

Class 10, Problem Set 6



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Introduction to Programming and Numerical Analysis

Data project



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Overall good projects but for the model project and at the exam think about:

- Explanatory markdown
- Don't repeat yourselves
- Thoughtful plotting
- **RESTART KERNEL AND RUN ALL CELLS**

Plan for today

1. Working with equations

- SciPy linalg
- SymPy

2. Working on PS6



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SciPy linalg

Another one of SciPy's modules: `from scipy import linalg`

- Makes any operation within the realm of linear algebra:
 - Matrix product
 - Solve system of equations
 - Find eigenvalues
 - ... and so on



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SciPy linalg

Let's solve:

$$Ax = b$$



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SciPy linalg



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Let's solve:

$$Ax = b$$

```
In [1]: import numpy as np
from scipy import linalg
np.random.seed(1900)
A = np.random.uniform(size=(5,5))
b = np.random.uniform(size=5)
print(f'Matrix A:\n{A}\n\nMatrix b:\n {b}')
```

Matrix A:

```
[[0.33224607 0.71427591 0.37834749 0.24908241 0.83598633]
 [0.02005845 0.32670359 0.05606653 0.4008206  0.13288711]
 [0.88711192 0.15490098 0.01708181 0.95781716 0.58999632]
 [0.83959058 0.7146372  0.58705537 0.40933648 0.14603168]
 [0.16407166 0.65717511 0.146494   0.67717016 0.47425348]]
```

Matrix b:

```
[0.78485347 0.85159023 0.84757586 0.42016935 0.20991113]
```

```
In [2]: # Solve using LU factorization -> Split A in an upper and lower triangular matrix -> Speed  
# LU factorize A using linalg  
LU,piv = linalg.lu_factor(A)  
# Solve using linalg  
x = linalg.lu_solve((LU,piv),b)  
print(x)
```

```
[-15.33189031 -24.00998148  40.02675108  15.24193293   4.89008792]
```

In [3]:

```
# Regular solve  
print(linalg.solve(A,b))
```

```
[-15.33189031 -24.00998148  40.02675108  15.24193293   4.89008792]
```


SciPy linalg



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What do we use it for?

In the first question of the exam 2020 you had to implement the OLS estimator using linear algebra. Recall that:

$$\hat{\beta} = (X'X)^{-1}X'y$$

and can thus, be solved using linalg

SymPy

SymPy is a Python library for symbolic mathematics and lets you solve equations analytically! (Kinda like WolframAlpha or Symbolab). Let's check it out



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SymPy

Say that you want implement the utility function of standard OLG agent. We assume agents derive utility from consumption in both periods:

$$U_t = u(c_{1t}) + \frac{1}{1 + \rho} u(c_{2t+1})$$

Furthermore, we assume log-preferences



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In [4]:

```
import sympy as sm
# Initialize variabls in Sympy
c1,c2 = sm.symbols('c_1t'), sm.symbols('c_2t+1')
rho = sm.symbols('rho')

# Setup utility in sympy
uc1 = sm.ln(c1)
uc2 = sm.ln(c2)
U = uc1 + 1/(1+rho) * uc2
display(U)
```

$$\log(c_{1t}) + \frac{\log(c_{2t+1})}{\rho + 1}$$

SymPy

With SymPy we are able to do many calculations. Say that we need the derivate of U w.r.t. c_{2t+1} :



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SymPy



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With SymPy we are able to do many calculations. Say that we need the derivate of U w.r.t. c_{2t+1} :

```
In [5]: # We just use SymPy's .diff() method:  
sm.diff(U, c2)
```

```
Out[5]: 
$$\frac{1}{c_{2t+1}(\rho + 1)}$$

```

SymPy



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Another cool feature is that you can turn your SymPy equations into python functions. This can really tie your model projects together:

- Solve model analytically with SymPy
- Convert your solution to a python function e.g. the law-of-motion in OLG
- Find steady state level of capital using an optimizer

How is it done?

In [6]:

```
# Use SymPy's lambdify method which takes an iterable of arguments in our case the consumpti  
# and of course the function in our case U  
util = sm.lambdify((c1,c2,rho),U)  
  
# Compute some utility  
util(7,8,0.1)
```

Out[6]: 3.836311550582437

PS6

Start from 2.3 or watch the video on Absalon about solving system of equations



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