

```
In [737... # Importing libraries
import pandas as pd
import numpy as np
from matplotlib import pyplot
from sklearn.model_selection import train_test_split
from xgboost import XGBRegressor
import xgboost as xgb
```

```
In [738... # Reading challenge 1 train data
df = pd.read_csv("Challenge1_train_data.csv")
```

```
In [491... df.head(20)
```

```
Out[491...
      date  dc_name  size_code  retail_price  total_tires  zip_code
0  2022-02-05  OAKLAND  1856015      70.090           1    94604
1  2021-03-02  OAKLAND  1856015      59.090           1    94604
2  2020-12-08  OAKLAND  1856015      53.545           1    94604
3  2022-01-17  OAKLAND  1856015      58.410           1    94604
4  2020-11-13  OAKLAND  1856015      43.085           1    94604
5  2020-10-07  OAKLAND  1856015      76.910           1    94604
6  2020-12-14  OAKLAND  1856015      70.455           1    94604
7  2022-02-22  OAKLAND  1856015      84.590           1    94604
8  2022-04-18  OAKLAND  1856015      71.910           1    94604
9  2020-10-20  OAKLAND  1856015      67.455           1    94604
10 2021-08-31  OAKLAND  1856015      84.455           1    94604
11 2022-02-08  OAKLAND  1856015      72.785           1    94604
12 2021-12-16  OAKLAND  1856015      77.710           1    94604
13 2022-02-15  OAKLAND  1856015      95.910           1    94604
14 2022-06-14  OAKLAND  1856015     149.090           1    94604
15 2021-09-30  OAKLAND  1856015      78.410           1    94604
16 2022-01-10  OAKLAND  1856015      14.590           1    94604
17 2021-02-08  OAKLAND  1856015      96.910           1    94604
18 2022-06-09  OAKLAND  1856015      64.545           1    94604
19 2022-06-06  OAKLAND  1856015     103.910           1    94604
```

```
In [492... df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 284700 entries, 0 to 284699
Data columns (total 6 columns):
#   Column          Non-Null Count  Dtype
---  ---
0   date            284700 non-null object
```

```
1  dc_name      284700 non-null  object
2  size_code    284700 non-null  int64
3  retail_price 284666 non-null  float64
4  total_tires  284700 non-null  int64
5  zip_code     284700 non-null  int64
dtypes: float64(1), int64(3), object(2)
memory usage: 13.0+ MB
```

```
In [493...] df.shape
```

```
Out[493...] (284700, 6)
```

```
In [494...] # Data Explorations
# Explore "dc_name" columns
df["dc_name"].value_counts()
```

```
Out[494...] SACRAMENTO      113150
BAKERSFIELD      76650
OAKLAND          59860
SAN JOSE         35040
Name: dc_name, dtype: int64
```

```
In [495...] # Explore "size_code"
df["size_code"].value_counts()
```

```
Out[495...] 2657516      2920
2257516      2920
2257515      2920
2354518      2920
2355018      2920
...
2454017       730
2557517       730
2653522       730
2158516       730
1955515       730
Name: size_code, Length: 157, dtype: int64
```

```
In [496...] # Explore "size_code"
df["zip_code"].unique()
```

```
Out[496...] array([94604, 95131, 95838, 93308], dtype=int64)
```

```
In [654...] # drop zip codes
#df.drop(["zip_code"], axis=1, inplace = True)
```

```
In [739...] # Convert date columns to Year, Month and Day
df.date = pd.to_datetime(df.date)
```

```
In [740...] # The model will not accept datetime, hence create a feature for each date part
df["Year"] = df["date"].dt.year
df["Month"] = df["date"].dt.month
df["Day"] = df["date"].dt.day
df["Day_of_week"] = df['date'].dt.day_name()
```

```
In [499...] df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 284700 entries, 0 to 284699
Data columns (total 10 columns):
```

```

#   Column      Non-Null Count  Dtype
---  -
0   date        284700 non-null  datetime64[ns]
1   dc_name      284700 non-null  object
2   size_code    284700 non-null  int64
3   retail_price 284666 non-null  float64
4   total_tires  284700 non-null  int64
5   zip_code     284700 non-null  int64
6   Year         284700 non-null  int64
7   Month        284700 non-null  int64
8   Day          284700 non-null  int64
9   Day_of_week  284700 non-null  object
dtypes: datetime64[ns](1), float64(1), int64(6), object(2)
memory usage: 21.7+ MB

```

```
In [500]: from pandas.tseries.holiday import USFederalHolidayCalendar
```

```
In [741]: cal = USFederalHolidayCalendar()
holidays = cal.holidays(start=df['date'].min(),
                        end=df['date'].max()).to_pydatetime()
df['holiday'] = df['date'].isin(holidays)
```

```
In [502]: df
```

```
Out[502]:
```

	date	dc_name	size_code	retail_price	total_tires	zip_code	Year	Month	Day	Day_of_w
0	2022-02-05	OAKLAND	1856015	70.090	1	94604	2022	2	5	Satur
1	2021-03-02	OAKLAND	1856015	59.090	1	94604	2021	3	2	Tuesd
2	2020-12-08	OAKLAND	1856015	53.545	1	94604	2020	12	8	Tuesd
3	2022-01-17	OAKLAND	1856015	58.410	1	94604	2022	1	17	Monc
4	2020-11-13	OAKLAND	1856015	43.085	1	94604	2020	11	13	Fric
...
284695	2022-07-24	BAKERSFIELD	3512520	0.000	0	93308	2022	7	24	Sunc
284696	2020-11-22	BAKERSFIELD	3512520	0.000	0	93308	2020	11	22	Sunc
284697	2021-08-08	BAKERSFIELD	3512520	0.000	0	93308	2021	8	8	Sunc
284698	2022-02-14	BAKERSFIELD	3512520	0.000	0	93308	2022	2	14	Monc
284699	2020-11-15	BAKERSFIELD	3512520	0.000	0	93308	2020	11	15	Sunc

284700 rows × 11 columns

```
In [33]: # df[['year', 'month', 'day']] = df.date.apply(lambda x: pd.Series(x.strftime("%Y,%m,%d"))
```

In [503... `df.head()`

Out[503...

	date	dc_name	size_code	retail_price	total_tires	zip_code	Year	Month	Day	Day_of_week	holi
0	2022-02-05	OAKLAND	1856015	70.090	1	94604	2022	2	5	Saturday	F
1	2021-03-02	OAKLAND	1856015	59.090	1	94604	2021	3	2	Tuesday	F
2	2020-12-08	OAKLAND	1856015	53.545	1	94604	2020	12	8	Tuesday	F
3	2022-01-17	OAKLAND	1856015	58.410	1	94604	2022	1	17	Monday	1
4	2020-11-13	OAKLAND	1856015	43.085	1	94604	2020	11	13	Friday	F

In [742... `df["season"] = df["Month"]%12 // 3 + 1`

In [505... `df.head()`

Out[505...

	date	dc_name	size_code	retail_price	total_tires	zip_code	Year	Month	Day	Day_of_week	holi
0	2022-02-05	OAKLAND	1856015	70.090	1	94604	2022	2	5	Saturday	F
1	2021-03-02	OAKLAND	1856015	59.090	1	94604	2021	3	2	Tuesday	F
2	2020-12-08	OAKLAND	1856015	53.545	1	94604	2020	12	8	Tuesday	F
3	2022-01-17	OAKLAND	1856015	58.410	1	94604	2022	1	17	Monday	1
4	2020-11-13	OAKLAND	1856015	43.085	1	94604	2020	11	13	Friday	F

In [660... `#df["season"] = df["season"].astype(str)`

In [661... `#cols_to_transform = ["season", "Day_of_week", "holiday", "dc_name"]`

In [662... `#df = pd.get_dummies(df, columns = cols_to_transform)`

In [663... `df.info()`

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 284700 entries, 0 to 284699
Data columns (total 24 columns):
#   Column                Non-Null Count  Dtype
---  -
0   date                  284700 non-null  datetime64[ns]
1   size_code             284700 non-null  int64
2   retail_price          284666 non-null  float64
```

```

3   total_tires      284700 non-null  int64
4   Year             284700 non-null  int64
5   Month            284700 non-null  int64
6   Day              284700 non-null  int64
7   season_1         284700 non-null  uint8
8   season_2         284700 non-null  uint8
9   season_3         284700 non-null  uint8
10  season_4         284700 non-null  uint8
11  Day_of_week_Friday 284700 non-null  uint8
12  Day_of_week_Monday 284700 non-null  uint8
13  Day_of_week_Saturday 284700 non-null  uint8
14  Day_of_week_Sunday 284700 non-null  uint8
15  Day_of_week_Thursday 284700 non-null  uint8
16  Day_of_week_Tuesday 284700 non-null  uint8
17  Day_of_week_Wednesday 284700 non-null  uint8
18  holiday_False    284700 non-null  uint8
19  holiday_True     284700 non-null  uint8
20  dc_name_BAKERSFIELD 284700 non-null  uint8
21  dc_name_OAKLAND   284700 non-null  uint8
22  dc_name_SACRAMENTO 284700 non-null  uint8
23  dc_name_SAN JOSE  284700 non-null  uint8
dtypes: datetime64[ns](1), float64(1), int64(5), uint8(17)
memory usage: 19.8 MB

```

```
In [664... #df = df.reindex(columns = [col for col in df.columns if col != 'total_tires'] + ['total_tires'])
```

```
In [743... # change object data type to category
# Represent dc_name as numbers to avoid text values
df["dc_name_cat"] = pd.Categorical(df["dc_name"])
df["dc_name_num"] = df["dc_name_cat"].cat.codes
```

```
In [744... df["Day_of_week_cat"] = pd.Categorical(df["Day_of_week"])
df["Day_of_week_num"] = df["Day_of_week_cat"].cat.codes
```

```
In [745... df["holiday_cat"] = pd.Categorical(df["holiday"])
df["holiday_num"] = df["holiday_cat"].cat.codes
```

```
In [691... df.info()
```

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 284700 entries, 0 to 284699
Data columns (total 18 columns):
#   Column              Non-Null Count  Dtype
---  -
0   date                284700 non-null  datetime64[ns]
1   dc_name             284700 non-null  object
2   size_code           284700 non-null  int64
3   retail_price        284666 non-null  float64
4   total_tires         284700 non-null  int64
5   zip_code            284700 non-null  int64
6   Year                284700 non-null  int64
7   Month              284700 non-null  int64
8   Day                284700 non-null  int64
9   Day_of_week         284700 non-null  object
10  holiday             284700 non-null  bool
11  season              284700 non-null  int64
12  dc_name_cat         284700 non-null  category
13  dc_name_num         284700 non-null  int8
14  Day_of_week_cat     284700 non-null  category
15  Day_of_week_num     284700 non-null  int8
16  holiday_cat         284700 non-null  category
17  holiday_num         284700 non-null  int8

```

dtypes: bool(1), category(3), datetime64[ns](1), float64(1), int64(7), int8(3), object(2)

memory usage: 25.8+ MB

```
In [511... # saving the dataframe
df.to_csv('clean_data.csv')
```

```
In [50]: import xgboost as xgb
```

```
In [41]: from xgboost import XGBRegressor
```

```
In [196... # define model

model = XGBRegressor()
```

```
In [692... df.columns
```

```
Out[692... Index(['date', 'dc_name', 'size_code', 'retail_price', 'total_tires',
        'zip_code', 'Year', 'Month', 'Day', 'Day_of_week', 'holiday', 'season',
        'dc_name_cat', 'dc_name_num', 'Day_of_week_cat', 'Day_of_week_num',
        'holiday_cat', 'holiday_num'],
        dtype='object')
```

```
In [746... train_split = 0.9
# Set the date at which to split train and eval data
# Of the unique dates available, pick the split between train and eval dates
dates_avail = df["date"].unique()
split_date_index = int(dates_avail.shape[0] * train_split)
split_date = dates_avail[split_date_index]
# Train data is on or before the split date
train_df = df.query("date > @split_date")
# And eval data is after
eval_df = df.query("date <= @split_date")

features = ['dc_name_num', 'size_code', 'retail_price',
            'Year', 'Month', 'Day', 'season',
            'Day_of_week_num',
            'holiday_num']
label = ["total_tires"]
x_train = train_df[features]
y_train = train_df[label]
x_eval = eval_df[features]
y_eval = eval_df[label]
```

```
In [707... x_train.head()
```

```
Out[707...
```

	dc_name_num	size_code	retail_price	Year	Month	Day	season	Day_of_week_num	holiday_num
0	1	1856015	70.090	2022	2	5	1	2	0
1	1	1856015	59.090	2021	3	2	2	5	0
2	1	1856015	53.545	2020	12	8	1	5	0
3	1	1856015	58.410	2022	1	17	1	1	1
4	1	1856015	43.085	2020	11	13	4	0	0

```
In [708... x_train.shape
```

Out[708... (281580, 9)

In [709... `x_eval.shape`

Out[709... (3120, 9)

```
In [747... # Build a model
model = xgb.XGBRegressor(
    n_estimators = 2000,
    max_depth = 25,
    min_child_weight = 10,
    learning_rate = 0.1
)
```

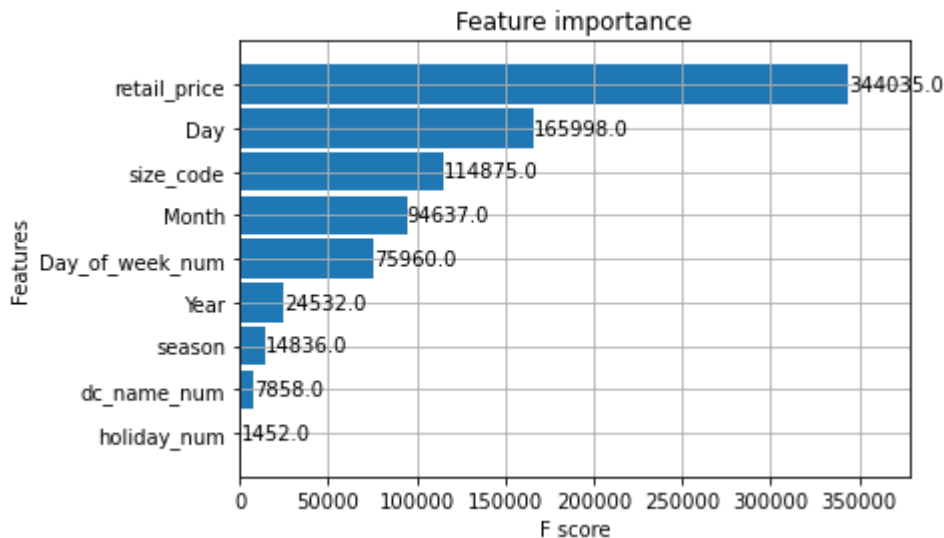
```
In [748... # fit the model
model.fit(
    x_train,
    y_train,
    eval_set = [(x_train, y_train), (x_eval, y_eval)],
    early_stopping_rounds = 20,
    verbose = False
)
```

Out[748... XGBRegressor(base_score=0.5, booster='gbtree', colsample_bylevel=1, colsample_bynode=1, colsample_bytree=1, enable_categorical=False, gamma=0, gpu_id=-1, importance_type=None, interaction_constraints='', learning_rate=0.1, max_delta_step=0, max_depth=25, min_child_weight=10, missing=nan, monotone_constraints='()', n_estimators=2000, n_jobs=4, num_parallel_tree=1, predictor='auto', random_state=0, reg_alpha=0, reg_lambda=1, scale_pos_weight=1, subsample=1, tree_method='exact', validate_parameters=1, verbosity=None)

In []:

```
In [749... # Check feature importance
xgb.plot_importance(model, height=0.9)
```

Out[749... <AxesSubplot:title={'center':'Feature importance'}, xlabel='F score', ylabel='Features'>



Model Evaluation

```
In [750... # Create a final dataframe to verify the predictions
df_pred = x_eval.copy()
# Recreate a column for the complete date
date_columns = ["Year", "Month", "Day"]
df_pred["Date"] = pd.to_datetime(df_pred[date_columns])
df_pred.drop(date_columns, inplace=True, axis=1)
```

```
In [519... x_eval.head()
```

```
Out[519...      Year  Month  Day  dc_name_num  Day_of_week_num  holiday_num  season  size_code  retail_price
112  2020     9   24             1             4             0       4   1856015       71.410
208  2020     9   23             1             6             0       4   1856015       45.090
292  2020     9   22             1             5             0       4   1856015       57.910
307  2020     9   25             1             0             0       4   1856015       67.455
384  2020     9   26             1             2             0       4   1856015       77.580
```

```
In [520... df_pred.head()
```

```
Out[520...      dc_name_num  Day_of_week_num  holiday_num  season  size_code  retail_price      Date
112             1             4             0       4   1856015       71.410  2020-09-24
208             1             6             0       4   1856015       45.090  2020-09-23
292             1             5             0       4   1856015       57.910  2020-09-22
307             1             0             0       4   1856015       67.455  2020-09-25
384             1             2             0       4   1856015       77.580  2020-09-26
```

```
In [751... # Predict data for the eval dataset and save the predicted total_tires as a new column
df_pred["total_tires_Pred"] = model.predict(x_eval)
```

```
In [752... df_pred["total_tires_Pred"] = round(df_pred["total_tires_Pred"])
```

```
In [753... x_train["total_tires_Pred"] = model.predict(x_train)
```

<ipython-input-753-088a14b4799e>:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

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

```
x_train["total_tires_Pred"] = model.predict(x_train)
```

```
In [482... x_train.head()
```

```
Out[482...      Year  Month  Day  dc_name_num  Day_of_week_num  holiday_num  season  size_code  retail_price  1
0  2022     2     5             1             2             0       1   1856015       70.090
```


	Year	Month	Day	dc_name_num	Day_of_week_num	holiday_num	season	size_code	retail_price	1
1	2021	3	2	1	5	0	2	1856015	59.090	
2	2020	12	8	1	5	0	1	1856015	53.545	
3	2022	1	17	1	1	1	1	1856015	58.410	
4	2020	11	13	1	0	0	4	1856015	43.085	



In [645... `y_train.head()`

Out[645... `0 1`
`1 1`
`2 1`
`3 1`
`4 1`
Name: total_tires, dtype: int64

In [646... `y_train.shape`

Out[646... `(281580,)`

In [325... `df_pred.head()`

	dc_name_num	Day_of_week_num	holiday_num	season	size_code	retail_price	Date	total_tires_P
112	1	4	0	4	1856015	71.410	2020-09-24	2.514
208	1	6	0	4	1856015	45.090	2020-09-23	4.766
292	1	5	0	4	1856015	57.910	2020-09-22	-1.098
307	1	0	0	4	1856015	67.455	2020-09-25	-0.893
384	1	2	0	4	1856015	77.580	2020-09-26	5.675



```
# Add the true Adj Close into the dataset
# Indexes were not reset, so we can join on the index (the indexes are reset during the
df_pred = df_pred.merge(
    y_eval,
    how = "inner",
    left_index = True,
    right_index = True
)
```

In [596... `df_pred.head()`

	dc_name_num	Day_of_week_num	holiday_num	season	size_code	retail_price	Date	total_tires_P
112	1	4	0	4	1856015	71.410	2020-09-24	

	dc_name_num	Day_of_week_num	holiday_num	season	size_code	retail_price	Date	total_tires_P
208	1	6	0	4	1856015	45.090	2020-09-23	
292	1	5	0	4	1856015	57.910	2020-09-22	
307	1	0	0	4	1856015	67.455	2020-09-25	
384	1	2	0	4	1856015	77.580	2020-09-26	

```
In [755... # Calculate wape
def simple_wape(y_true, y_pred):
    """Calculates simple wape"""
    y_true = np.array(y_true)
    y_pred = np.array(y_pred)
    return np.round(
        abs(y_true - y_pred).sum() / abs(y_true).sum()
        if abs(y_true).sum() != 0
        else np.inf,
        5,
    )
```

```
In [756... simple_wape(df_pred["total_tires"],df_pred["total_tires_Pred"])
```

```
Out[756... 0.32364
```

```
In [757... simple_wape(y_train["total_tires"],x_train["total_tires_Pred"])
```

```
Out[757... 0.15495
```

Hyperparameters tuning

```
In [96]: #! pip install hyperopt
```

```
Collecting hyperopt
[notice] A new release of pip available: 22.2.2 -> 22.3.1
[notice] To update, run: python.exe -m pip install --upgrade pip
  Downloading hyperopt-0.2.7-py2.py3-none-any.whl (1.6 MB)
----- 1.6/1.6 MB 4.4 MB/s eta 0:00:00
Requirement already satisfied: networkx>=2.2 in c:\users\shobh\anaconda3\lib\site-packages (from hyperopt) (2.5)
Collecting py4j
  Downloading py4j-0.10.9.7-py2.py3-none-any.whl (200 kB)
----- 200.5/200.5 kB 4.0 MB/s eta 0:00:00
Requirement already satisfied: numpy in c:\users\shobh\anaconda3\lib\site-packages (from hyperopt) (1.22.3)
Requirement already satisfied: future in c:\users\shobh\anaconda3\lib\site-packages (from hyperopt) (0.18.2)
Requirement already satisfied: scipy in c:\users\shobh\anaconda3\lib\site-packages (from hyperopt) (1.5.2)
Requirement already satisfied: six in c:\users\shobh\anaconda3\lib\site-packages (from hyperopt) (1.15.0)
Requirement already satisfied: cloudpickle in c:\users\shobh\anaconda3\lib\site-packages
```

(from hyperopt) (1.6.0)
Requirement already satisfied: tqdm in c:\users\shobh\anaconda3\lib\site-packages (from hyperopt) (4.50.2)
Requirement already satisfied: decorator>=4.3.0 in c:\users\shobh\anaconda3\lib\site-packages (from networkx>=2.2->hyperopt) (4.4.2)
Installing collected packages: py4j, hyperopt
Successfully installed hyperopt-0.2.7 py4j-0.10.9.7

```
In [97]: # import packages for hyperparameters tuning
        from hyperopt import STATUS_OK, Trials, fmin, hp, tpe
```

```
In [99]: space={ 'max_depth': hp.quniform("max_depth", 3, 18, 1),
                'gamma': hp.uniform('gamma', 1,9),
                'reg_alpha' : hp.quniform('reg_alpha', 40,180,1),
                'reg_lambda' : hp.uniform('reg_lambda', 0,1),
                'colsample_bytree' : hp.uniform('colsample_bytree', 0.5,1),
                'min_child_weight' : hp.quniform('min_child_weight', 0, 10, 1),
                'n_estimators': 180,
                'seed': 0
            }
```

```
In [107... def objective(space):
            fc_model=xgb.XGBRegressor(
                        n_estimators =space['n_estimators'], max_depth = int(space['max_dep
                        reg_alpha = int(space['reg_alpha']),min_child_weight=int(space['min
                        colsample_bytree=int(space['colsample_bytree']))

            evaluation = [(x_train, y_train), (x_eval, y_eval)]

            fc_model.fit(x_train, y_train,
                        eval_set=evaluation, eval_metric='auc',
                        early_stopping_rounds=10,verbose=False)

            pred = fc_model.predict(x_eval)

            accuracy = simple_wape(y_eval, pred)
            print ("SCORE:", accuracy)
            return {'loss': -accuracy, 'status': STATUS_OK }
```

```
In [123... from sklearn.pipeline import Pipeline
            pipe = Pipeline(steps=[
                        ("model", xgb.XGBRegressor(objective= 'reg:squarederror',
                        learning_rate = 0.1,
                        n_estimators =400,
                        max_depth = 3,
                        seed = 0))])
```

```
In [449... from sklearn.model_selection import RandomizedSearchCV
            hyperparameter_grid = {
                'model__n_estimators': [100, 400, 800],
                'model__max_depth': [3, 6, 9],
                'model__learning_rate': [0.05, 0.1, 0.20],
            }

            pipeline = RandomizedSearchCV(
                Pipeline(steps=[
                    ("model", xgb.XGBRegressor(objective= 'reg:squarederror',seed = 0))
                ]),
```

```
param_distributions=hyperparameter_grid,
n_iter=20,
scoring='r2',
n_jobs=-1,
cv=3,
verbose=3)
```

```
In [ ]: # submission
```

```
In [338... df_forecast = df[df.date.between("2022-09-19", "2022-09-26")]
```

```
In [339... df_forecast.head()
```

```
Out[339... 
```

	date	dc_name	size_code	retail_price	total_tires	zip_code	Year	Month	Day	Day_of_week
68	2022-09-19	OAKLAND	1856015	50.545	2	94604	2022	9	19	Monday
1058	2022-09-19	OAKLAND	1856515	95.340	16	94604	2022	9	19	Monday
1585	2022-09-19	OAKLAND	1956015	74.740	15	94604	2022	9	19	Monday
1914	2022-09-19	OAKLAND	1956515	68.650	16	94604	2022	9	19	Monday
2536	2022-09-19	OAKLAND	2055017	86.455	4	94604	2022	9	19	Monday

```
In [345... df.head()
```

```
Out[345... 
```

	date	dc_name	size_code	retail_price	total_tires	zip_code	Year	Month	Day	Day_of_week	holi
0	2022-02-05	OAKLAND	1856015	70.090	1	94604	2022	2	5	Saturday	F
1	2021-03-02	OAKLAND	1856015	59.090	1	94604	2021	3	2	Tuesday	F
2	2020-12-08	OAKLAND	1856015	53.545	1	94604	2020	12	8	Tuesday	F
3	2022-01-17	OAKLAND	1856015	58.410	1	94604	2022	1	17	Monday	1
4	2020-11-13	OAKLAND	1856015	43.085	1	94604	2020	11	13	Friday	F

```
In [375... df[(df["dc_name"]=="OAKLAND")]["size_code"].unique()
```

```
Out[375... 82
```

```
In [362... df1 = pd.DataFrame({'size_code':[1856015, 1856515, 1956015, 1956515, 2055017, 2055516,
2056515, 2056516, 2057015, 2057016, 2057514, 2057515, 2154517,
2155017, 2155516, 2155517, 2155518, 2156016, 2156017, 2156516,
2156517, 2157015, 2157016, 2254018, 2254517, 2254518, 2255017,
```

```
2255018, 2255517, 2255518, 2255519, 2256016, 2256017, 2256018,
2256516, 2256517, 2257515, 2257516, 2354019, 2354518, 2355017,
2355018, 2355517, 2355518, 2355519, 2355520, 2356017, 2356018,
2356516, 2356517, 2356518, 2357016, 2357515, 2358016, 2358516,
2454019, 2454518, 2454519, 2454520, 2455020, 2456018, 2456517,
2457017, 2457516, 2457517, 2555020, 2555520, 2556019, 2556518,
2655020, 2656018, 2656518, 2657016, 2657017, 2657516, 2755520,
2756020, 2756518, 2757018, 2854522, 2857017]]})
```

```
In [363... df1["dc_name"]="OAKLAND"
```

```
In [364... df1.head()
```

```
Out[364...
   size_code  dc_name
0    1856015  OAKLAND
1    1856515  OAKLAND
2    1956015  OAKLAND
3    1956515  OAKLAND
4    2055017  OAKLAND
```

```
In [367... df2 = pd.DataFrame({'date':['2022-09-20','2022-09-21','2022-09-22','2022-09-23','2022-0
```

```
In [369...
# Now to perform cross join, we will create
# a key column in both the DataFrames to
# merge on that key.
df1['key'] = 1
df2['key'] = 1

# to obtain the cross join we will merge on
# the key and drop it.
df3 = pd.merge(df1, df2, on='key').drop("key", 1)
```

```
In [371... df3.head(10)
```

```
Out[371...
   size_code  dc_name  date
0    1856015  OAKLAND 2022-09-20
1    1856015  OAKLAND 2022-09-21
2    1856015  OAKLAND 2022-09-22
3    1856015  OAKLAND 2022-09-23
4    1856015  OAKLAND 2022-09-24
5    1856015  OAKLAND 2022-09-25
6    1856015  OAKLAND 2022-09-26
7    1856515  OAKLAND 2022-09-20
8    1856515  OAKLAND 2022-09-21
9    1856515  OAKLAND 2022-09-22
```

```
In [374... df3.shape
```

```
Out[374... (574, 3)
```

```
In [379... # Location 'SACRAMENTO'  
df[(df["dc_name"]=="SACRAMENTO")]["size_code"].unique()
```

```
Out[379... array([ 11225, 1756514, 1756515, 1757014, 1855515, 1855516,  
1856015, 1856514, 1856515, 1857014, 1955515, 1955516,  
1956015, 1956515, 1957014, 2054517, 2055016, 2055017,  
2055516, 2055517, 2056015, 2056016, 2056515, 2056516,  
2057015, 2057016, 2057514, 2057515, 2154018, 2154517,  
2154518, 2155017, 2155516, 2155517, 2155518, 2156016,  
2156017, 2156516, 2156517, 2157015, 2157016, 2157515,  
2158516, 2254018, 2254019, 2254517, 2254518, 2254519,  
2255017, 2255018, 2255516, 2255517, 2255518, 2255519,  
2256016, 2256017, 2256018, 2256516, 2256517, 2257015,  
2257016, 2257515, 2257516, 2353519, 2354018, 2354019,  
2354517, 2354518, 2354519, 2355017, 2355018, 2355019,  
2355517, 2355518, 2355519, 2355520, 2356016, 2356017,  
2356018, 2356516, 2356517, 2356518, 2357016, 2357515,  
2358016, 2358017, 2358516, 2453519, 2453520, 2454017,  
2454018, 2454019, 2454020, 2454517, 2454518, 2454519,  
2454520, 2455018, 2455020, 2455519, 2456018, 2456517,  
2457016, 2457017, 2457516, 2457517, 2553518, 2553519,  
2553520, 2554018, 2554019, 2554020, 2554519, 2554520,  
2555019, 2555020, 2555518, 2555520, 2556517, 2556518,  
2557016, 2557018, 2653518, 2653519, 2653522, 2654520,  
2655020, 2656018, 2656517, 2656518, 2657016, 2657017,  
2657018, 2657516, 2753020, 2753519, 2753520, 2754019,  
2754020, 2754520, 2755520, 2756020, 2756518, 2756520,  
2757018, 2854522, 2857017, 2857516, 3054022, 3110515,  
3153520, 3512517, 3512518, 3512520, 22570195], dtype=int64)
```

```
In [380... df4 = pd.DataFrame({'size_code':[ 11225, 1756514, 1756515, 1757014, 1855515, 18  
1856015, 1856514, 1856515, 1857014, 1955515, 1955516,  
1956015, 1956515, 1957014, 2054517, 2055016, 2055017,  
2055516, 2055517, 2056015, 2056016, 2056515, 2056516,  
2057015, 2057016, 2057514, 2057515, 2154018, 2154517,  
2154518, 2155017, 2155516, 2155517, 2155518, 2156016,  
2156017, 2156516, 2156517, 2157015, 2157016, 2157515,  
2158516, 2254018, 2254019, 2254517, 2254518, 2254519,  
2255017, 2255018, 2255516, 2255517, 2255518, 2255519,  
2256016, 2256017, 2256018, 2256516, 2256517, 2257015,  
2257016, 2257515, 2257516, 2353519, 2354018, 2354019,  
2354517, 2354518, 2354519, 2355017, 2355018, 2355019,  
2355517, 2355518, 2355519, 2355520, 2356016, 2356017,  
2356018, 2356516, 2356517, 2356518, 2357016, 2357515,  
2358016, 2358017, 2358516, 2453519, 2453520, 2454017,  
2454018, 2454019, 2454020, 2454517, 2454518, 2454519,  
2454520, 2455018, 2455020, 2455519, 2456018, 2456517,  
2457016, 2457017, 2457516, 2457517, 2553518, 2553519,  
2553520, 2554018, 2554019, 2554020, 2554519, 2554520,  
2555019, 2555020, 2555518, 2555520, 2556517, 2556518,  
2557016, 2557018, 2653518, 2653519, 2653522, 2654520,  
2655020, 2656018, 2656517, 2656518, 2657016, 2657017,  
2657018, 2657516, 2753020, 2753519, 2753520, 2754019,  
2754020, 2754520, 2755520, 2756020, 2756518, 2756520,  
2757018, 2854522, 2857017, 2857516, 3054022, 3110515,  
3153520, 3512517, 3512518, 3512520, 22570195]})
```

```
In [382... df4["dc_name"]="SACRAMENTO"
```

```
In [383... # Now to perform cross join, we will create
df4['key'] = 1
df2['key'] = 1

# to obtain the cross join we will merge on
# the key and drop it.
df5 = pd.merge(df4, df2, on='key').drop("key", 1)
```

```
In [384... df5.head()
```

```
Out[384...      size_code  dc_name  date
0      11225  SACRAMENTO  2022-09-20
1      11225  SACRAMENTO  2022-09-21
2      11225  SACRAMENTO  2022-09-22
3      11225  SACRAMENTO  2022-09-23
4      11225  SACRAMENTO  2022-09-24
```

```
In [385... df5.shape
```

```
Out[385... (1085, 3)
```

```
In [390... #Location Bakersfield
df[(df["dc_name"]=="BAKERSFIELD)][["size_code"].unique()
```

```
Out[390... array([1856015, 1856514, 1856515, 1956015, 1956515, 2055016, 2055017,
        2055516, 2056016, 2056515, 2056516, 2057015, 2057016, 2057514,
        2057515, 2154517, 2155017, 2155516, 2155517, 2155518, 2156016,
        2156017, 2156516, 2156517, 2157015, 2157016, 2254018, 2254517,
        2254518, 2255017, 2255018, 2255517, 2255518, 2255519, 2256016,
        2256017, 2256018, 2256516, 2256517, 2257016, 2257515, 2257516,
        2354018, 2354019, 2354517, 2354518, 2354519, 2355017, 2355018,
        2355019, 2355517, 2355518, 2355519, 2355520, 2356016, 2356017,
        2356018, 2356516, 2356517, 2356518, 2357016, 2357515, 2358016,
        2358017, 2358516, 2454018, 2454019, 2454020, 2454517, 2454518,
        2454519, 2454520, 2455020, 2455519, 2456018, 2456517, 2457016,
        2457017, 2457516, 2457517, 2554519, 2554520, 2555020, 2555520,
        2556019, 2556517, 2556518, 2557517, 2655020, 2656018, 2656518,
        2657016, 2657017, 2657018, 2657516, 2754020, 2755520, 2756020,
        2756518, 2756520, 2757018, 2854522, 2857017, 2857516, 3512520],
      dtype=int64)
```

```
In [391... df6 = pd.DataFrame({'size_code':[1856015, 1856514, 1856515, 1956015, 1956515, 2055016,
        2055516, 2056016, 2056515, 2056516, 2057015, 2057016, 2057514,
        2057515, 2154517, 2155017, 2155516, 2155517, 2155518, 2156016,
        2156017, 2156516, 2156517, 2157015, 2157016, 2254018, 2254517,
        2254518, 2255017, 2255018, 2255517, 2255518, 2255519, 2256016,
        2256017, 2256018, 2256516, 2256517, 2257016, 2257515, 2257516,
        2354018, 2354019, 2354517, 2354518, 2354519, 2355017, 2355018,
        2355019, 2355517, 2355518, 2355519, 2355520, 2356016, 2356017,
        2356018, 2356516, 2356517, 2356518, 2357016, 2357515, 2358016,
        2358017, 2358516, 2454018, 2454019, 2454020, 2454517, 2454518,
        2454519, 2454520, 2455020, 2455519, 2456018, 2456517, 2457016,
        2457017, 2457516, 2457517, 2554519, 2554520, 2555020, 2555520,
```

```
2556019, 2556517, 2556518, 2557517, 2655020, 2656018, 2656518,
2657016, 2657017, 2657018, 2657516, 2754020, 2755520, 2756020,
2756518, 2756520, 2757018, 2854522, 2857017, 2857516, 3512520]]})
```

```
In [392...] df6["dc_name"]="BAKERSFIELD"
```

```
In [393...] # Now to perform cross join, we will create
df6['key'] = 1
df2['key'] = 1

# to obtain the cross join we will merge on
# the key and drop it.
df7 = pd.merge(df6, df2, on = 'key').drop("key", 1)
```

```
In [394...] df7.head()
```

```
Out[394...]
   size_code  dc_name  date
0    1856015  BAKERSFIELD  2022-09-20
1    1856015  BAKERSFIELD  2022-09-21
2    1856015  BAKERSFIELD  2022-09-22
3    1856015  BAKERSFIELD  2022-09-23
4    1856015  BAKERSFIELD  2022-09-24
```

```
In [395...] df7.shape
```

```
Out[395...] (735, 3)
```

```
In [396...] df["dc_name"].unique()
```

```
Out[396...] array(['OAKLAND', 'SAN JOSE', 'SACRAMENTO', 'BAKERSFIELD'], dtype=object)
```

```
In [401...] # Location 'SAN JOSE'
df[(df["dc_name"]=="SAN JOSE")]["size_code"].unique()
```

```
Out[401...] 48
```

```
In [398...] df8 = pd.DataFrame({'size_code':[ 11225, 1956515, 2055516, 2056016, 2056516, 20
2057515, 2154517, 2155516, 2155517, 2156016, 2254018,
2254517, 2254518, 2255017, 2255517, 2256017, 2256517,
2257515, 2257516, 2354518, 2355018, 2356018, 2356517,
2356518, 2358016, 2358017, 2358516, 2454518, 2454520,
2456018, 2457017, 2457516, 2457517, 2555020, 2656018,
2657016, 2657017, 2657516, 2755520, 2756020, 2756518,
2756520, 2757018, 2854522, 2857017, 3512520, 22570195]]})
```

```
In [399...] df8["dc_name"]="SAN JOSE"
```

```
In [400...] # Now to perform cross join, we will create
df8['key'] = 1
df2['key'] = 1

# to obtain the cross join we will merge on
```



```
# the key and drop it.
df9 = pd.merge(df8, df2, on = 'key').drop("key", 1)
```

```
In [402...] df9.head()
```

```
Out[402...]
   size_code  dc_name  date
0    11225  SAN JOSE  2022-09-20
1    11225  SAN JOSE  2022-09-21
2    11225  SAN JOSE  2022-09-22
3    11225  SAN JOSE  2022-09-23
4    11225  SAN JOSE  2022-09-24
```

```
In [403...] df9.shape
```

```
Out[403...] (336, 3)
```

```
In [404...] df_test = pd.concat([df3,df5,df7,df9])
```

```
In [405...] df_test.head()
```

```
Out[405...]
   size_code  dc_name  date
0    1856015  OAKLAND  2022-09-20
1    1856015  OAKLAND  2022-09-21
2    1856015  OAKLAND  2022-09-22
3    1856015  OAKLAND  2022-09-23
4    1856015  OAKLAND  2022-09-24
```

```
In [406...] df_test.shape
```

```
Out[406...] (2730, 3)
```

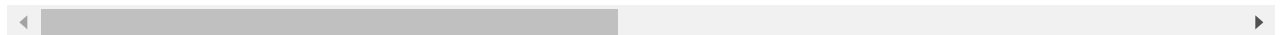
```
In [407...] # Convert date columns to Year, Month and Day
df_test.date = pd.to_datetime(df_test.date)
```

```
In [354...] df_groupby.head()
```

```
Out[354...]
   date      dc_name  size_code  retail_price  total_tires  zip_code  Year  Month  Day  Day_of_w
0  2022-02-05  OAKLAND  1856015      70.090           1    94604  2022     2     5  Saturd
1  2021-03-02  OAKLAND  1856015      59.090           1    94604  2021     3     2  Tuesd
2  2020-12-08  OAKLAND  1856015      53.545           1    94604  2020    12     8  Tuesd
3  2022-01-17  OAKLAND  1856015      58.410           1    94604  2022     1    17  Mon
```

	date	dc_name	size_code	retail_price	total_tires	zip_code	Year	Month	Day	Day_of_w
4	2020-11-13	OAKLAND	1856015	43.085	1	94604	2020	11	13	Fri
...
236130	2022-02-18	BAKERSFIELD	3512520	426.090	1	93308	2022	2	18	Fri
236131	2021-08-06	BAKERSFIELD	3512520	312.590	1	93308	2021	8	6	Fri
236132	2022-04-01	BAKERSFIELD	3512520	406.410	1	93308	2022	4	1	Fri
236133	2022-05-13	BAKERSFIELD	3512520	475.090	2	93308	2022	5	13	Fri
236134	2022-08-04	BAKERSFIELD	3512520	500.910	2	93308	2022	8	4	Thurs

1950 rows × 18 columns



```
In [ ]: df_submission =
```

```
In [341]: df["size_code"].unique()
```

```
Out[341]: array([ 1856015,  1856515,  1956015,  1956515,  2055017,  2055516,
        2056016,  2056515,  2056516,  2057015,  2057016,  2057514,
        2057515,  2154517,  2155017,  2155516,  2155517,  2155518,
        2156016,  2156017,  2156516,  2156517,  2157015,  2157016,
        2254018,  2254517,  2254518,  2255017,  2255018,  2255517,
        2255518,  2255519,  2256016,  2256017,  2256018,  2256516,
        2256517,  2257515,  2257516,  2354019,  2354518,  2355017,
        2355018,  2355517,  2355518,  2355519,  2355520,  2356017,
        2356018,  2356516,  2356517,  2356518,  2357016,  2357515,
        2358016,  2358516,  2454019,  2454518,  2454519,  2454520,
        2455020,  2456018,  2456517,  2457017,  2457516,  2457517,
        2555020,  2555520,  2556019,  2556518,  2655020,  2656018,
        2656518,  2657016,  2657017,  2657516,  2755520,  2756020,
        2756518,  2757018,  2854522,  2857017,    11225,  2358017,
        2756520,  3512520, 22570195,  1756514,  1756515,  1757014,
        1855515,  1855516,  1856514,  1857014,  1955515,  1955516,
        1957014,  2054517,  2055016,  2055517,  2056015,  2154018,
        2154518,  2157515,  2158516,  2254019,  2254519,  2255516,
        2257015,  2257016,  2353519,  2354018,  2354517,  2354519,
        2355019,  2356016,  2453519,  2453520,  2454017,  2454018,
        2454020,  2454517,  2455018,  2455519,  2457016,  2553518,
        2553519,  2553520,  2554018,  2554019,  2554020,  2554519,
        2554520,  2555019,  2555518,  2556517,  2557016,  2557018,
        2653518,  2653519,  2653522,  2654520,  2656517,  2657018,
        2753020,  2753519,  2753520,  2754019,  2754020,  2754520,
        2857516,  3054022,  3110515,  3153520,  3512517,  3512518,
        2557517], dtype=int64)
```

```
In [423]: df10 = df[["size_code", "dc_name", "retail_price"]].groupby(["size_code", "dc_name"]).mean
```

```
In [424]: df10
```

Out[424...

		retail_price
size_code	dc_name	
11225	SACRAMENTO	260.104514
	SAN JOSE	254.235548
1756514	SACRAMENTO	46.230671
1756515	SACRAMENTO	71.053185
1757014	SACRAMENTO	46.390700
...
3512520	BAKERSFIELD	286.140610
	SACRAMENTO	310.921726
	SAN JOSE	311.242514
22570195	SACRAMENTO	205.721001
	SAN JOSE	194.767664

390 rows × 1 columns

In [420... df10.head(2)

		retail_price	total_tires	zip_code	Year	Month	Day	holiday
size_code	dc_name							
11225	SACRAMENTO	260.104514	4.838356	95838.0	2021.217808	6.526027	15.720548	0.027397
	SAN JOSE	254.235548	5.921918	95131.0	2021.217808	6.526027	15.720548	0.027397

In [720...

```
# inner join
df11 = pd.merge(df_test, df10, on=['size_code', "dc_name"], how='inner')
```

In [649... df11.info()

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2730 entries, 0 to 2729
Data columns (total 4 columns):
#   Column          Non-Null Count  Dtype  
---  -
0   size_code       2730 non-null  int64   
1   dc_name         2730 non-null  object  
2   date            2730 non-null  datetime64[ns]
3   retail_price    2730 non-null  float64  
dtypes: datetime64[ns](1), float64(1), int64(1), object(1)
memory usage: 106.6+ KB
```

In [721...

```
# The model will not accept datetime, hence create a feature for each date part
df11["Year"] = df11["date"].dt.year
df11["Month"] = df11["date"].dt.month
df11["Day"] = df11["date"].dt.day
df11["Day_of_week"] = df11["date"].dt.day_name()
```

```
In [722...] df11["season"] = df11["Month"]%12 // 3 + 1
```

```
In [723...] cal = USFederalHolidayCalendar()  
holidays = cal.holidays(start=df11['date'].min(),  
                           end=df11['date'].max()).to_pydatetime()  
df11['holiday'] = df11['date'].isin(holidays)
```

```
In [724...] df11.head()
```

```
Out[724...]   size_code  dc_name      date  retail_price  Year  Month  Day  Day_of_week  season  holiday  
0    1856015  OAKLAND  2022-09-20    56.891904  2022     9   20    Tuesday         4    False  
1    1856015  OAKLAND  2022-09-21    56.891904  2022     9   21    Wednesday        4    False  
2    1856015  OAKLAND  2022-09-22    56.891904  2022     9   22    Thursday         4    False  
3    1856015  OAKLAND  2022-09-23    56.891904  2022     9   23     Friday         4    False  
4    1856015  OAKLAND  2022-09-24    56.891904  2022     9   24    Saturday         4    False
```

```
In [679...] df11 = pd.get_dummies( df11, columns = cols_to_transform )
```

```
In [725...] # change object data type to category  
# Represent dc_name as numbers to avoid text values  
df11["dc_name_cat"] = pd.Categorical(df11["dc_name"])  
df11["dc_name_num"] = df11["dc_name_cat"].cat.codes
```

```
In [726...] df11["Day_of_week_cat"] = pd.Categorical(df11["Day_of_week"])  
df11["Day_of_week_num"] = df11["Day_of_week_cat"].cat.codes
```

```
In [727...] df11["holiday_cat"] = pd.Categorical(df11["holiday"])  
df11["holiday_num"] = df11["holiday_cat"].cat.codes
```

```
In [728...] df11.info()
```

```
<class 'pandas.core.frame.DataFrame'>  
Int64Index: 2730 entries, 0 to 2729  
Data columns (total 16 columns):  
#   Column                Non-Null Count  Dtype  
---  -  
0   size_code             2730 non-null   int64  
1   dc_name               2730 non-null   object  
2   date                 2730 non-null   datetime64[ns]  
3   retail_price         2730 non-null   float64  
4   Year                 2730 non-null   int64  
5   Month               2730 non-null   int64  
6   Day                 2730 non-null   int64  
7   Day_of_week          2730 non-null   object  
8   season               2730 non-null   int64  
9   holiday              2730 non-null   bool  
10  dc_name_cat           2730 non-null   category  
11  dc_name_num           2730 non-null   int8  
12  Day_of_week_cat       2730 non-null   category  
13  Day_of_week_num       2730 non-null   int8  
14  holiday_cat           2730 non-null   category  
15  holiday_num           2730 non-null   int8  
dtypes: bool(1), category(3), datetime64[ns](1), float64(1), int64(5), int8(3), object (2)  
memory usage: 232.6+ KB
```

```
In [729...] df11_eval = df11[features]
```

```
In [758...] df11["total_tires"] = model.predict(df11_eval)
```

```
In [731...] df11.head()
```

```
Out[731...]   size_code  dc_name  date  retail_price  Year  Month  Day  Day_of_week  season  holiday  dc_name
```

0	1856015	OAKLAND	2022-09-20	56.891904	2022	9	20	Tuesday	4	False	OAKL
1	1856015	OAKLAND	2022-09-21	56.891904	2022	9	21	Wednesday	4	False	OAKL
2	1856015	OAKLAND	2022-09-22	56.891904	2022	9	22	Thursday	4	False	OAKL
3	1856015	OAKLAND	2022-09-23	56.891904	2022	9	23	Friday	4	False	OAKL
4	1856015	OAKLAND	2022-09-24	56.891904	2022	9	24	Saturday	4	False	OAKL

```
In [759...] df_submission = df11[["date", "dc_name", "size_code", "total_tires"]]
```

```
In [733...] df_submission.head()
```

```
Out[733...]   date  dc_name  size_code  total_tires
```

0	2022-09-20	OAKLAND	1856015	3.044636
1	2022-09-21	OAKLAND	1856015	3.780949
2	2022-09-22	OAKLAND	1856015	7.762942
3	2022-09-23	OAKLAND	1856015	7.433838
4	2022-09-24	OAKLAND	1856015	5.023912

```
In [446...] df_submission.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2730 entries, 0 to 2729
Data columns (total 4 columns):
#   Column          Non-Null Count  Dtype
---  -
0   date             2730 non-null   object
1   dc_name          2730 non-null   object
2   size_code        2730 non-null   int64
3   total_tires      2730 non-null   float32
dtypes: float32(1), int64(1), object(2)
memory usage: 96.0+ KB
```

```
In [760...] df_submission["date"] = df_submission["date"].astype(str)
```

```
<ipython-input-760-420be9dff09b>:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

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

```
df_submission["date"] = df_submission["date"].astype(str)
```

```
In [593... df_submission.shape
```

```
Out[593... (2730, 4)
```

```
In [761... import requests
url = "https://scoring-app-uuzeqpiufa-ue.a.run.app/forecast/validate"
payload = {
    "team_key": "xmb73wH9",
    "data": df_submission.to_dict(orient="records")
}
response = requests.post(url, json=payload)
print(response.status_code, response.content)
```

```
200 b'{"message":"Success"}'
```

```
In [763... import requests
url = "https://scoring-app-uuzeqpiufa-ue.a.run.app/forecast/submit"
payload = {
    "team_key": "xmb73wH9",
    "data": df_submission.to_dict(orient="records")
}
response = requests.post(url, json=payload)
print(response.status_code, response.content)
```

```
201 b'{"message":"Success","challenge":"forecast","score":1.89549}'
```

The End!