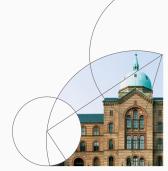
CENTER FOR ECONOMIC BEHAVIOR & INEQUALITY



1. Introduction

Introduction to Programming and Numerical Analysis

Jeppe Druedahl Asker Nygaard Christensen



Plan

- 1. Intended learning goals
- 2. Numerical analysis in action
- 3. Infrastructure
- 4. Work-flow
- 5. Projects
- 6. Summing up

- In a nutshell: Learn how to use numerical analysis to improve your understanding of economic problems
 - 1. Visualize solutions and simulations of well-known models
 - 2. Explore alternative assumptions regarding functional forms and parameter choices
 - 3. Solve more realistic models with constraints, uncertainty and non-convexities, where algebraic solutions are not available
 - 4. Work with online data and do programming based statistics and descriptive economics

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 - ⇒ very relevant when writing your bachelor and master theses
 - ⇒ very relevant when using in your work-life
- You will learn a set of important tools, but it is equally important that you learn how to acquire new tools for problems you will face in the future (in your studies or work-life)

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- Programming is more than writing code: Structuring, testing, documenting and collaborating on code is a central aspect of this course

Active learning

- Active learning: To learn scientific programming you need to work on actual problems yourself
 - I can show you examples
 - I can guide you in terms of where to start
 - I can answer questions
 - But you need to work with the material on your own
 - Programming is not a spectator sport!

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- High level: Few (if any) econ bachelor programs provide education on numerical analysis on the level you will get
- Work-in-progress: All of your feedback is very important for optimizing and improving the course!

Your teachers

Jeppe Druedahl, Associate Professor
 research: macro question, micro data, computational methods

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e-mail: jeppe.druedahl@econ.ku.dk

Asker Nygaard Christensen, PhD student

e-mail: anc@econ.ku.dk

Numerical analysis in action

Numerical analysis in action

- We work with Python 3.9
- Suggested environment:
 - 1. Distribution: Anaconda
 - 2. Editor/IDE: VSCode
- I will show how to use VSCode
 - 1. Run python code and notebooks
 - 2. Solve the consumer problem from microeconomics



Infrastructure

Getting started

- Web-page: The course is organized around https://sites.google.com/view/numeconcph-introprog/home
- DataCamp: Online courses on Python (requires no installation) ⇒ you get 6 months free access (see e-mail with details)
- Installation of Python: Follow the installation guide

Lectures, classes and exam

Lectures: 3 physical lectures (see calendar)

Videos: https://www.youtube.com/@numeconcph/

Questions? Ask them as a Github-issue

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- Classes: Week 6 to 20
- Exam requirements (see deadlines)
 - 1. Basic programming test (on DataCamp.com, see e-mail)
 - 2. Inaugural project + 2x useful peer feedback
 - 3. Data analysis project + 2x useful peer feedback
 - 4. Model analysis project + 2x useful peer feedback
- Exam: Portfolio of projects + exam problem (48 hours)
- Grading: Pass or fail
- Groups: All projects can be done in fixed groups (maximum of 3)

Course plan - lectures

Four parts:

- Fundamentals (primitives, optimize, print and plot, random numbers and simulation, structure and documentation, workflow and debugging)
- 2. Working with data (load/save and structure data, basic data analysis)
- 3. Algorithms (searching and sorting, solving equations, numerical optimization)
- Further perspectives (canonical economic models, speed-up with comprehensions, generators, vectorization and parallization, numba, EconModelClass)

Course plan - classes

- 1. DataCamp
- 2. DataCamp
- 3. DataCamp
- 4. Problem Set 1: Solving the consumer problem
- 5. Problem Set 2: Finding the Walras equilibrium in a multi-agent economy
- 6. Work on your inaugural project
- 7. Problem Set 3: Loading and combining data from Denmark Statistics
- 8. Problem Set 4: Analyzing data
- 9. Work on your data project
- 10. Problem Set 5: Writing your own searching and sorting algorithms
- 11. Problem Set 6: Solving the Solow model
- 12. Problem Set 7: Solving the consumer problem with income risk
- 13. Work on your model analysis project
- 14. Work on your model analysis project
- 15. Feedback on model project

GitHub.com (code hosting platform)

- All course materials will be shared on GitHub
- Organization: www.github.com/NumEconCopenhagen

Repositories:

- 1. IntroProg-lectures: slides, course plan, guides etc.
- 2. IntroProg-exercises: problem sets, solutions etc.
- Git: A version-control system for tracking changes in files and coordinating work ⇒ integrated in VSCode

Download course content guide

- 1. Follow the installation guide
- 2. Open VScode
- 3. Pres Ctrl+Shift+P
- 4. Write Git: Clone
- 5. Use https://github.com/NumEconCopenhagen/IntroProg-lectures
- 6. Repeat with https://github.com/NumEconCopenhagen/IntroProg-exercises
- 7. Create copies of the folder to work in
- 8. You can update later with Git: Sync



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Lectures:

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Note: OK to peak at answers, but write the solution yourself

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In between classes and lectures:

- 1. Go through lecture notebooks (curriculum)
- 2. Solve the problem set
- 3. Experiment with your own ideas

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- Help each other!! You will learn a lot.
 Remember to be constructive and polite!

Projects

Basic programming test

- You must complete the following courses on DataCamp
 - 1. Introduction to Data Science in Python
 - 2. Intermediate Python
 - 3. Python Data Science Toolbox (Part 1)
 - 4. Python Data Science Toolbox (Part 2)
- First 3 exercise classes: Reserved for your work on DataCamp

Inaugural project

Objectives:

- 1. Apply simple numerical solution methods
- 2. Structure a code project
- 3. Document code
- 4. Present results
- 5. Use GitHub

Content:

- 1. Solution of pre-specified economic model
- 2. Visualization of solution

Structure:

- 1. A self-contained single notebook presenting the analysis
- 2. Fully documented python files
- Hand-in: Create and commit folder called "inauguralproject" in your GitHub repository

Data analysis project

Objectives:

- 1. Apply data cleaning and data structuring methods
- 2. Apply data analysis methods
- 3. Structure a code project
- 4. Document code
- 5. Present results in text form and in figures

Content:

- 1. Import data from an online source
- 2. Present the data visually (and perhaps interactively)
- Apply some method(s) from descriptive economics (»samfundsbeskrivelse«)

Structure:

- 1. A self-contained single notebook presenting the analysis
- 2. Fully documented python files
- Hand-in: Create and commit folder called "dataproject" in your GitHub repository

Model analysis project

Objectives:

- 1. Apply model analysis methods
- 2. Structure a code project
- 3. Document code
- 4. Present results in text form and in figures

Content:

- 1. Describe an algorithm on how to solve a simple economic model
- 2. Solve (and perhaps simulate) a simple economic model
- 3. Visualize results across e.g. parametrizations
- 4. Analyze one or more extensions of the baseline model

Structure:

- 1. A self-contained single notebook presenting the analysis
- 2. Fully documented python files
- Hand-in: Create and commit folder called "modelproject" in your GitHub repository



Summing up

Summing up

I hope your have:

- 1. An idea of why learning numerical analysis is important
- 2. What you will learn in this course
- How you will learn it by working actively and interact with your fellow students
- 4. How you will qualify for and pass the exam

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- 4. Fourth priority: Run the example code from this lecture yourself