```
In [ ]: import time
        from pybaseball import batting_stats
        import pandas as pd
        import numpy as np
In [ ]: # loop through all seasons from 1903 to 2022
        # and download players stats for each season
        startYear = 1903
        endYear = 2022
        for i in np.arange(startYear, endYear+1):
            stats = batting_stats(start_season=i,
                                  end_season=i,
                                  league='all', # both leagues
                                  qual=0, # no minimum number of at bats
                                  ind=1,
                                 stat_columns = ['SO', 'AB']) # only get strikeouts and at bats
            if(i==startYear): # write to file to ensure file is 'new'
                stats.to_csv('battingStatsRaw.csv', header=True, index=False, mode='w')
            else: # append instead of overwriteing. Also dont include header
                stats.to_csv('battingStatsRaw.csv', header=False, index=False, mode='a')
            if(i\%20==0): #print out when each decade is complete
                print(f'Done with {i}')
        Done with 1920
        Done with 1940
        Done with 1960
        Done with 1980
        Done with 2000
        Done with 2020
In [ ]: df = pd.read_csv('battingStatsRaw.csv')[['Season', 'AB', 'SO']]
In [ ]: df.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 87467 entries, 0 to 87466
        Data columns (total 3 columns):
         # Column Non-Null Count Dtype
        --- ----- ------
         O Season 87467 non-null int64
                  87467 non-null int64
         1 AB
         2 SO 83794 non-null float64
        dtypes: float64(1), int64(2)
        memory usage: 2.0 MB
In [ ]: df.head(5)
         Season AB SO
        0 1903 3 NaN
        1 1903 0 NaN
            1903 0 NaN
            1903 0 NaN
        4 1903 6 NaN
In [ ]: df.isna().sum()
        Season
                     0
                  3673
        dtype: int64
        lotta Null values for strikeouts. Lets see when they appear
In [ ]: # checking which seasons have null values
        seasons = []
        nulls = []
        for season in df['Season'].unique():
         seasonData = df.loc[df['Season'] == season]
            seasons.append(season)
            nulls.append(seasonData['S0'].isna().sum())
        numNull = pd.DataFrame({'Season':seasons, 'Null':nulls})
        numNull = numNull.loc[numNull['Null']!=0]
        numNull.sort_values(by='Season', ascending=True)
         Season Null
Out[ ]:
        0 1903 362
        1 1904 360
            1905 385
            1906 409
            1907 411
            1908 428
            1909 497
            1910 249
            1911 269
            1912 303
        The seasons 1903 - 1912 have a lot of missing values for strikeouts.
        I will download the season totals for those years manually https://www.baseball-reference.com/leagues/majors/bat.shtml
In [ ]: reduced = df.loc[df['Season']>=1913]
        reduced = reduced.astype(int)
In [ ]: reduced.info()
        <class 'pandas.core.frame.DataFrame'>
        Int64Index: 83028 entries, 4439 to 87466
        Data columns (total 3 columns):
         # Column Non-Null Count Dtype
        --- -----
         O Season 83028 non-null int32
                    83028 non-null int32
         1 AB
         2 S0
                    83028 non-null int32
        dtypes: int32(3)
        memory usage: 1.6 MB
In [ ]: reduced.to_csv('battingStatsClean1913to2022.csv',index=False)
        Now I need to get the season level totals for 1913-2022.
In [ ]: summary = reduced.groupby(['Season']).sum().reset_index()
In [ ]: summary.head(5)
          Season
                    AB SO
            1913 81213 9282
            1914 122489 14743
            1915 121704 14020
            1916 81923 9534
            1917 82055 8680
        Now I will load in the data for 1903-1912.
        This was downloaded manually and saved to a csv file
In [ ]: summary1912 = pd.read_csv('1903to1912.csv')
In [ ]: summary1912.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 10 entries, 0 to 9
        Data columns (total 3 columns):
         # Column Non-Null Count Dtype
         O Season 10 non-null
                    10 non-null
                                    int64
                    10 non-null
         2 S0
                                    int64
        dtypes: int64(3)
        memory usage: 368.0 bytes
In [ ]: summary1912.tail(5)
          Season AB SO
            1908 80679 9078
            1909 80613 9377
            1910 81551 9677
            1911 82259 9871
            1912 82039 9684
       allSeasonsSummary = pd.concat([summary1912, summary])
In [ ]: allSeasonsSummary
                           SO
Out[]:
            Season
                      AB
          0 1903
                    75439
          1 1904 82488 9299
                    81842
                          9523
                    80061 9110
              1906
              1907
                    80304 8836
              2018 165432 41207
              2019 166651 42823
        106
              2020 59030 15586
        108
              2021 161941 42145
              2022 163465 40812
       120 rows × 3 columns
In [ ]: # calculate strikeouts per 100 at bats
        allSeasonsSummary['Rate'] = round((allSeasonsSummary['SO'] / allSeasonsSummary['AB'])*100,2)
        allSeasonsSummary.tail()
            Season
                      AB SO Rate
              2018 165432 41207 24.91
              2019 166651 42823 25.70
                   59030 15586 26.40
        108
              2021 161941 42145 26.02
        109
              2022 163465 40812 24.97
```

In [ ]: | allSeasonsSummary.to\_csv('seasonSummaries.csv', index=False)