

## Assignment 05

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### 1. Modeling of carbon cycle

In this problem, we will build a box model to understand the Earth's carbon cycle based on the framework in Tomizuka 2009.

1.1 [15 points] Following equation 1-2 (without the buffer effect), build a two-box model to compute the atmospheric  $CO_2$  level in ppm (parts per million) from 1987 to 2004.

$$\frac{dN_1}{dt} = -k_{12}N_1 + k_{21}N_2 + \gamma \quad (1)$$

$$\frac{dN_2}{dt} = k_{12}N_1 - k_{21}N_2 \quad (2)$$

where  $\gamma$  is the rate of production of  $CO_2$  by fossil-fuel burning, where  $N_1$  and  $N_2$  denote the concentration of carbon in the atmosphere and the surface of the ocean, respectively,  $t$  is the time, and the transfer coefficient  $k_{ij}$  is the ratio of carbon flux from reservoir  $i$  to  $j$  divided by the carbon content in reservoir  $i$ :  $k_{12}=105/740$  and  $k_{21}=102/900$ ,  $\gamma$  is the rate of production of  $CO_2$  by fossil-fuel burning.

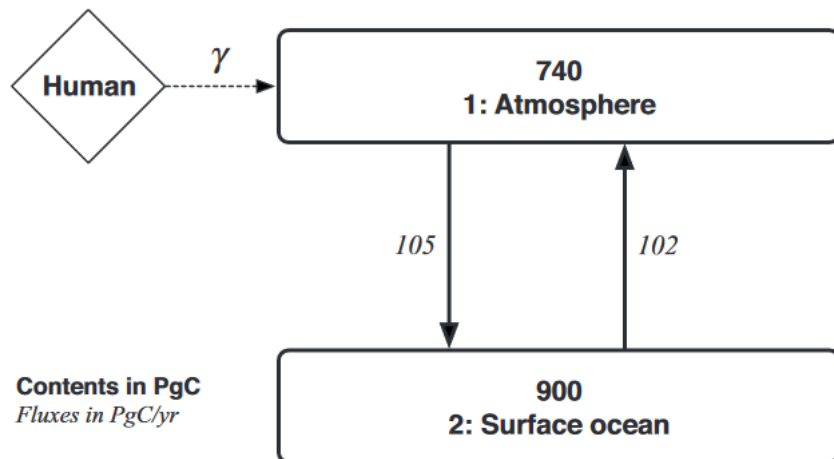


Figure 1 The simple two-box model for the global carbon cycle

The value of  $CO_2$  concentration in ppm is found by dividing the carbon content in PgC by 2.13. In 1986,  $N_1 = 347$ ppm.

(1) and (2) can be transformed to formulas as belows:

$$dN_1 = (-k_{12}N_1 + k_{21}N_2 + \gamma)dt$$

$$dN_2 = (k_{12}N_1 - k_{21}N_2)dt$$

When  $dt$  is smaller enough,  $dt$  can be seen as  $\Delta t$ ,  $dN_1$  can be seen as  $\Delta N_1$ , so when  $\Delta t = 1$ ,  $N_1^{i+1} = N_1^i + dN_1^i = N_1^i - k_{12}N_1^i + k_{21}N_2^i + \gamma$ ,  $N_2^{i+1} = N_2^i + dN_2^i = N_2^i + k_{12}N_1^i - k_{21}N_2^i$ .

So I use a for loop to compute the atmospheric CO<sup>2</sup> level in ppm (parts per million) from 1987 to 2004. The fossil fuel rate  $\gamma$  of each year are get from *global.1751\_2008.csv*.

My result is saved in a list, which is shown as follows:

```
[347.4178403755869, 348.7112676056338, 350.08079241213045,
351.4746641354907, 352.86629324151994, 354.2713413046096,
355.62111273289736, 356.95229141779373, 358.3247025086249,
359.74598833949364, 361.20632273118997, 362.6955078940884,
364.1474041707784, 365.5565833987238, 367.03436119185136,
368.57206201677303, 370.1158067146881, 371.8322999980965,
373.6850326650375]
```

The first to the last item in this array denotes the atmospheric CO<sup>2</sup> level in ppm from 1987 to 2004.

1.2 [20 points] Following equation 3-4 (with the buffer effect), build a two-box model to compute the atmospheric CO<sub>2</sub> level in ppm from 1987 to 2004.

$$\frac{dN_1}{dt} = -k_{12}N_1 + k_{21}(N_2^0 + \xi(N_2 - N_2^0)) + \gamma \quad (3)$$

$$\frac{dN_2}{dt} = k_{12}N_1 - k_{21}(N_2^0 + \xi(N_2 - N_2^0)) \quad (4)$$

In 1986, we let  $N_2^0 = 900 - 79 = 821$ , The buffer factor  $\xi$  depends on the CO<sup>2</sup> concentration in the atmosphere and is approximated as a quadratic function of the concentration. In this problem,  $\xi$  can be calculate by function as follows:

$$\xi(z) \approx 3.69 + 1.86 \times 10^{-2}z - 1.80 \times 10^{-6}z^2$$

where  $z$  is the atmospheric CO<sup>2</sup> concentration of ppm unit.

Like problem 1.2, I use a for loop to calculate the atmospheric CO<sup>2</sup> level in ppm. My result are as follows:

```
[347.4178403755869,      386.2678248192676,      379.07652231182266,
384.82042129901873,      386.44100423904933,      389.42203173163585,
391.9428548837997,      394.6092220225699,      397.281681136584,
400.0309463872509,      402.83107503883946,      405.6830665948721,
408.5203112074706,      411.33773620479604,      414.23711555982226,
417.206598695532,      420.20333376145396,      423.39618331711085,
426.7497421371073]
```

The first to the last item in this array denotes the atmospheric CO<sup>2</sup> level in ppm with buffer effect from 1987 to 2004.

1.3 [5 points] Based on your results from 1.1 and 1.2, reproduce Figure 2 in Tomizuka (2009) as much as you can.

My result is shown in Figure 2.

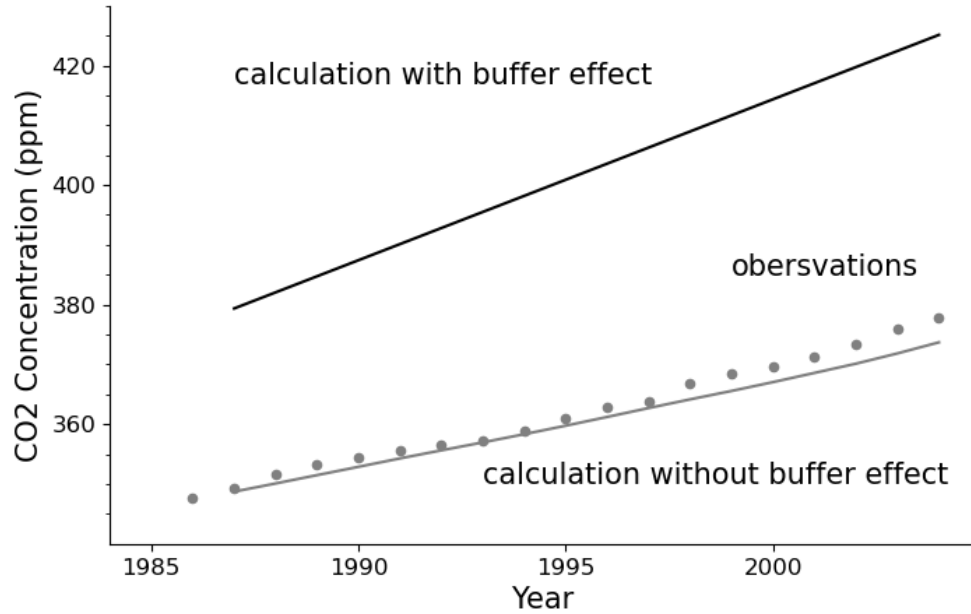


Figure 2 The CO<sub>2</sub> trend predicted by the two-box model with the buffer effect (solid line). The observed values and the result without the buffer effect are shown by dots and a fine line, respectively.

[Bonus] [15 points] Following equation 5-13, compute the atmospheric CO<sub>2</sub> level in ppm and reproduce Figure 4 in Tomizuka (2009).

$$f = f^0 \left( 1 + \beta \ln \left( \frac{P}{P^0} \right) \right) \quad (5)$$

where  $f$  is the net primary productivity (the difference between the carbon uptake rate by photosynthesis and the carbon emission rate by respiration);  $f^0$  corresponds to the preindustrial value of  $f$ .  $P$  is the atmospheric CO<sub>2</sub> concentration, and  $P^0$  is the preindustrial value of  $P$ . The fertilization factor, or  $\beta$  factor.

$$\begin{aligned}\frac{dN_1}{dt} = & -k_{12}N_1 + k_{21}(N_2^0 + \xi(N_2 - N_2^0)) + \gamma - f + \delta + k_{51}N_5 \\ & + k_{71}N_7,\end{aligned}\quad (6)$$

$$\begin{aligned}\frac{dN_2}{dt} = & k_{12}N_1 - k_{21}(N_2^0 + \xi(N_2 - N_2^0)) - k_{23}N_2 + k_{32}N_3 \\ & - k_{24}N_2,\end{aligned}\quad (7)$$

$$\frac{dN_3}{dt} = k_{23}N_2 - k_{32}N_3 - k_{34}N_3 + k_{43}N_4,\quad (8)$$

$$\frac{dN_4}{dt} = k_{34}N_3 - k_{43}N_4 + k_{24}N_2 - k_{45}N_4,\quad (9)$$

$$\frac{dN_5}{dt} = k_{45}N_4 - k_{51}N_5,\quad (10)$$

$$\frac{dN_6}{dt} = f - k_{67}N_6 - 2\delta,\quad (11)$$

$$\frac{dN_7}{dt} = k_{67}N_6 - k_{71}N_7 + \delta.\quad (12)$$

$\delta$  is the emission rate to the atmosphere by changes in land use, we take  $f^0=62$  PgC/year .The atmospheric CO<sup>2</sup> concentration before the industrial era is equivalent to 289 ppm.

The global land use flux from 1850 to 2000 can be obtained from file '*Global\_land-use\_flux-1850\_2005.xls*', and the data from 1750 to 1849 is calculated by linearly interpolated from 0.2 to 0.5.

I use  $\beta = 0.38$  and  $\beta = 0.50$  to calculate the atmospheric CO<sup>2</sup> concentration. The method is same as former ones. My result are shown in Figure 3. The observations are obtained from files '*lawdome\_observation.dat*' and '*Mauna\_Loa\_observation.csv*'.

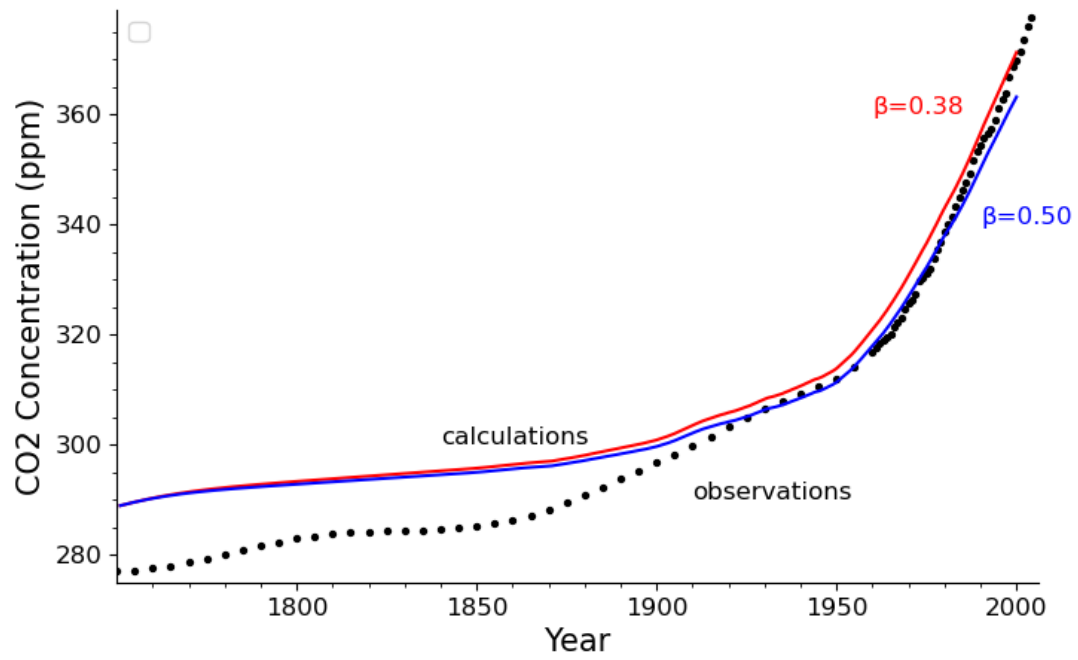


Figure 3 The CO2 trend calculated for 250 years by the seven-box model with  $\beta=0.38$  and  $0.50$ . The observed values are shown for reference.