

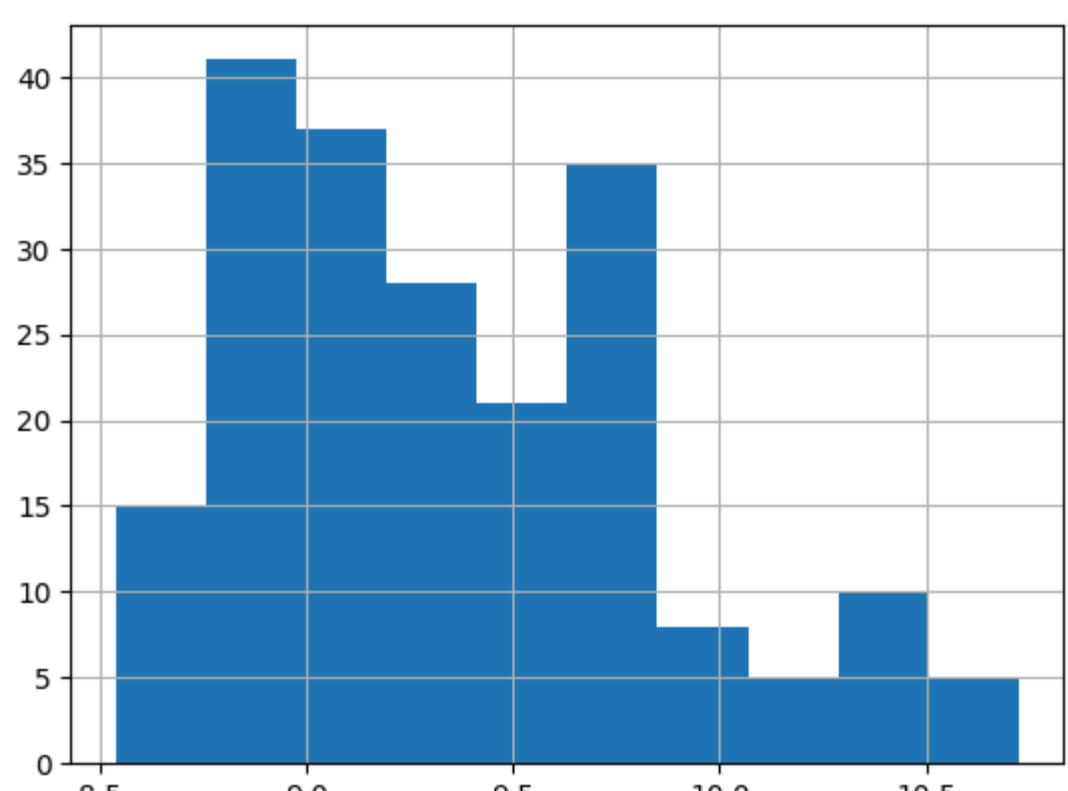
## 14 Random Forest Models in Supervised Learning

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```
In [3]: import pandas as pd
import numpy as np
df = pd.read_csv(
    filepath_or_buffer = "D:\output\cars_prepared.csv",
    engine = 'pyarrow',
)
list_reduced = [
    'symboling',
    'doornumber',
    'wheelbase',
    'carlength',
    'carwidth',
    'carheight',
    'curbweight',
    'cylindernumber',
    'enginesize',
    'boreratio',
    'stroke',
    'compressionratio',
    'horsepower',
    'peakrpm',
    'citympg',
    'highwaympg',
    'CarName_1_low',
    'drivewheel_1_low',
    'engineLocation_3_high',
    'aspiration_3_high',
    'fuelsystem_3_high',
    'engineType_2_moderate',
    'fuelType_2_moderate',
    'carbody_1_low'
]
X = df[list_reduced]
y = df['price']
X_train = df[list_reduced].loc[df['TrainTest'] == 'Train']
y_train = df['price'].loc[df['TrainTest'] == 'Train']
df['price'].hist()

<>4: SyntaxWarning: invalid escape sequence '\o'
<>4: SyntaxWarning: invalid escape sequence '\o'
C:\Users\Nandi\AppData\Local\Temp\ipykernel_9224\2286807562.py:4: SyntaxWarning: invalid escape sequence '\o'
    filepath_or_buffer = "D:\output\cars_prepared.csv",

Out[3]: <Axes: >
```



```
In [4]: list_max_depth = [8,17,35,None]
list_min_samples_leaf = [1,4,30]
min_samples_split = [2,8,60]

from sklearn.ensemble import RandomForestRegressor
list_RandomForestRegressor = [
    RandomForestRegressor(
        max_depth = j,
        min_samples_leaf = k,
        min_samples_split = l,
        oob_score = True,
        random_state = 923
    )
    for j in list_max_depth for k in list_min_samples_leaf for l in min_samples_split
]

In [5]: list_fit = [model.fit(
    X = X_train,
    y = y_train
) for model in list_RandomForestRegressor]

In [6]: list_predict = [fit.predict(X = X) for fit in list_fit]
df_predict = pd.DataFrame(list_predict).T
df_predict.head()
```

	0	1	2	3	4	5	6	7	8	9	...	26	27	28	29	30	31	32	33	34	35
0	9.458635	9.442816	9.366929	9.428075	9.428075	9.366929	9.379228	9.379228	9.379228	9.462568	...	9.379228	9.462568	9.442816	9.366929	9.428075	9.428075	9.366929	9.379228	9.379228	9.379228
1	9.458635	9.442816	9.366929	9.428075	9.428075	9.366929	9.379228	9.379228	9.379228	9.462568	...	9.379228	9.462568	9.442816	9.366929	9.428075	9.428075	9.366929	9.379228	9.379228	9.379228
2	9.769909	9.785934	9.382721	9.776884	9.776884	9.382721	9.379228	9.379228	9.767959	9.785934	9.382721	9.776884	9.776884	9.382721	9.776884	9.776884	9.382721	9.379228	9.379228	9.379228	9.379228
3	9.209384	9.199297	9.359504	9.193575	9.193575	9.359504	9.357774	9.357774	9.357774	9.200069	...	9.357774	9.200069	9.199297	9.359504	9.193575	9.193575	9.359504	9.357774	9.357774	9.357774
4	9.717993	9.742607	9.382721	9.729553	9.729553	9.382721	9.379228	9.379228	9.379228	9.707275	...	9.379228	9.707275	9.742607	9.382721	9.729553	9.729553	9.382721	9.379228	9.379228	9.379228

5 rows × 36 columns

```
In [7]: from sklearn.metrics import mean_squared_error
list_mean_squared_error = [[j,k,mean_squared_error(
    y_true = df['price'].loc[df['TrainTest'] == k],
    y_pred = df_predict.loc[df['TrainTest'] == k,j],
)] for j in range(df_predict.shape[1]) for k in ['Train','Validation','Test']]
df_mean_squared_error = pd.DataFrame(list_mean_squared_error)
df_mean_squared_error.columns = ['model','TrainTest','mean_squared_error']
df_mean_squared_error = df_mean_squared_error.pivot(
    index='model',
    columns='TrainTest',
    values='mean_squared_error'
)
df_mean_squared_error['RandomForestRegressor'] = list_RandomForestRegressor
df_mean_squared_error['oob_score_'] = [fit.oob_score_ for fit in list_fit]
df_mean_squared_error = df_mean_squared_error.sort_values(['Validation','Test','Train'])[['RandomForestRegressor','Test','Validation','Train','oob_score_']]

In [8]: df_mean_squared_error

Out[8]:
```

TrainTest	RandomForestRegressor	Test	Validation	Train	oob_score_
model					
0	(DecisionTreeRegressor(max_depth=8, max_featu...	0.038136	0.020986	0.002514	0.918616
9	(DecisionTreeRegressor(max_depth=17, max_featu...	0.038753	0.021074	0.002546	0.916745
18	(DecisionTreeRegressor(max_depth=35, max_featu...	0.038753	0.021074	0.002546	0.916745
27	(DecisionTreeRegressor(max_features=1.0, rando...	0.038753	0.021074	0.002546	0.916745
10	(DecisionTreeRegressor(max_depth=17, max_featu...	0.039618	0.021209	0.005778	0.919597
19	(DecisionTreeRegressor(max_depth=35, max_featu...	0.039618	0.021209	0.005778	0.919597
28	(DecisionTreeRegressor(max_features=1.0, min_s...	0.039618	0.021209	0.005778	0.919597
1	(DecisionTreeRegressor(max_depth=8, max_featu...	0.039647	0.021217	0.005795	0.919193
3	(DecisionTreeRegressor(max_depth=8, max_featu...	0.041534	0.022548	0.007775	0.912795
4	(DecisionTreeRegressor(max_depth=8, max_featu...	0.041534	0.022548	0.007775	0.912795
12	(DecisionTreeRegressor(max_depth=17, max_featu...	0.041534	0.022548	0.007775	0.912795
13	(DecisionTreeRegressor(max_depth=17, max_featu...	0.041534	0.022548	0.007775	0.912795
21	(DecisionTreeRegressor(max_depth=35, max_featu...	0.041534	0.022548	0.007775	0.912795
22	(DecisionTreeRegressor(max_depth=35, max_featu...	0.041534	0.022548	0.007775	0.912795
30	(DecisionTreeRegressor(max_features=1.0, min_s...	0.041534	0.022548	0.007775	0.912795
31	(DecisionTreeRegressor(max_features=1.0, min_s...	0.041534	0.022548	0.007775	0.912795
2	(DecisionTreeRegressor(max_depth=8, max_featu...	0.308395	0.027519	0.227239	0.001252
5	(DecisionTreeRegressor(max_depth=8, max_featu...	0.308395	0.027519	0.227239	0.001252
11	(DecisionTreeRegressor(max_depth=17, max_featu...	0.308395	0.027519	0.227239	0.001252
14	(DecisionTreeRegressor(max_depth=17, max_featu...	0.308395	0.027519	0.227239	0.001252
20	(DecisionTreeRegressor(max_depth=35, max_featu...	0.308395	0.027519	0.227239	0.001252
23	(DecisionTreeRegressor(max_depth=35, max_featu...	0.308395	0.027519	0.227239	0.001252
29	(DecisionTreeRegressor(max_features=1.0, min_s...	0.308395	0.027519	0.227239	0.001252
32	(DecisionTreeRegressor(max_features=1.0, min_s...	0.308395	0.027519	0.227239	0.001252
6	(DecisionTreeRegressor(max_depth=8, max_featu...	0.309546	0.027601	0.227755	0.001411
7	(DecisionTreeRegressor(max_depth=8, max_featu...	0.309546	0.027601	0.227755	0.001411
8	(DecisionTreeRegressor(max_depth=8, max_featu...	0.309546	0.027601	0.227755	0.001411
15	(DecisionTreeRegressor(max_depth=17, max_featu...	0.309546	0.027601	0.227755	0.001411
16	(DecisionTreeRegressor(max_depth=17, max_featu...	0.309546	0.027601	0.227755	0.001411
17	(DecisionTreeRegressor(max_depth=17, max_featu...	0.309546	0.027601	0.227755	0.001411
24	(DecisionTreeRegressor(max_depth=35, max_featu...	0.309546	0.027601	0.227755	0.001411
25	(DecisionTreeRegressor(max_depth=35, max_featu...	0.309546	0.027601	0.227755	0.001411
26	(DecisionTreeRegressor(max_depth=35, max_featu...	0.309546	0.027601	0.227755	0.001411
33	(DecisionTreeRegressor(max_features=1.0, min_s...	0.309546	0.027601	0.227755	0.001411
34	(DecisionTreeRegressor(max_features=1.0, min_s...	0.309546	0.027601	0.227755	0.001411
35	(DecisionTreeRegressor(max_features=1.0, min_s...	0.309546	0.027601	0.227755	0.001411

```
In [9]: pd.DataFrame({
    'feature_names_in_' : list_RandomForestRegressor[9].feature_names_in_,
    'feature_importances_' : list_RandomForestRegressor[9].feature_importances_
}).sort_values('feature_importances_')

Out[9]:
```

	feature_names_in_	feature_importances_
18	engineLocation_3_high	0.000004
1	doornumber	0.000235
17	drivewheel_1_low	0.000303
19	aspiration_3_high	0.000578
21	engineType_2_moderate	0.000675
23	carbody_1_low	0.000721
0	symboling	0.000940
22	fuelType_2_moderate	0.001274
13	peakrpm	0.002083
20	fuelsystem_3_high	0.002487
5	carheight	0.003156
11	compressionratio	0.003407
10	stroke	0.004153
2	wheelbase	0.005269
9	boreRatio	0.005309
12	horsepower	0.005566
3	carlength	0.013245
16	CarName_1_low	0.015806
4	carwidth	0.019519
7	cylindernumber	0.025111
14	citympg	0.064549
8	enginesize	0.189791
15	highwaympg	0.193264
6	curbweight	0.442558

```
In [10]: dir(list_RandomForestRegressor[9])

Out[10]: ['__abstractmethods__', '__annotations__', '__class__', '__delattr__', '__dict__', '__dir__', '__doc__', '__eq__', '__firstlineno__', '__format__', '__ge__', '__getattr__', '__getattribute__', '__getitem__', '__getstate__', '__gt__', '__hash__', '__init__', '__init_subclass__', '__iter__', '__le__', '__len__', '__lt__', '__module__', '__ne__', '__new__', '__reduce__', '__reduce_ex__', '__repr__', '__setattr__', '__setstate__', '__sizeof__', '__sklearn_clone__', '__str__', '__static_attributes__', '__str__', '__subclasshook__', '__weakref__', '__abc_impl__', '__build_request_for_signature__', '__check_feature_names__', '__check_n_features__', '__compute_oob_predictions__', '__compute_partial_dependence_recursion__', '__doc_link_module__', '__doc_link_template', '__doc_link_url_param_generator__', '__estimator_type__', '__get_default_requests__', '__get_doc_link__', '__get_estimators_indices__', '__get_metadata_request__', '__get_oob_predictions__', '__get_param_names__', '__get_tags__', '__make_estimator__', '__more_tags__', '__n_samples__', '__n_samples_bootstrap', '__parameter_constraints__', '__repr_html__', '__repr_html__', '__repr_html_inner__', '__repr_htmlbundle__', '__required_parameters__', '__set_oob_score_and_attributes__', '__validate_X_predict__', '__validate_data__', '__validate_estimator__', '__validate_params__', '__validate_X_class_weight__', '__apply__', '__bootstrap__', '__cop_alpha__', '__class_weight__', '__criterion__', '__decision_path__', '__estimator__', '__estimator__', '__estimator_params__', '__estimators__', '__estimators_samples__', '__feature_importances_', '__feature_names_in_', '__fit__', '__get_metadata_routing__', '__get_params__', '__max_depth__', '__max_features__', '__max_leaf_nodes__', '__max_samples__', '__min_impurity_decrease__', '__min_samples_leaf__', '__min_samples_split__', '__min_weight_fraction_leaf__', '__monotonic_cst__', '__n_estimators__', '__n_features_in_', '__n_jobs__', '__n_outputs__', '__oob_prediction__', '__oob_score__', '__oob_score__', '__predict__', '__random_state__', '__score__', '__set_fit_request__', '__set_params__', '__set_score_request__', '__verbose__', '__warm_start__']
```

