

Simulation & Modeling Techniques

HW3: Modeling & Quadratic Growth

Libraries

```
In [1]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import scipy
import sympy
import pint
UNITS = pint.UnitRegistry()
import modsim
from modsim import*
```

0. Preliminary work

Here, we are going to load the data and prepare it for tasks we will do in this assignment.

The code here are the same used in the last assignment where we modeled population growth.

```
In [2]: # Read data
tables = pd.read_html('World_population_estimates.html', header=0, index_col=0,
, decimal="M")
len(tables)

# Get the 3rd element of the tables
table2 = tables[2]

# Replace new columns names
table2.columns = ['census', 'prb', 'un', 'maddison',
                  'hyde', 'tanton', 'biraben', 'mj',
                  'thomlinson', 'durand', 'clark']

# Write data in billion

census = table2.census
un = table2.un

census = census / 1e9
un = un / 1e9
```

```
In [3]: # Calculate elapsed time

t_0 = get_first_label(census)
t_end = get_last_label(census)
elapsed_time = t_end - t_0

# Calculate growth

p_0 = get_first_value(census)
p_end = get_last_value(census)
total_growth = p_end - p_0

# Annual growth

annual_growth = total_growth / elapsed_time
```

1. Proportional growth (Chap. 6)

Define the system and growth rate

```
In [4]: # Set different birth and death rate

## Before 1980:
birth_rate1 = 0.0310
death_rate1 = 0.0120

## After 1980:
birth_rate2 = 0.0370
death_rate2 = 0.0223

# Define growth rates: alpha1, before 1980 and alpha2, after 1980

alpha1 = birth_rate1 - death_rate1
alpha2 = birth_rate2 - death_rate2

# System with alpha1 and alpha2

system = System(t_0 = t_0,
                t_end = t_end,
                p_0 = p_0,
                alpha1 = alpha1,
                alpha2 = alpha2)
```

Write the updated function

```
In [5]: def update_func(pop, t, system):
        """ Compute the population next year.
        pop: current population
        t: current year
        system: system object containing parameters of the model
        returns: population next year depending on which year t falls
        """
        t_cutoff = 1980 # cutoff t

        # Set condition to pick a rate depending to where t falls

        if t < t_cutoff:
            net_growth = system.alpha1 * pop

        else:
            net_growth = system.alpha2 * pop

        return pop + net_growth
```

run_simulation function

```
In [6]: def run_simulation(system, update_func):
        """Simulate the system using any update function

        system: System object
        update_func: function that computes the population next year

        returns: TimeSeries
        """

        results = TimeSeries()
        results[system.t_0] = system.p_0

        for t in linrange(system.t_0, system.t_end):
            results[t+1] = update_func(results[t], t, system)

        return results
```

Test the results

Plot the results

```
In [7]: def plot_results(census, un, timeseries, title):
        """Plot the estimates and the model.

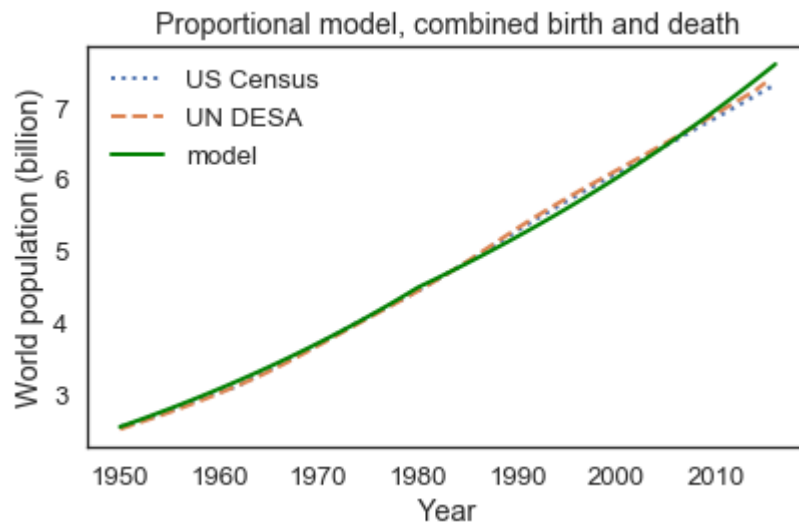
        census: TimeSeries of population estimates
        un: TimeSeries of population estimates
        timeseries: TimeSeries of simulation results
        title: string
        """

        plot(census, ':', label="US Census")
        plot(un, '--', label='UN DESA')
        plot(timeseries, color='green', label='model')

        decorate(xlabel='Year',
                  ylabel='World population (billion)',
                  title=title)
```

Run the simulation

```
In [8]: results = run_simulation(system, update_func)
        plot_results(census, un, results, 'Proportional model, combined birth and death')
```



2. Quadratic growth (Chap. 7)

We are going to use same functions as defined previously with some modifications adapted to quadratic model.

Define parameters

```
In [9]: alpha = 0.025
        beta = -0.0018

        # Max growth rate
        r = alpha

        # carrying capacity
        K = -alpha / beta
```

First parameterization method: Book example

```
In [10]: sys1 = System(t_0 = t_0,
                       t_end = t_end,
                       p_0 = p_0,
                       p_end = p_end,
                       alpha = alpha,
                       beta = beta)

In [11]: def update_func1(pop, t, sys1):

        net_growth = sys1.alpha * pop + sys1.beta * pop**2

        return pop + net_growth
```

Second system: New parameterization with carrying capacity

```
In [12]: sys2 = System(t_0 = t_0,
                       t_end = t_end,
                       p_0 = p_0,
                       p_end = p_end,
                       r = r,
                       K = K)
```

Updated function

```
In [13]: def update_func2(pop, t, sys2):

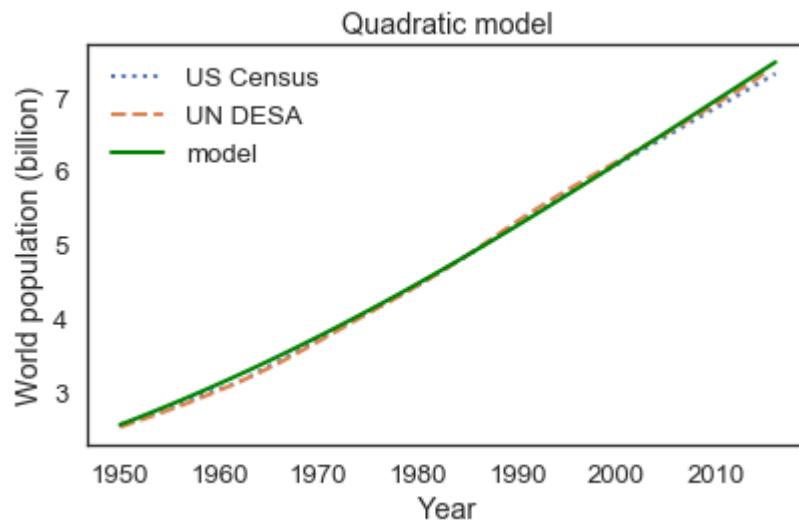
        p = pop

        delta_p = sys2.r*p*(1 - p/sys2.K) # population net growth

        return p + delta_p
```

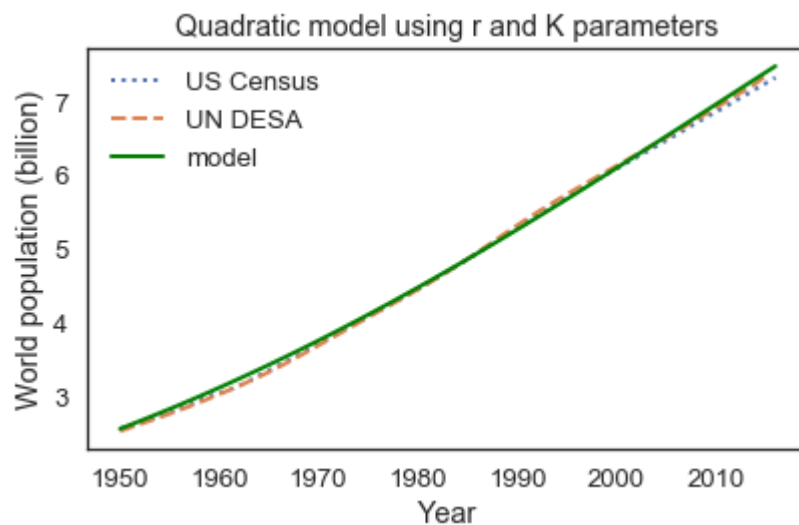
run_simulation & plot: first parameterization

```
In [14]: results = run_simulation(sys1, update_func1)
plot_results(census, un, results, 'Quadratic model')
```



run_simulation & plot: second parameterization with carrying capacity

```
In [15]: results = run_simulation(sys2, update_func2)
plot_results(census, un, results, 'Quadratic model using r and K parameters')
```



We can confirm that we get the same results from both parameterization methods