:  
88564.3203 - val\_loss: 106672.8203  
Epoch 287/400  
6/6 0s 2ms/step - loss:  
86925.2578 - val\_loss: 106256.0469  
Epoch 288/400  
6/6 0s 2ms/step - loss:  
87952.9297 - val\_loss: 106715.9531  
Epoch 289/400  
6/6 0s 2ms/step - loss:  
86400.1484 - val\_loss: 106807.1484  
Epoch 290/400  
6/6 0s 2ms/step - loss:  
90472.0156 - val\_loss: 107422.4531  
Epoch 291/400  
6/6 0s 3ms/step - loss:  
87693.1484 - val\_loss: 106704.5703  
Epoch 292/400  
6/6 0s 2ms/step - loss:  
89335.4766 - val\_loss: 106583.3047

Epoch 293/400  
6/6 0s 3ms/step - loss:  
89490.0078 - val\_loss: 107248.5625  
Epoch 294/400  
6/6 0s 3ms/step - loss:  
89725.6719 - val\_loss: 106213.6562  
Epoch 295/400  
6/6 0s 3ms/step - loss:  
87927.5938 - val\_loss: 106381.2188  
Epoch 296/400  
6/6 0s 3ms/step - loss:  
87858.6484 - val\_loss: 106787.8594  
Epoch 297/400  
6/6 0s 3ms/step - loss:  
86178.2812 - val\_loss: 106149.8984  
Epoch 298/400  
6/6 0s 3ms/step - loss:  
87538.1719 - val\_loss: 106148.5234  
Epoch 299/400  
6/6 0s 3ms/step - loss:  
87750.8828 - val\_loss: 107139.4922  
Epoch 300/400  
6/6 0s 8ms/step - loss:  
88466.6094 - val\_loss: 106720.3438  
Epoch 301/400  
6/6 0s 3ms/step - loss:  
89579.1484 - val\_loss: 106497.5469  
Epoch 302/400  
6/6 0s 3ms/step - loss:  
88372.0781 - val\_loss: 106569.4688  
Epoch 303/400  
6/6 0s 3ms/step - loss:  
87217.2344 - val\_loss: 106284.9453  
Epoch 304/400  
6/6 0s 3ms/step - loss:  
82623.2734 - val\_loss: 105745.7969  
Epoch 305/400  
6/6 0s 3ms/step - loss:  
89877.9688 - val\_loss: 106627.0703  
Epoch 306/400  
6/6 0s 3ms/step - loss:  
83830.3125 - val\_loss: 106644.8125  
Epoch 307/400  
6/6 0s 3ms/step - loss:  
88410.6953 - val\_loss: 106465.9766  
Epoch 308/400  
6/6 0s 2ms/step - loss:  
84691.6250 - val\_loss: 105641.6797

Epoch 309/400  
6/6 0s 2ms/step - loss:  
84223.8828 - val\_loss: 106782.2578  
Epoch 310/400  
6/6 0s 3ms/step - loss:  
86464.1172 - val\_loss: 106430.9062  
Epoch 311/400  
6/6 0s 8ms/step - loss:  
87665.9531 - val\_loss: 106549.8828  
Epoch 312/400  
6/6 0s 3ms/step - loss:  
85651.8359 - val\_loss: 106795.0312  
Epoch 313/400  
6/6 0s 3ms/step - loss:  
89288.6484 - val\_loss: 106245.7969  
Epoch 314/400  
6/6 0s 3ms/step - loss:  
83874.6719 - val\_loss: 106064.6562  
Epoch 315/400  
6/6 0s 3ms/step - loss:  
87701.8125 - val\_loss: 106300.3203  
Epoch 316/400  
6/6 0s 3ms/step - loss:  
86216.4609 - val\_loss: 106450.6172  
Epoch 317/400  
6/6 0s 3ms/step - loss:  
90734.5781 - val\_loss: 106962.6875  
Epoch 318/400  
6/6 0s 2ms/step - loss:  
83655.7969 - val\_loss: 106335.9297  
Epoch 319/400  
6/6 0s 3ms/step - loss:  
86773.8438 - val\_loss: 107248.7656  
Epoch 320/400  
6/6 0s 2ms/step - loss:  
87550.8125 - val\_loss: 107155.7734  
Epoch 321/400  
6/6 0s 2ms/step - loss:  
86886.8047 - val\_loss: 106208.5234  
Epoch 322/400  
6/6 0s 2ms/step - loss:  
83222.0000 - val\_loss: 106274.3359  
Epoch 323/400  
6/6 0s 2ms/step - loss:  
88737.9844 - val\_loss: 106398.3984  
Epoch 324/400  
6/6 0s 2ms/step - loss:  
83759.2891 - val\_loss: 107464.9219



Epoch 325/400  
6/6 0s 2ms/step - loss:  
88876.3125 - val\_loss: 107560.2656  
Epoch 326/400  
6/6 0s 2ms/step - loss:  
84535.6094 - val\_loss: 107665.0938  
Epoch 327/400  
6/6 0s 3ms/step - loss:  
87867.3672 - val\_loss: 107273.7344  
Epoch 328/400  
6/6 0s 2ms/step - loss:  
86903.4219 - val\_loss: 105759.0547  
Epoch 329/400  
6/6 0s 3ms/step - loss:  
82724.6172 - val\_loss: 106009.3047  
Epoch 330/400  
6/6 0s 3ms/step - loss:  
88764.5000 - val\_loss: 106468.9453  
Epoch 331/400  
6/6 0s 2ms/step - loss:  
88067.5078 - val\_loss: 107466.6406  
Epoch 332/400  
6/6 0s 2ms/step - loss:  
89447.3281 - val\_loss: 106714.6406  
Epoch 333/400  
6/6 0s 2ms/step - loss:  
89493.1250 - val\_loss: 105996.3047  
Epoch 334/400  
6/6 0s 2ms/step - loss:  
88554.9297 - val\_loss: 105774.7578  
Epoch 335/400  
6/6 0s 3ms/step - loss:  
83233.0938 - val\_loss: 106206.9219  
Epoch 336/400  
6/6 0s 2ms/step - loss:  
83315.7344 - val\_loss: 106397.5234  
Epoch 337/400  
6/6 0s 2ms/step - loss:  
89630.4609 - val\_loss: 108378.6875  
Epoch 338/400  
6/6 0s 2ms/step - loss:  
85909.4297 - val\_loss: 107483.1797  
Epoch 339/400  
6/6 0s 7ms/step - loss:  
90776.8125 - val\_loss: 106685.3828  
Epoch 340/400  
6/6 0s 3ms/step - loss:  
87666.3672 - val\_loss: 105992.1250

Epoch 341/400  
6/6 0s 2ms/step - loss:  
89496.5000 - val\_loss: 106458.3594  
Epoch 342/400  
6/6 0s 2ms/step - loss:  
85490.4375 - val\_loss: 107017.3984  
Epoch 343/400  
6/6 0s 2ms/step - loss:  
82829.5234 - val\_loss: 106479.3438  
Epoch 344/400  
6/6 0s 2ms/step - loss:  
87686.5781 - val\_loss: 107007.8203  
Epoch 345/400  
6/6 0s 2ms/step - loss:  
86049.0703 - val\_loss: 106964.7266  
Epoch 346/400  
6/6 0s 2ms/step - loss:  
82903.0703 - val\_loss: 106966.4297  
Epoch 347/400  
6/6 0s 2ms/step - loss:  
88426.5859 - val\_loss: 106777.8594  
Epoch 348/400  
6/6 0s 2ms/step - loss:  
84117.6641 - val\_loss: 107062.6328  
Epoch 349/400  
6/6 0s 2ms/step - loss:  
84204.5469 - val\_loss: 106835.5234  
Epoch 350/400  
6/6 0s 2ms/step - loss:  
86470.4375 - val\_loss: 106886.4766  
Epoch 351/400  
6/6 0s 7ms/step - loss:  
87813.1641 - val\_loss: 107505.1953  
Epoch 352/400  
6/6 0s 2ms/step - loss:  
87061.2266 - val\_loss: 107804.0938  
Epoch 353/400  
6/6 0s 2ms/step - loss:  
84749.9297 - val\_loss: 106985.4375  
Epoch 354/400  
6/6 0s 2ms/step - loss:  
86957.5156 - val\_loss: 106187.5703  
Epoch 355/400  
6/6 0s 2ms/step - loss:  
87400.0781 - val\_loss: 106601.7031  
Epoch 356/400  
6/6 0s 2ms/step - loss:  
88310.1562 - val\_loss: 106642.8750

Epoch 357/400  
6/6 0s 2ms/step - loss:  
87390.3516 - val\_loss: 107093.0234  
Epoch 358/400  
6/6 0s 2ms/step - loss:  
85978.0078 - val\_loss: 107850.9844  
Epoch 359/400  
6/6 0s 2ms/step - loss:  
87717.8281 - val\_loss: 106626.3125  
Epoch 360/400  
6/6 0s 2ms/step - loss:  
89207.5703 - val\_loss: 106606.5312  
Epoch 361/400  
6/6 0s 2ms/step - loss:  
86277.4375 - val\_loss: 106597.7031  
Epoch 362/400  
6/6 0s 2ms/step - loss:  
89460.3516 - val\_loss: 108071.3281  
Epoch 363/400  
6/6 0s 3ms/step - loss:  
86678.2031 - val\_loss: 107122.0703  
Epoch 364/400  
6/6 0s 2ms/step - loss:  
87422.8984 - val\_loss: 106949.8203  
Epoch 365/400  
6/6 0s 2ms/step - loss:  
85358.6094 - val\_loss: 107175.2109  
Epoch 366/400  
6/6 0s 2ms/step - loss:  
86214.2812 - val\_loss: 107202.7656  
Epoch 367/400  
6/6 0s 2ms/step - loss:  
86328.5078 - val\_loss: 106823.1562  
Epoch 368/400  
6/6 0s 2ms/step - loss:  
86054.2031 - val\_loss: 107908.4453  
Epoch 369/400  
6/6 0s 2ms/step - loss:  
85313.1016 - val\_loss: 106783.6172  
Epoch 370/400  
6/6 0s 3ms/step - loss:  
84333.2969 - val\_loss: 107323.5078  
Epoch 371/400  
6/6 0s 3ms/step - loss:  
88295.7812 - val\_loss: 107342.6875  
Epoch 372/400  
6/6 0s 3ms/step - loss:  
86097.6094 - val\_loss: 108608.7031

Epoch 373/400  
6/6 0s 7ms/step - loss:  
88171.9766 - val\_loss: 107182.1562  
Epoch 374/400  
6/6 0s 2ms/step - loss:  
84382.8359 - val\_loss: 106069.2812  
Epoch 375/400  
6/6 0s 2ms/step - loss:  
85555.0547 - val\_loss: 107163.3203  
Epoch 376/400  
6/6 0s 3ms/step - loss:  
86626.3828 - val\_loss: 108699.6328  
Epoch 377/400  
6/6 0s 2ms/step - loss:  
86950.2578 - val\_loss: 107049.7344  
Epoch 378/400  
6/6 0s 2ms/step - loss:  
85051.1172 - val\_loss: 106599.4297  
Epoch 379/400  
6/6 0s 2ms/step - loss:  
86371.4141 - val\_loss: 107000.4141  
Epoch 380/400  
6/6 0s 2ms/step - loss:  
87292.5000 - val\_loss: 108751.0000  
Epoch 381/400  
6/6 0s 2ms/step - loss:  
90962.1328 - val\_loss: 108741.9531  
Epoch 382/400  
6/6 0s 2ms/step - loss:  
88135.9062 - val\_loss: 107717.5234  
Epoch 383/400  
6/6 0s 5ms/step - loss:  
86612.0781 - val\_loss: 106565.9844  
Epoch 384/400  
6/6 0s 2ms/step - loss:  
82904.1250 - val\_loss: 106232.0156  
Epoch 385/400  
6/6 0s 3ms/step - loss:  
88132.1719 - val\_loss: 107573.8359  
Epoch 386/400  
6/6 0s 3ms/step - loss:  
82320.8359 - val\_loss: 108305.2656  
Epoch 387/400  
6/6 0s 3ms/step - loss:  
86440.2188 - val\_loss: 107160.9844  
Epoch 388/400  
6/6 0s 2ms/step - loss:  
82532.3281 - val\_loss: 105971.1719

```

Epoch 389/400
6/6          0s 2ms/step - loss:
86378.3984 - val_loss: 106707.3594
Epoch 390/400
6/6          0s 2ms/step - loss:
83857.8984 - val_loss: 107341.3828
Epoch 391/400
6/6          0s 2ms/step - loss:
88376.5938 - val_loss: 108772.5078
Epoch 392/400
6/6          0s 2ms/step - loss:
87843.7656 - val_loss: 107671.9062
Epoch 393/400
6/6          0s 3ms/step - loss:
87286.4141 - val_loss: 105906.7422
Epoch 394/400
6/6          0s 2ms/step - loss:
88434.3906 - val_loss: 106373.0703
Epoch 395/400
6/6          0s 2ms/step - loss:
86266.1484 - val_loss: 107441.0156
Epoch 396/400
6/6          0s 2ms/step - loss:
84540.9688 - val_loss: 108696.9844
Epoch 397/400
6/6          0s 2ms/step - loss:
91064.8516 - val_loss: 108133.7031
Epoch 398/400
6/6          0s 2ms/step - loss:
90119.5703 - val_loss: 106296.8359
Epoch 399/400
6/6          0s 2ms/step - loss:
87005.0156 - val_loss: 106179.3750
Epoch 400/400
6/6          0s 2ms/step - loss:
89093.9453 - val_loss: 108000.2656

```

```
[165]: <keras.src.callbacks.history.History at 0x15bc2b190>
```

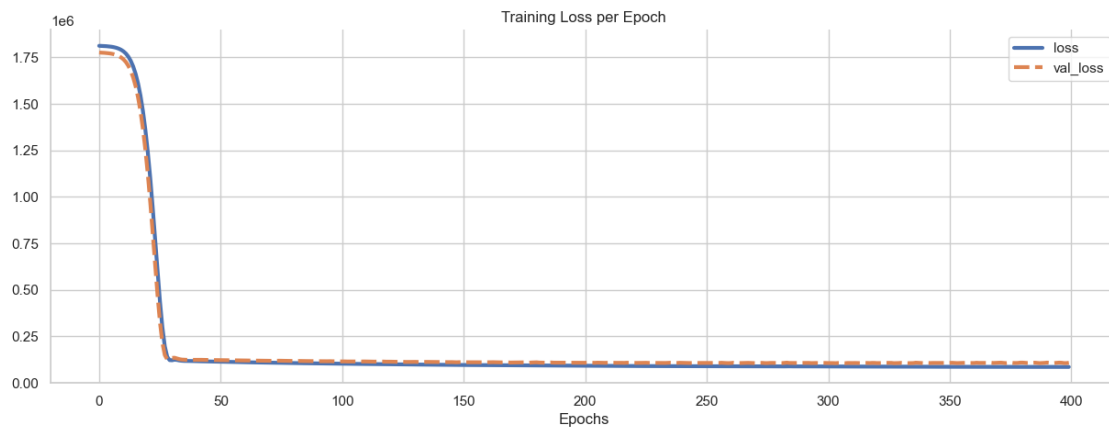
```
[166]: losses = pd.DataFrame(model.history.history)
```

```

plt.figure(figsize=(15,5))
sns.lineplot(data=losses,lw=3)
plt.xlabel('Epochs')
plt.ylabel('')
plt.title('Training Loss per Epoch')
sns.despine()

```

```
plt.show()
```



```
[167]: # predictions on the test set
predictions = model.predict(X_test)

print('MAE: ',mean_absolute_error(y_test,predictions))
print('MSE: ',mean_squared_error(y_test,predictions))
print('RMSE: ',np.sqrt(mean_squared_error(y_test,predictions)))
print('Variance Regression Score:␣
      ↪',explained_variance_score(y_test,predictions))

print('\n\nDescriptive Statistics:\n',df['Lifespan'].describe())
```

```
10/10          0s 2ms/step
MAE:  285.22125340983075
MSE:  108000.26749535257
RMSE:  328.6339414840661
Variance Regression Score:  0.12039011844668857
```

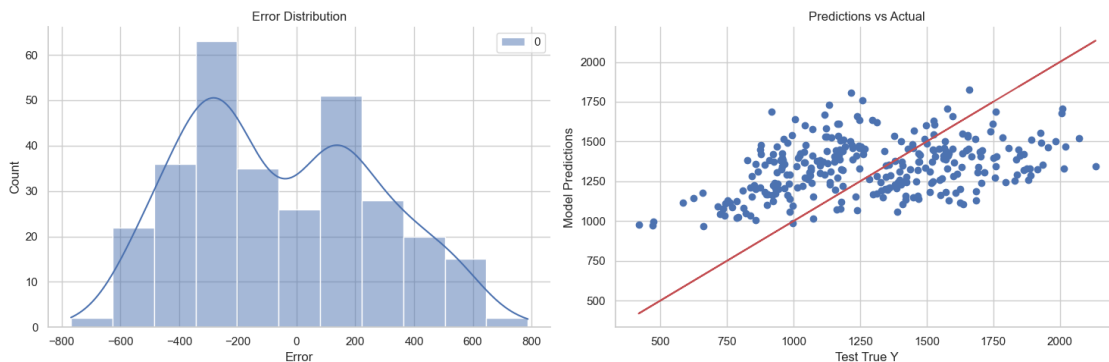
```
Descriptive Statistics:
count    1000.000000
mean     1298.556320
std       340.071434
min       417.990000
25%      1047.257500
50%      1266.040000
75%      1563.050000
max       2134.530000
Name: Lifespan, dtype: float64
```

```
[168]: f, axes = plt.subplots(1, 2, figsize=(15,5))

# Plot 1: Error Distribution
errors = y_test.values.reshape(300, 1) - predictions
sns.histplot(errors, ax=axes[0], kde=True) # Using histplot instead of
↳ distplot as distplot is deprecated
axes[0].set(xlabel='Error', ylabel='Count', title='Error Distribution')

# Plot 2: Predictions vs Actual
axes[1].scatter(y_test, predictions)
axes[1].plot(y_test, y_test, 'r') # Perfect predictions line
axes[1].set(xlabel='Test True Y', ylabel='Model Predictions',
↳ title='Predictions vs Actual')

sns.despine()
plt.tight_layout()
plt.show()
```



```
[169]: # Get features of new part type
single_partType = df.drop('Lifespan', axis=1).iloc[0]
print(f'Features of new part type:\n{single_partType}')

# Convert to DataFrame with feature names
single_partType_df = pd.DataFrame([single_partType.values],
↳ columns=single_partType.index)

# Scale the features while preserving feature names
single_partType_scaled = scaler.transform(single_partType_df)

# Run the model and get the lifespan prediction
print('\nPrediction Lifespan:', model.predict(single_partType_scaled)[0,0])

# Print original lifespan
```

```
print('\nOriginal Lifespan:', df.iloc[0]['Lifespan'])
```

Features of new part type:

coolingRate	13.00
quenchTime	3.84
forgeTime	6.47
HeatTreatTime	46.87
Nickel%	65.73
Iron%	16.52
Cobalt%	16.82
Chromium%	0.93
smallDefects	10.00
largeDefects	0.00
sliverDefects	0.00
partType_Blade	0.00
partType_Block	0.00
partType_Nozzle	1.00
partType_Valve	0.00
microstructure_colGrain	0.00
microstructure_equiGrain	1.00
microstructure_singleGrain	0.00
seedLocation_Bottom	1.00
seedLocation_Top	0.00
castType_Continuous	0.00
castType_Die	1.00
castType_Investment	0.00

Name: 0, dtype: float64

1/1            0s 7ms/step

Prediction Lifespan: 1426.9193

Original Lifespan: 1469.17

1/1            0s 7ms/step

Prediction Lifespan: 1426.9193

Original Lifespan: 1469.17