1. Modeling of carbon cycle

```
In [36]: import pandas as pd import numpy as np import matplotlib.pyplot as plt

# 读取数据集
fossil_fuel_emissions = pd.read_csv('E:/ESE5023/Global Fossil-Fuel CO2 Emissions.1751_2014.csv')
mauna_loa_data = pd.read_csv('E:/ESE5023/Mauna Loa CO2 annual mean data.csv')
ice_core_data = pd.read_excel('E:/ESE5023/Historical CO2 Records from the Law Dome DE08, DE08-2, and DSS Ice Cores.xlsx')

# 查看每个数据集的前几行以了解其结构
print(fossil_fuel_emissions.head())
print(mauna_loa_data.head())
print(ice_core_data.head())

observed_years = mauna_loa_data.loc[(mauna_loa_data['year'] >= 1986) & (mauna_loa_data['year'] <= 2004), 'year']
observed_co2 = mauna_loa_data.loc[(mauna_loa_data['year'] >= 1986) & (mauna_loa_data['year'] <= 2004), 'mean']
```

```
Year \
0 1751
1 1752
2 1753
3 1754
4 1755
  Total carbon emissions from fossil fuel consumption and cement production (million metric tons of C) \
0
1
  Carbon emissions from gas fuel consumption \
0
3
  Carbon emissions from liquid fuel consumption \
0
1
  Carbon emissions from solid fuel consumption ∖
0
                                             3
                                             3
  Carbon emissions from cement production Carbon emissions from gas flaring \
0
                                        0
```

```
Per capita carbon emissions (metric tons of carbon; after 1949 only)
        0
                                                       NaN
        1
                                                       NaN
        2
                                                       NaN
        3
                                                       NaN
        4
                                                      NaN
           year
                         unc
                   mean
        0 1959 315.98 0.12
        1 1960 316.91 0.12
        2 1961 317.64 0.12
        3 1962 318.45 0.12
        4 1963 318.99 0.12
          Ice Sample Code Analysis Mean Date
                                                                     Ice Age, ∖
                                                 Ice Depth,
        0
                                                                     year A.D.
                                                  m
        1
                                                         NaN
                        NaN
                                          NaN
                                                                           NaN
        2
                        NaN
                                          NaN
                                                         NaN
                                                                           NaN
               DE08 205
                                                      83.10
                                                                       1939
        3
                             20-Aug-92
               DE08 235
                             12-Aug-93
                                                      83.98
                                                                       1938
                   Mean Air Age,
                                       CO2 Mixing Ratio,
        0 year A.D.
                                  ppm
        1
                                                    NaN
                            NaN
        2
                            NaN
                                                    NaN
        3
                          1969
                                                   323.2
                                                   323.7
                          1968
In [210...
         # 常数
         k12 = 105/740
         k21 = 102/900
          gamma = 0
         # 时间参数
         years = np.arange(1987, 2005)
         N1 = 347 # 箱1的初始碳浓度 (ppm)
         N2 = 900/2.13 # 箱2的初始碳浓度 (ppm)
         # 存储结果
         N1_results = []
         N2_results = []
```

```
# 模拟
 for year in years:
     gamma = fossil fuel emissions.loc[fossil fuel emissions['Year'] == year,
                                      'Total carbon emissions from fossil fuel consumption and cement production (million met
     #碳流速率变化
     dN1 dt = -k12 * N1 + k21 * N2 + gamma/(1000*2.13)
     dN2 dt = k12 * N1 - k21 * N2
     # 更新浓度
     N1 += dN1 dt
     N2 += dN2 dt
     N1 results.append(N1)
     N2 results.append(N2)
 # 将结果转换为DataFrame以便于处理
 results df = pd.DataFrame({'Year': years, 'N1 (ppm)': N1 results, 'N2 (ppm)': N2 results})
 print(results df)
           N1 (ppm)
                      N2 (ppm)
   Year
   1987 348.338631 423.884374
   1988 349.739287 425.270572
   1989 351.159337 426.698410
   1990 352.543470 428.165919
   1991 353.929449 429.663508
   1992 355.258449 431.188030
   1993 356.567897 432.728347
  1994 357.914941 434.279894
7
8
   1995 359.308195 435.846734
   1996 360.748469 437.433691
10 1997 362.214939 439.045155
11 1998 363.665351 440.682067
12 1999 365.088435 442.339264
13 2000 366.578163 444.010570
14 2001 368.121042 445.703841
15 2002 369.684321 447.424130
16 2003 371.400092 449.171270
17 2004 373.242719 450.963854
```

N1 = 347

```
N2 = 900/2.13
# 存储结果
N1 buffered results = []
N2 buffered results = []
# 带缓冲效应的模拟
for year in years:
    gamma = fossil fuel emissions.loc[fossil fuel emissions['Year'] == year,
                                     'Total carbon emissions from fossil fuel consumption and cement production (million met
   xi = 3.69 + 0.0186 * N1 - 0.0000018 * N1 ** 2 # 缓冲效应系数
   N2 eq = 821/2.13 # 箱2中的平衡浓度
   dN1 dt = -k12 * N1 + k21 * (N2 eq + xi * (N2 - N2 eq)) + gamma/(1000*2.13)
   dN2 dt = k12 * N1 - k21 * (N2 eq + xi * (N2 - N2 eq))
   # 更新浓度
   N1 += dN1 dt
   N2 += dN2 dt
   N1 buffered results.append(N1)
   N2 buffered results.append(N2)
# 将结果转换为DataFrame
results buffered df = pd.DataFrame({'Year': years, 'N1 (ppm)': N1 buffered results, 'N2 (ppm)': N2 buffered results})
print(results buffered df)
```

```
N1 (ppm)
                               N2 (ppm)
            Year
            1987 385.864715 386.358290
            1988 378.680234 396.329626
         1
            1989 384.401426 393.456320
         2
         3
            1990 385.992855 394.716535
            1991 388.929388 394.663570
            1992 391.408347 395.038132
            1993 394.030319 395.265925
        7
            1994 396.655325 395.539511
         8
           1995 399.353938 395.800992
            1996 402.110740 396.071420
         10 1997 404.915988 396.344106
        11 1998 407.728181 396.619237
        12 1999 410.536031 396.891669
        13 2000 413.427447 397.161286
         14 2001 416.386237 397.438646
        15 2002 419.389451 397.719000
        16 2003 422.570696 398.000666
         17 2004 425.906880 398.299693
In [213...
         plt.figure(figsize=(10, 6))
          plt.plot(results_df['Year'], results_df['N1 (ppm)'], label='Calculation without Buffer Effect', color='grey')
          plt.plot(results buffered df['Year'], results buffered df['N1 (ppm)'], label='Calculation with Buffer Effect', color='black',
          plt.scatter(observed years, observed co2, color='gray', label='Observations', zorder=5) # 观测值
          plt.xticks(np.arange(1985, 2006, 5))
          plt.xlabel('Year')
          plt.ylabel('CO2 Concentration (ppm)')
          plt.legend()
          plt.xlim(1984, 2005)
          plt.ylim(340,450)
          plt.show()
```

