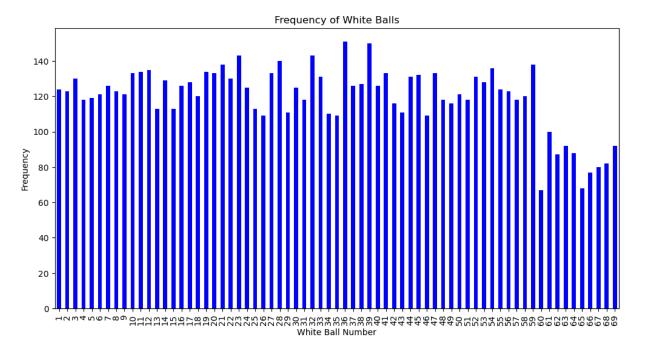
Analysis of Powerball winning numbers

Kalyan Pothineni

```
In [1]: import pandas as pd
        import matplotlib.pyplot as plt
        # Load the data file
        file_path = 'Lottery_Powerball_Winning_Numbers__Beginning_2010.csv'
        data = pd.read csv(file path)
In [2]: # Display the first few rows of the dataset and its structure
        data_head = data.head()
        data_info = data.info()
      <class 'pandas.core.frame.DataFrame'>
      RangeIndex: 1650 entries, 0 to 1649
      Data columns (total 3 columns):
       # Column Non-Null Count Dtype
      ___
       0 Draw Date 1650 non-null object
       1 Winning Numbers 1650 non-null object
       2 Multiplier 1440 non-null float64
      dtypes: float64(1), object(2)
      memory usage: 38.8+ KB
In [3]: # Convert Draw Date to datetime
        data['Draw Date'] = pd.to datetime(data['Draw Date'], format='%m/%d/%Y')
In [4]: data.info()
      <class 'pandas.core.frame.DataFrame'>
      RangeIndex: 1650 entries, 0 to 1649
      Data columns (total 3 columns):
       # Column
                     Non-Null Count Dtype
       --- -----
       0 Draw Date 1650 non-null datetime64[ns]
       1 Winning Numbers 1650 non-null object
       2 Multiplier
                          1440 non-null float64
      dtypes: datetime64[ns](1), float64(1), object(1)
      memory usage: 38.8+ KB
In [5]: # Split the Winning Numbers into separate columns
        winning_numbers = data['Winning Numbers'].str.split(' ', expand=True)
        winning_numbers.columns = ['White Ball 1', 'White Ball 2', 'White Ball 3', 'White B
In [6]: # Concatenate the split columns with the original dataframe
        data = pd.concat([data, winning_numbers], axis=1)
In [7]: # Drop the original Winning Numbers column
        data.drop(columns=['Winning Numbers'], inplace=True)
```

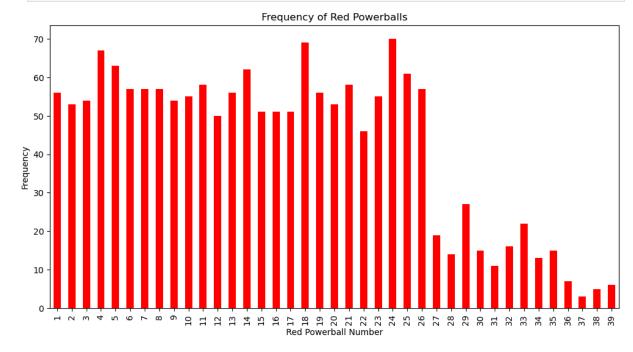
```
In [8]:
          # Handle missing values in the Multiplier column by filling with 1 (assuming no mul
          data['Multiplier'].fillna(1, inplace=True)
 In [9]: # Convert the ball columns to integers
          ball_columns = ['White Ball 1', 'White Ball 2', 'White Ball 3', 'White Ball 4', 'Wh
          data[ball columns] = data[ball columns].astype(int)
In [10]: # Display the cleaned data
          data.head()
Out[10]:
                                   White
               Draw
                                             White
                                                       White
                                                                 White
                                                                           White
                                                                                          Red
                      Multiplier
                Date
                                    Ball 1
                                              Ball 2
                                                        Ball 3
                                                                  Ball 4
                                                                            Ball 5
                                                                                    Powerball
               2020-
          0
                            3.0
                                                 21
                                                                     36
                                                                              62
                                                                                           24
                                       11
                                                           27
               09-26
               2020-
                            2.0
                                       14
                                                 18
                                                           36
                                                                    49
                                                                              67
                                                                                           18
               09-30
               2020-
          2
                            2.0
                                       18
                                                                              47
                                                                                           20
                                                 31
                                                           36
                                                                    43
               10-03
               2020-
          3
                            2.0
                                        6
                                                 24
                                                           30
                                                                     53
                                                                              56
                                                                                           19
               10-07
               2020-
                                        5
                                                           23
                                                                              50
          4
                            3.0
                                                 18
                                                                    40
                                                                                           18
               10-10
In [11]: # Visualize the frequency of each White Ball number
          white_balls = data[ball_columns[:-1]].values.flatten()
          white_ball_freq = pd.Series(white_balls).value_counts().sort_index()
In [12]: plt.figure(figsize=(12, 6))
```

```
In [12]: plt.figure(figsize=(12, 6))
   white_ball_freq.plot(kind='bar', color='blue')
   plt.title('Frequency of White Balls')
   plt.xlabel('White Ball Number')
   plt.ylabel('Frequency')
   plt.show()
```



```
In [13]: # Visualize the frequency of Red Powerball numbers
    red_ball_freq = data['Red Powerball'].value_counts().sort_index()

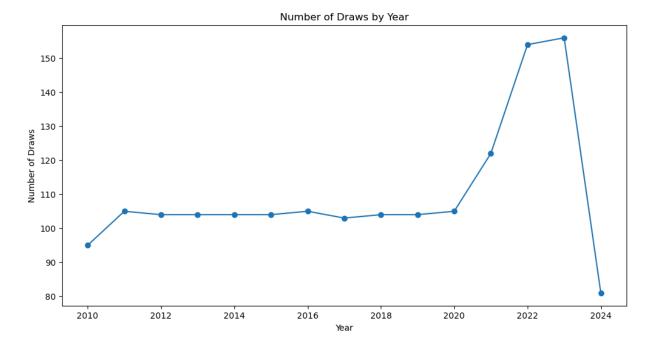
    plt.figure(figsize=(12, 6))
    red_ball_freq.plot(kind='bar', color='red')
    plt.title('Frequency of Red Powerballs')
    plt.xlabel('Red Powerball Number')
    plt.ylabel('Frequency')
    plt.show()
```



```
In [14]: # Display the most common numbers
    print("Most common White Ball numbers:")
    print(white_ball_freq.sort_values(ascending=False).head(10))
```

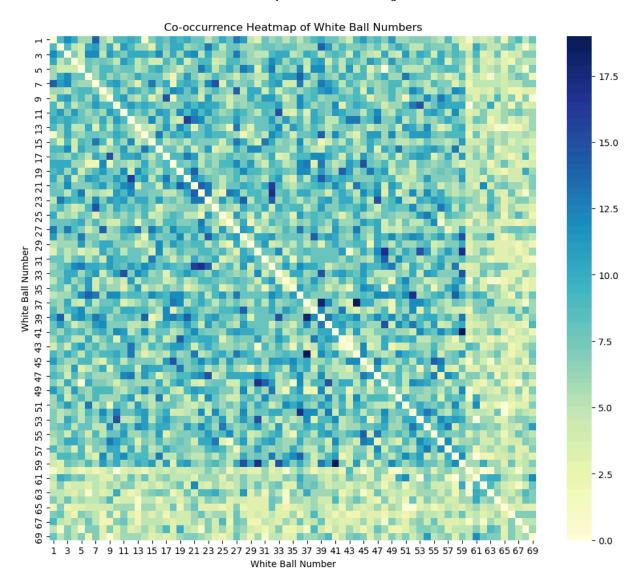
```
print("\nMost common Red Powerball numbers:")
         print(red_ball_freq.sort_values(ascending=False).head(5))
        Most common White Ball numbers:
        36
              151
        39
              150
        23
             143
        32
             143
        28
             140
        59
             138
        21
             138
        54
             136
        12
             135
        19
             134
        Name: count, dtype: int64
        Most common Red Powerball numbers:
        Red Powerball
        24
              70
        18
              69
        4
              67
        5
              63
        14
              62
        Name: count, dtype: int64
In [15]: from itertools import combinations
         from collections import Counter
         # Helper function to count frequency of combinations
         def count_combinations(data, n):
             combos = []
             for row in data[ball_columns[:-1]].itertuples(index=False):
                 combos.extend(combinations(row, n))
             return Counter(combos)
         # Frequency of each individual number
         individual freq = data[ball columns[:-1]].stack().value counts().sort index()
         # Frequency of each pair
         pair_freq = count_combinations(data, 2)
         # Frequency of each triple
         triple_freq = count_combinations(data, 3)
         # Frequency of each quadruple
         quadruple_freq = count_combinations(data, 4)
         # Frequency of each quintuple
         quintuple_freq = count_combinations(data, 5)
         # Display results
         print("Most common individual numbers:")
         print(individual_freq.sort_values(ascending=False).head(10))
         print("\nMost common pairs:")
         print(pair_freq.most_common(10))
```

```
print("\nMost common triples:")
                                              print(triple freq.most common(10))
                                             print("\nMost common quadruples:")
                                              print(quadruple_freq.most_common(10))
                                             print("\nMost common quintuples:")
                                             print(quintuple freq.most common(10))
                                      Most common individual numbers:
                                      36
                                                                   151
                                      39
                                                                   150
                                      23
                                                                   143
                                      32
                                                                   143
                                      28
                                                                   140
                                      59
                                                                   138
                                      21
                                                                   138
                                      54
                                                                   136
                                      12
                                                                   135
                                      19
                                      Name: count, dtype: int64
                                      Most common pairs:
                                      [((37, 44), 19), ((41, 59), 19), ((37, 39), 18), ((22, 32), 17), ((30, 59), 17), ((37, 44), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 19), ((41, 59), 
                                      0, 48), 17), ((36, 52), 17), ((21, 32), 16), ((12, 20), 16), ((30, 53), 15)]
                                      Most common triples:
                                      [((1, 3, 13), 5), ((23, 28, 56), 5), ((18, 32, 45), 4), ((8, 44, 51), 4), ((1, 2, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 12), (1, 
                                      7), 4), ((8, 17, 59), 4), ((12, 20, 21), 4), ((28, 53, 56), 4), ((7, 15, 36), 4),
                                      ((28, 40, 48), 4)]
                                      Most common quadruples:
                                      3), 2), ((5, 18, 33, 43), 2), ((37, 44, 45, 53), 2), ((35, 41, 44, 58), 2), ((1, 2,
                                      39, 66), 2), ((6, 8, 37, 40), 2), ((5, 23, 28, 56), 2)]
                                      Most common quintuples:
                                      [((11, 21, 27, 36, 62), 1), ((14, 18, 36, 49, 67), 1), ((18, 31, 36, 43, 47), 1),
                                       ((6, 24, 30, 53, 56), 1), ((5, 18, 23, 40, 50), 1), ((21, 37, 52, 53, 58), 1), ((6, 24, 30, 53, 56), 1), ((6, 24, 30, 53, 58), 1), ((6, 24, 30, 53, 58), 1), ((6, 24, 30, 53, 58), 1), ((6, 24, 30, 53, 58), 1), ((6, 24, 30, 53, 58), 1), ((6, 24, 30, 53, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), ((6, 24, 30, 58), 1), (
                                      10, 31, 37, 44), 1), ((1, 3, 13, 44, 56), 1), ((18, 20, 27, 45, 65), 1), ((11, 28, 3
                                      7, 40, 53), 1)]
In [16]: # Visualize the trend of draws by year
                                             data['Year'] = data['Draw Date'].dt.year
                                             yearly_trends = data.groupby('Year').size()
                                             plt.figure(figsize=(12, 6))
                                             yearly_trends.plot(kind='line', marker='o')
                                              plt.title('Number of Draws by Year')
                                              plt.xlabel('Year')
                                              plt.ylabel('Number of Draws')
                                             plt.show()
```



Methods

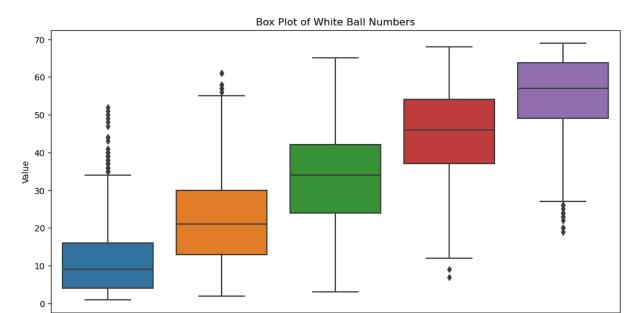
Heatmap of Co-occurrence of White Ball Numbers



Box Plot of Drawn Numbers

```
In [18]: plt.figure(figsize=(12, 6))
    sns.boxplot(data=data[ball_columns[:-1]])
    plt.title('Box Plot of White Ball Numbers')
    plt.xlabel('White Ball Number')
    plt.ylabel('Value')
    plt.show()

plt.figure(figsize=(8, 6))
    sns.boxplot(data=data['Red Powerball'])
    plt.title('Box Plot of Red Powerball Numbers')
    plt.xlabel('Red Powerball Number')
    plt.ylabel('Value')
    plt.show()
```



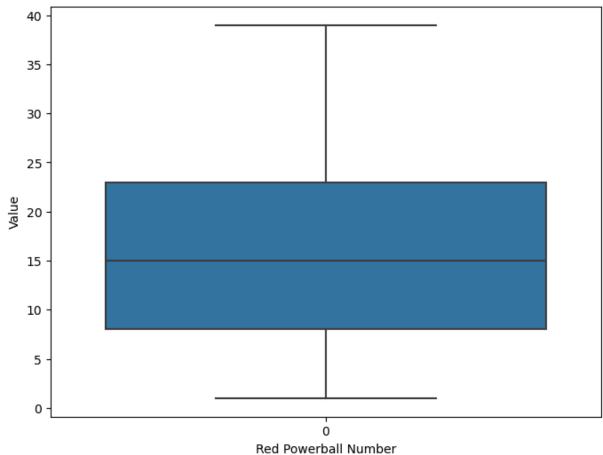


White Ball 3

White Ball Number

White Ball 4

White Ball 5



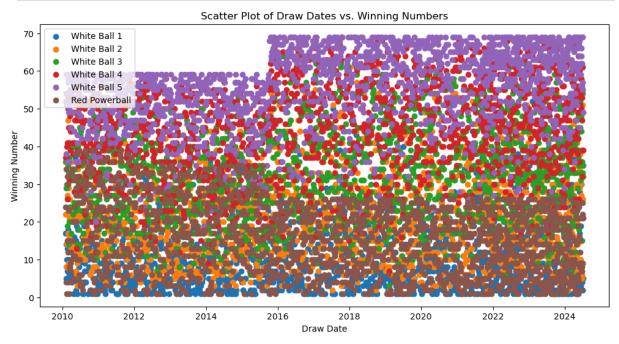
Scatter Plot of Draw Dates vs. Winning Numbers

```
In [19]: plt.figure(figsize=(12, 6))
   for ball in ball_columns:
        plt.scatter(data['Draw Date'], data[ball], label=ball)
   plt.title('Scatter Plot of Draw Dates vs. Winning Numbers')
```

White Ball 1

White Ball 2

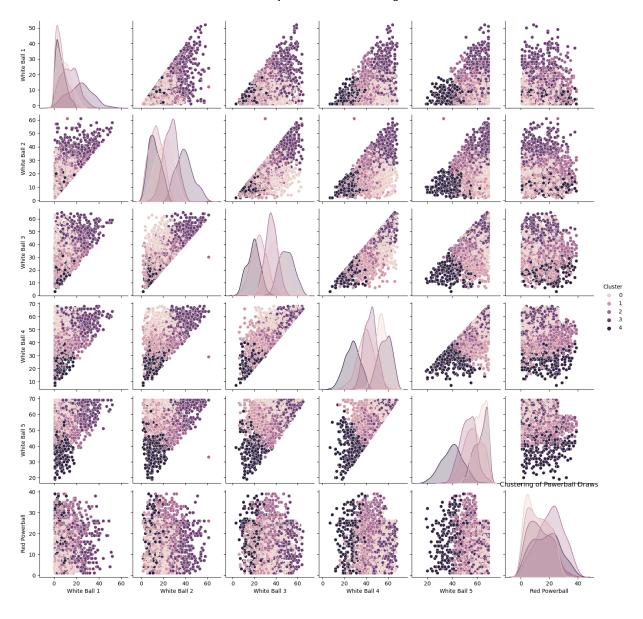
```
plt.xlabel('Draw Date')
plt.ylabel('Winning Number')
plt.legend()
plt.show()
```



Clustering of Draws

```
In [20]: from sklearn.cluster import KMeans
         import warnings
         # Suppress all warnings
         warnings.filterwarnings('ignore')
         # Prepare data for clustering
         X = data[ball_columns]
         # KMeans Clustering
         kmeans = KMeans(n_clusters=5, random_state=0)
         clusters = kmeans.fit_predict(X)
         print(kmeans)
         # Add cluster labels to data
         data['Cluster'] = clusters
         # Visualization: Cluster Plot
         plt.figure(figsize=(12, 6))
         sns.pairplot(data, hue='Cluster', vars=ball_columns)
         plt.title('Clustering of Powerball Draws')
         plt.show()
```

KMeans(n_clusters=5, random_state=0)
<Figure size 1200x600 with 0 Axes>



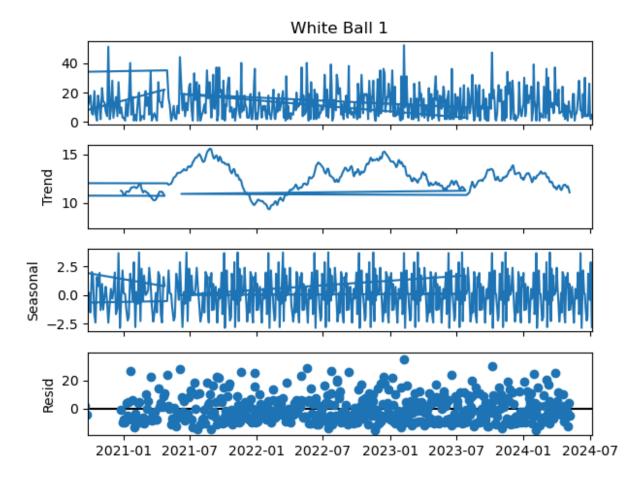
Time Series Analysis

```
import statsmodels.api as sm

# Decompose the time series for one of the white balls
white_ball_1_ts = data.set_index('Draw Date')['White Ball 1']
decomposition = sm.tsa.seasonal_decompose(white_ball_1_ts, model='additive', period

plt.figure(figsize=(12, 8))
decomposition.plot()
plt.show()
```

<Figure size 1200x800 with 0 Axes>



Conclusion

Conducting Powerball-winning numbers does bring out general patterns and frequencies. Some frequently appearing numbers are 36, 39, and 23 in this category of numbers. Contains frequently observed pairs of points like (37, 44) and (41, 59). Also, common tuples of three, four, and five numbers were defined, adding more depth to the observations that the lottery numbers are random. K-means cluster analysis showed that similar drawings are grouped, which gave more depth to the drawing process analysis. The achieved results may provide significant information to all those who want to know more about the lottery statistics.

Assumptions

- The dataset from data.gov is accurate and comprehensive.
- The Powerball drawing process is random and unbiased.
- Historical patterns may provide insights, though future draws remain random.