

In [73]: `import pandas as pd`

In [74]: `df = pd.read_csv('premier-league-data.csv')`

In [75]: `df.head()`

Out[75]:

	home_team	away_team	home_goals	away_goals	result	season
0	Sheffield United	Liverpool	1	1	D	2006-2007
1	Arsenal	Aston Villa	1	1	D	2006-2007
2	Everton	Watford	2	1	H	?
3	Newcastle United	Wigan Athletic	2	1	H	2006-2007
4	Portsmouth	Blackburn Rovers	3	0	H	2006-2007

▼ Data Cleaning

▼ Remove invalid values from the season column

In [76]: `df.info()`

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 4560 entries, 0 to 4559
Data columns (total 6 columns):
#   Column      Non-Null Count  Dtype
---  -
0   home_team   4560 non-null   object
1   away_team   4560 non-null   object
2   home_goals  4560 non-null   int64
3   away_goals  4560 non-null   int64
4   result      4560 non-null   object
5   season      4560 non-null   object
dtypes: int64(2), object(4)
memory usage: 213.9+ KB
```

```
In [77]: df['season'].value_counts()
```

```
Out[77]: season
2007-2008    380
2008-2009    380
2009-2010    380
2010-2011    380
2011-2012    380
2012-2013    380
2013-2014    380
2014-2015    380
2015-2016    380
2016-2017    380
2017-2018    380
2006-2007    349
?            31
Name: count, dtype: int64
```

```
In [78]: filt = df['season'] == '?'
df.loc[filt, 'season'] = 'Unknown season'
```

```
In [79]: df['season'].value_counts()
```

```
Out[79]: season
2007-2008    380
2008-2009    380
2009-2010    380
2010-2011    380
2011-2012    380
2012-2013    380
2013-2014    380
2014-2015    380
2015-2016    380
2016-2017    380
2017-2018    380
2006-2007    349
Unknown season    31
Name: count, dtype: int64
```

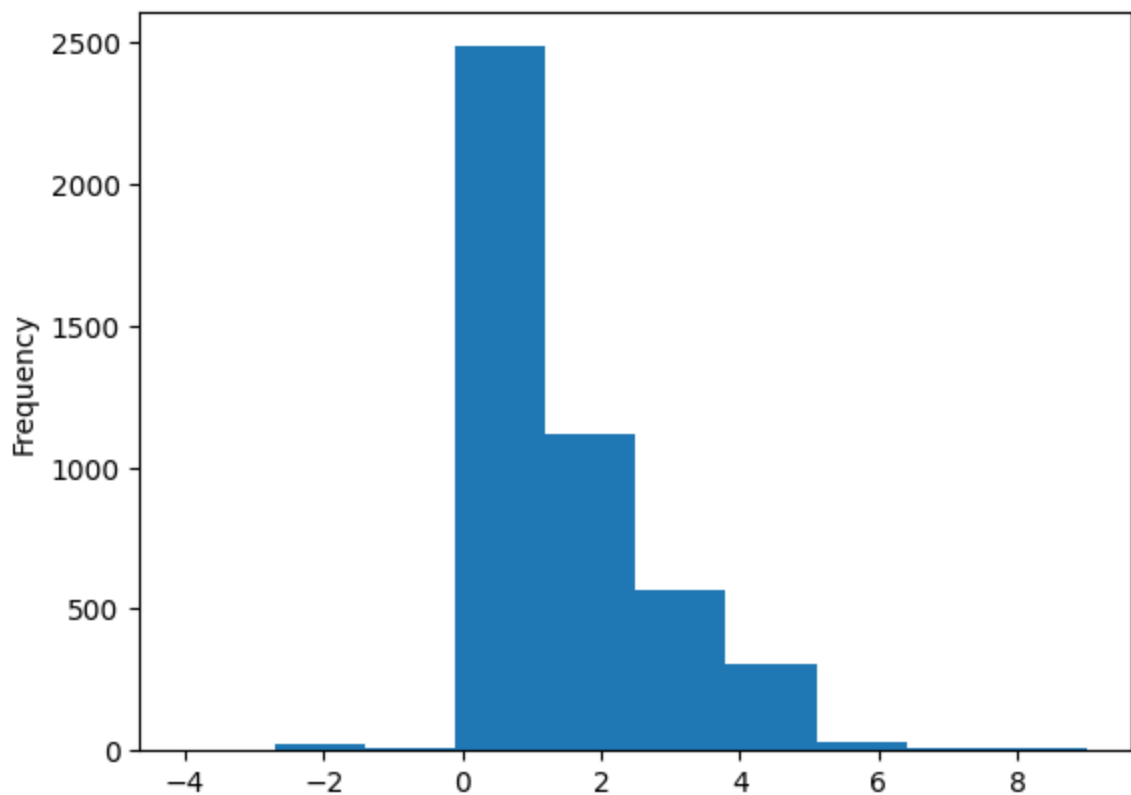
▼ **Identify invalid values in goals scored**

```
In [80]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>  
RangeIndex: 4560 entries, 0 to 4559  
Data columns (total 6 columns):  
#   Column      Non-Null Count  Dtype    
---  ---        
0   home_team   4560 non-null   object   
1   away_team   4560 non-null   object   
2   home_goals  4560 non-null   int64    
3   away_goals  4560 non-null   int64    
4   result      4560 non-null   object   
5   season      4560 non-null   object   
dtypes: int64(2), object(4)  
memory usage: 213.9+ KB
```

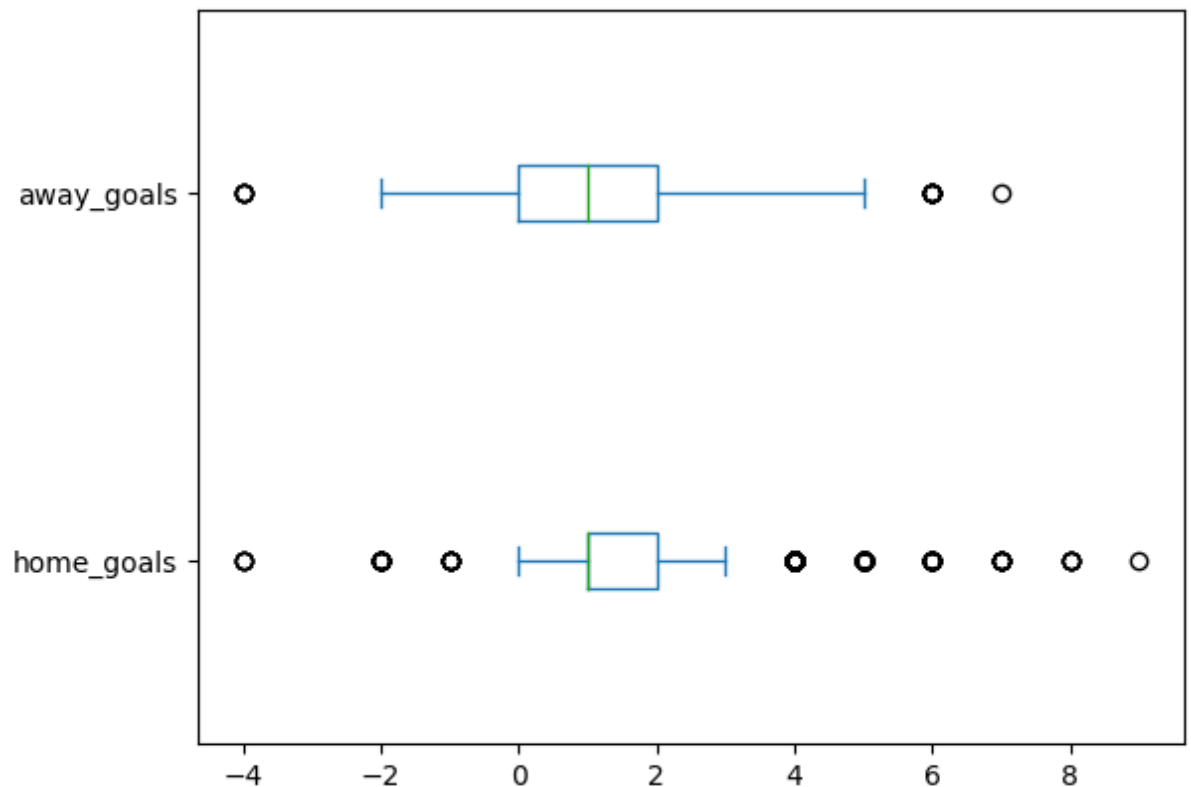
```
In [81]: df['home_goals'].plot(kind='hist')
```

```
Out[81]: <Axes: ylabel='Frequency'>
```



```
In [82]: df[['home_goals', 'away_goals']].plot(kind='box', vert=False)
```

```
Out[82]: <Axes: >
```



```
In [83]: (df[['home_goals', 'away_goals']] < 0).sum()
```

```
Out[83]: home_goals    34
         away_goals    39
         dtype: int64
```

```
In [84]: filt1 = df['home_goals'] < 0
         df.loc[filt1, 'home_goals'].count()
```

```
Out[84]: 34
```

```
In [85]: filt2 = df['away_goals'] < 0
         df.loc[filt2, 'away_goals'].count()
```

```
Out[85]: 39
```

▼ **Replace invalid goals for 0**

```
In [86]: df.loc[filt1, 'home_goals'] = 0
         df.loc[filt2, 'away_goals'] = 0
```

▼ **Identify and clean invalid results in the result column**

In [87]: `df['result'].value_counts()`

Out[87]: result
 H 2088
 A 1278
 D 1151
 ? 43
 Name: count, dtype: int64

In [88]: `filt1 = df['home_goals'] > df['away_goals']`
`filt2 = df['home_goals'] < df['away_goals']`
`filt3 = df['home_goals'] == df['away_goals']`

`df.loc[filt1, 'result'] = 'H'`
`df.loc[filt2, 'result'] = 'A'`
`df.loc[filt3, 'result'] = 'D'`

In [89]: `df['result'].value_counts()`

Out[89]: result
 H 2107
 A 1294
 D 1159
 Name: count, dtype: int64

▼ Analysis

▼ What's the average number of goals per match?

In [91]: `df.head()`

Out[91]:

	home_team	away_team	home_goals	away_goals	result	season
0	Sheffield United	Liverpool	1	1	D	2006-2007
1	Arsenal	Aston Villa	1	1	D	2006-2007
2	Everton	Watford	2	1	H	Unknown season
3	Newcastle United	Wigan Athletic	2	1	H	2006-2007
4	Portsmouth	Blackburn Rovers	3	0	H	2006-2007

In [92]: `(df['home_goals']+df['away_goals']).mean()`

Out[92]: 2.6633771929824563

▼ Create a new column *total_goals*

```
In [93]: df['total_goals'] = df['home_goals'] + df['away_goals']
```

```
In [94]: df.head()
```

```
Out[94]:
```

	home_team	away_team	home_goals	away_goals	result	season	total_goals
0	Sheffield United	Liverpool	1	1	D	2006-2007	2
1	Arsenal	Aston Villa	1	1	D	2006-2007	2
2	Everton	Watford	2	1	H	Unknown season	3
3	Newcastle United	Wigan Athletic	2	1	H	2006-2007	3
4	Portsmouth	Blackburn Rovers	3	0	H	2006-2007	3

▼ **Calculate average goals per season**

```
In [96]: goals_per_season = df.groupby('season')['total_goals'].mean().sort_index
goals_per_season
```

```
Out[96]: season
2006-2007      2.429799
2007-2008      2.618421
2008-2009      2.463158
2009-2010      2.747368
2010-2011      2.797368
2011-2012      2.763158
2012-2013      2.773684
2013-2014      2.718421
2014-2015      2.500000
2015-2016      2.676316
2016-2017      2.794737
2017-2018      2.678947
Unknown season  2.419355
Name: total_goals, dtype: float64
```

▼ **What's the biggest goal difference in a match?**

```
In [97]: (df['home_goals'] - df['away_goals']).max()
```

```
Out[97]: 8
```

```
In [98]: (df['home_goals'] - df['away_goals']).min()
```

```
Out[98]: -6
```

```
In [99]: (df['home_goals'] - df['away_goals']).abs().max()
```

```
Out[99]: 8
```

▼ **What's the team with most away wins?**

```
In [112]: filt = df['result'] == 'A'
df[filt].groupby('away_team')['result'].count().sort_values(ascending=False)
```

```
Out[112]: away_team
Chelsea                120
Manchester United      117
Arsenal                103
Liverpool              98
Manchester City         98
Tottenham Hotspur      90
Everton                66
Aston Villa            53
West Ham United         43
Newcastle United       41
Stoke City              36
Sunderland             35
West Bromwich Albion   34
Southampton            33
Swansea City            31
Wigan Athletic         29
Crystal Palace         27
Blackburn Rovers       27
Bolton Wanderers       26
Fulham                 23
Leicester City         22
Portsmouth             16
Watford                15
AFC Bournemouth        13
Hull City               13
Burnley                13
Norwich City           12
Reading                10
Birmingham City       10
Wolverhampton Wanderers 9
Middlesbrough          8
Queens Park Rangers    7
Blackpool              5
Sheffield United       3
Huddersfield Town      3
Cardiff City           2
Brighton and Hove Albion 2
Charlton Athletic      1
Name: result, dtype: int64
```

```
In [116]: df.groupby('away_team').apply(lambda rows: (rows['result'] == 'A')
                                           .sum()).sort_values(ascending=False)
```

```
Out[116]: away_team
Chelsea                                120
Manchester United                      117
Arsenal                               103
Manchester City                        98
Liverpool                             98
Tottenham Hotspur                     90
Everton                               66
Aston Villa                           53
West Ham United                       43
Newcastle United                      41
Stoke City                            36
Sunderland                           35
West Bromwich Albion                  34
Southampton                          33
Swansea City                          31
Wigan Athletic                        29
Crystal Palace                        27
Blackburn Rovers                      27
Bolton Wanderers                      26
Fulham                                23
Leicester City                        22
Portsmouth                            16
Watford                               15
AFC Bournemouth                       13
Hull City                             13
Burnley                               13
Norwich City                          12
Reading                               10
Birmingham City                      10
Wolverhampton Wanderers               9
Middlesbrough                         8
Queens Park Rangers                   7
Blackpool                             5
Sheffield United                       3
Huddersfield Town                     3
Cardiff City                           2
Brighton and Hove Albion               2
Charlton Athletic                     1
Derby County                           0
dtype: int64
```

▼ **What's the team with the most goals scored at home?**


```
In [120]: df.groupby('home_team')['home_goals'].sum().sort_values(ascending=False)
```

```
Out[120]: home_team
Manchester City          499
Manchester United        495
Chelsea                  488
Arsenal                  471
Liverpool                459
Tottenham Hotspur       414
Everton                  392
West Ham United          283
Newcastle United        267
Stoke City               244
Aston Villa              227
West Bromwich Albion     225
Sunderland               222
Fulham                   211
Swansea City             179
Southampton             171
Blackburn Rovers         155
Bolton Wanderers         152
Wigan Athletic           140
Leicester City           119
Crystal Palace           111
Hull City                107
Portsmouth               102
Norwich City              96
Middlesbrough            92
Watford                  91
AFC Bournemouth          84
Burnley                  80
Reading                  71
Birmingham City         67
Wolverhampton Wanderers  62
Queens Park Rangers      60
Blackpool                30
Brighton and Hove Albion  24
Sheffield United         23
Cardiff City             20
Charlton Athletic        19
Huddersfield Town        16
Derby County             12
Name: home_goals, dtype: int64
```

- ▼ ***What's the team that received the least amount of goals while playing at home?***

```
In [134]: new_df = df.groupby('home_team')[['home_team', 'away_goals']].agg({
            'home_team': 'size',
            'away_goals': 'sum'
        })
        .rename(
            columns={'home_team': 'total_games', 'away_goals': 'goals_received'})
        .sort_values(
            by=['total_games', 'goals_received'], ascending=[False, True])
```

```
In [135]: new_df
```

Out[135]:

	total_games	goals_received
home_team		
Manchester United	228	158
Liverpool	228	180
Arsenal	228	183
Chelsea	228	183
Manchester City	228	186
Tottenham Hotspur	228	218
Everton	228	238
West Ham United	209	279
Stoke City	190	213
Aston Villa	190	234

```
In [139]: new_df['goals_received_per_match'] =
            new_df['goals_received'] / new_df['total_games']
```

```
In [140]: new_df['goals_received_per_match'].sort_values(ascending=True)
```

```
Out[140]: home_team
Manchester United      0.692982
Liverpool              0.789474
Arsenal               0.802632
Chelsea               0.802632
Manchester City        0.815789
Tottenham Hotspur     0.956140
Birmingham City      1.017544
Everton               1.043860
Charlton Athletic     1.052632
Sheffield United      1.105263
Burnley               1.118421
Stoke City             1.121053
Leicester City        1.131579
Southampton           1.131579
Blackburn Rovers      1.157895
Portsmouth            1.184211
Middlesbrough         1.184211
Aston Villa           1.231579
Sunderland            1.242105
Newcastle United      1.263158
Fulham                1.276316
Norwich City          1.276316
Swansea City          1.278195
Huddersfield Town     1.315789
Brighton and Hove Albion 1.315789
Crystal Palace        1.315789
Bolton Wanderers      1.324561
Queens Park Rangers   1.333333
Reading               1.333333
West Ham United       1.334928
Watford               1.355263
West Bromwich Albion  1.385965
Wigan Athletic        1.413534
Hull City              1.494737
AFC Bournemouth       1.561404
Wolverhampton Wanderers 1.666667
Cardiff City          1.736842
Blackpool             1.947368
Derby County          2.263158
Name: goals_received_per_match, dtype: float64
```

▼ ***What's the team with most goals scored playing as a visitor (away from home)?***

```
In [142]: df.groupby('away_team')['away_goals']  
.sum().sort_values(ascending=False)
```

```
Out[142]: away_team  
Arsenal 379  
Manchester United 366  
Manchester City 359  
Chelsea 357  
Liverpool 348  
Tottenham Hotspur 339  
Everton 255  
Aston Villa 214  
West Ham United 209  
Newcastle United 177  
Sunderland 170  
West Bromwich Albion 154  
Stoke City 150  
Fulham 127  
Swansea City 127  
Wigan Athletic 125  
Southampton 123  
Blackburn Rovers 122  
Bolton Wanderers 111  
Crystal Palace 103  
Leicester City 98  
Hull City 72  
Reading 65  
Burnley 64  
Norwich City 63  
Portsmouth 63  
Watford 62  
AFC Bournemouth 60  
Wolverhampton Wanderers 56  
Queens Park Rangers 55  
Birmingham City 53  
Middlesbrough 49  
Blackpool 25  
Charlton Athletic 15  
Huddersfield Town 12  
Cardiff City 12  
Brighton and Hove Albion 10  
Sheffield United 8  
Derby County 8  
Name: away_goals, dtype: int64
```