

# Advanced Macroeconomics II

## Handout 1 - Course Intro, Version Control, Best Practices

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January 16, 2023

# A bit about me

- ▶ Assistant Professor at Western since 2020
  - ▶ Before researcher at University of Oslo
- ▶ PhD at Minnesota
- ▶ Work on “modern macro” (Minnesota style)
  - ▶ We (minnesotans) have a very broad definition of macro...

# A bit about my work

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  - ▶ Tasks and occupations, wealth taxes, concentration, self-employment

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- ▶ Papers on many topics:
  - ▶ Tasks and occupations, wealth taxes, concentration, self-employment
- ▶ One unifying theme: **Heterogeneity**
- ▶ Modern macro is all about (cross-sectional) heterogeneity
  - ▶ Workers vary in skills, investors in rate of return, entrepreneurs in productivity, markets in concentration, consumers in wealth and income
  - ▶ List goes on: age, marital status, health, race, gender, human capital
- ▶ The line between modern macro and micro is blurry:
  - ▶ Macro models need to capture a lot of micro-behavior
  - ▶ Empirical backing for model assumptions from data

# A bit about my work: Wealth taxation (1/4)

- ▶ Should capital be taxed? What is the optimal value of  $\tau_k$ ?

$$c + a' = a + (1 - \tau_k)ra + wn$$

- ▶ People used to think answer was no:  $\tau_k = 0$  (Chamley-Judd)

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  - ▶ Theoretically (Straub & Werning, 2020)
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  - ▶ Quantitatively - Here is where heterogeneity plays a role
- ▶  $\tau_k > 0$  optimal if agents face **idiosyncratic labor income risk**  
(Aiyagari, 1995; Imrohoroglu, 1998; Boar & Midrigan, 2020)
  - ▶ Result maintained after adding life cycle and other taxes  
(Conesa, Kitao & Krueger, 2009; Many others)

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## Use it or lose it: efficiency gains from wealth taxation (QJE)

with Fatih Guvenen, Burhan Kuruscu, Gueorgui Kambourov and Daphne Chen



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  - ▶ This is true even if agents are heterogeneous: labor income, life cycle, retirement, mortality risk, bequest motives

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  - ▶ This is true even if agents are heterogeneous: labor income, life cycle, retirement, mortality risk, bequest motives
- ▶ Equivalence breaks if agents have **heterogeneous returns!**
  - ▶ Wealth taxes favors agents with high  $r$  (leading to efficiency gains...)

# A bit about my work: Wealth taxation (3/4)

## Lesson:

- ▶ Different forms of heterogeneity have different effects
- ▶ Ask: what is the relevant form of heterogeneity
  - ▶ relevant theoretically
  - ▶ relevant empirically

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## Lesson:

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  - ▶ relevant theoretically
  - ▶ relevant empirically

## Why heterogeneous returns?

- ▶ Theoretically interesting (break equivalence of taxes)
- ▶ Empirically relevant
  - ▶ Necessary to capture fat tail of income/wealth distribution  
(Work of Benhabib, Bisin and coauthors; Akira-Toda, 2019)
  - ▶ Direct empirical evidence: Norway (Fagereng, Guiso, Malacrino & Pistaferri, 2020) US (Smith, Yagan, Zidar & Swick, 2020)

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## Two tasks:

1. Establish conceptual result (this time it was easy)
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## Quantitative methods in modern macro

- ▶ Heterogeneous agent models required for validation
- ▶ In my paper I include and match moments for:
  - ▶ Life cycle: work, retirement, mortality risk, bequests
  - ▶ Source of income (entrepreneurial activity, savings, labor)
    - ▶ Labor income risk
    - ▶ Heterogeneous returns
- ▶ Individual problem has 6 states variables (11 million combinations)

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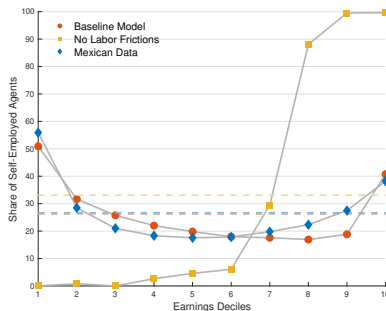
- ▶ What is behind the (aggregate) trend of concentration in the U.S?
  - ▶ Look at competition in individual markets
- ▶ Why is self-employment so much higher in developing countries? (JME)
  - ▶ Who are the self-employed? Why does it matter?
  - ▶ Look at the self-employed across the earnings distribution

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1. Look at pattern in micro-data
2. Contrast model result
3. Understand mechanisms



# Course objectives

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## What I get out of the course:

1. I am going to learn Julia with you
2. Hopefully convert some of you to the true faith

# (Tentative) Course outline

1. Basic tools (version control + coding best practices + basic code)



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2. The Neo-Classical growth model

- 
- ▶ Most tools can be learned here
  - ▶ Starting point for many models
- 

- 2.1 Value function iteration (and how to speed it)
- 2.2 Continuous choice / First order conditions
- 2.3 The endogenous grid method
- 2.4 Shocks and expectations

# (Tentative) Course outline

1. Basic tools (version control + coding best practices + basic code)
2. The Neo-Classical growth model
3. Adding distortions
  - 3.1  $(k,K)$  models
  - 3.2 Sovereign default models

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1. Basic tools (version control + coding best practices + basic code)
2. The Neo-Classical growth model
3. Adding distortions
4. Heterogeneity
  - 4.1 The Bewley/Hugget/Aiyagari/Imrohoroglu model
  - 4.2 The stationary distribution
  - 4.3 The life cycle heterogeneous agent model

# (Tentative) Course outline

1. Basic tools (version control + coding best practices + basic code)
2. The Neo-Classical growth model
3. Adding distortions
4. Heterogeneity
5. Extensions
  - 5.1 Discrete choice (Occupational choice problems/Retirement)
  - 5.2 Transition out of steady state

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1. Basic tools (version control + coding best practices + basic code)
2. The Neo-Classical growth model
3. Adding distortions
4. Heterogeneity
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6. Some topics
  - 6.1 Cross-Sectional moments for macroeconomics
  - 6.2 Modeling at the frontier

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1. Basic tools (version control + coding best practices + basic code)
2. The Neo-Classical growth model
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4. Heterogeneity
5. Extensions
6. Some topics
7. Further topics TBD
  - 7.1 Computing moments from model output
  - 7.2 Search
  - 7.3 Aggregate shocks

# Course mechanics

- ▶ Weekly topic covered in lecture
  - ▶ 3 hours with break in the middle
- ▶ Weekly problem set
  - ▶ Problem sets to be done individually
  - ▶ Submit solution via a public (github) repository
  - ▶ Readme file, ready-to-execute file, pdf if necessary
- ▶ All grade comes from problem sets
  - ▶ You get to drop two

# Version Control: Git

Slides by Dominic Smith



# What is version control?

- ▶ Software that keep track of changes to files
- ▶ Store history of all changes done to code/figures/output
- ▶ The language that lets you keep track of this changes is called **Git**
- ▶ We will only deal with the (very) basics of version control
  - ▶ Basic Git commands
- ▶ All projects benefit from version control. We will use it in all assignments.

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- ▶ You always need backups of your code and results
- ▶ You often need to share your code with others and collaborate
- ▶ Git is better than alternatives:
  - ▶ Renaming files or creating new folders

# Benefits of Git

- ▶ Git only tracks the changes (differences between files)
  - ▶ Only saves files when they change (no overhead)
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- ▶ When collaborating

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  - ▶ Link your local repository to an online repository (github, bitbucket)
  - ▶ Other people can link to the same online repository
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  - ▶ Collaborate by submitting your local changes to the online repository
- ▶ Online repository is also a backup for your code

# Version control in this course

- ▶ All assignments should be available on a git repository
- ▶ You must create the repository and maintain it
- ▶ Upload problem sets to the repository
- ▶ Problem sets are individual, but if you choose to collaborate do it with Git (and let me know)

# Install Git (if you don't have it)

- ▶ Go to <https://git-scm.com/>
  - ▶ Can use getting started tutorial there
  - ▶ Atlassian also has useful information:  
<https://www.atlassian.com/git/tutorials>
  - ▶ Github also has tutorials
- ▶ GIT comes with a GUI (graphical user interface) and command line
  - ▶ Things are faster with command line

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Now you can always go back to this exact version of your files

# What to do now?

Assume we just committed files

1. Modify some number of files, potentially adding new ones
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Two main reasons to modify files:

1. Added a new feature
2. Fixed a bug

You want it to be clear which code fixed bug and which added feature

- ▶ Use messages to inform of what happened
  - ▶ **git commit -a -m** “added program to fix bug”
  - ▶ **git commit -a -m** “changed program to add new feature”

# Help! I'm stuck in VI/VIM

If you don't type `-m` after `git commit` you get in trouble!

- ▶ You get thrown into the default text editor, often VI/VIM
- ▶ These are archaic and moody editors...

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Here is what to do:

1. Type ESC then `:qw` and hit return
2. You'll need to commit again
3. Alternatively you can learn VIM, but that is a lot of work

## “Advanced” commands

- ▶ **git clone**: Useful to start a new project using an old repository, also good to link to an online repository
- ▶ **git pull/push**: Useful to communicate with your online repository, pull a new version from it, push a new version to it
- ▶ **git branch**: Creates a copy of your repository and tracks changes to it separately
  - ▶ Type **git branch Branch\_Name** to create branch
  - ▶ Type **git checkout Branch\_Name** to move to the branch
  - ▶ This is the most useful command to keep track of alternative versions of your code
- ▶ **git merge**: Merges two branches, useful when done experimenting
- ▶ **git reset –hard HEAD**: Returns your repository to its last commit, useful for undoing catastrophic mistakes



# Best Practices

1. Breaking up code
2. Readme files
3. Start small
4. Time your code
5. No parallelization

# Breaking up code (1/5)

Having all your code in the same script is a bad idea

- ▶ Worse: It looks like a good idea at the time
- ▶ Your future self will regret it
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# Breaking up code (1/5)

## Having all your code in the same script is a bad idea

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## Why break scripts up?

- ▶ Easy to edit (less lines/script, know what is in script)
- ▶ Easy to track changes (most scripts left untouched)
- ▶ Easy to reuse (across projects, across model versions)

# Breaking up code: Three ways to do it (2/5)

1. Load lines of code from another script
2. Functions
3. Modules

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1. Load lines of code from another script
  - ▶ Useful for portions of code that are repeated often
  - ▶ Also useful for separating portions of code that are different
    - ▶ Solving model vs Graphing solution vs Saving results
  - ▶ No need to pass variables
  - ▶ Uses same workspace as the “main” script
2. Functions
3. Modules

# Breaking up code: Three ways to do it (2/5)

1. Load lines of code from another script
2. Functions
  - ▶ Useful for portions of code that (kind of) repeat themselves...  
Perform the same tasks but use different variables
  - ▶ Need to have (more) defined inputs/outputs (private scope)
3. Modules

# Breaking up code: Three ways to do it (2/5)

1. Load lines of code from another script
2. Functions
3. Modules
  - ▶ Basically groups of functions

## Breaking up code: Breaking up is so hard to do (3/5)

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  - ▶ My wealth taxation code has 7 modules
  - ▶ Module on model solution has 7500+ lines, 51 functions

## Breaking up code: Breaking up is so hard to do (3/5)

- ▶ Most code starts as a simple problem (no need to break up)
- ▶ But they grow so fast!
  - ▶ My wealth taxation code has 7 modules
  - ▶ Module on model solution has 7500+ lines, 51 functions
- ▶ Not ex-ante clear where one module should end or another start
- ▶ Not always clear where to place functions

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- ▶ Two options
  1.  $c[i] = Y(a[i], n[i])$ , where  $Y(x, z) = (1+r)*x + w*z$  is a function
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  2.  $c[i] = (1+r)*a[i] + w*n[i]$
- ▶ First option makes it easy to change income
  - ▶ Only have to do it in one place (function definition)
- ▶ Second option avoids calling function  $Y$  millions of times...

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  - ▶ Parameter values
  - ▶ Initialization (set up grids, transition matrices, etc)
  - ▶ Model Solution
  - ▶ Model Simulation
  - ▶ Model Results (compute stats, save results)
  - ▶ Graphs



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  - ▶ Graphs
- ▶ Functions for:
  - ▶ Everything that you write three times!

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# Readme files

- ▶ Always have one!
  - ▶ I learned this one the hard way... So much code I have no idea what it does
- ▶ Easy to do:
  - ▶ “The code in this folder solves X model.”

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**Bonus:** You often know the answer in smaller models

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- ▶ Valuable information for scaling up code
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  - ▶ Use often, "no" overhead, fast iteration
- ▶ Rich man's timing:
  - ▶ Profile (both Matlab and Julia)
  - ▶ Use sparingly, less manageable as code grows

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Message applies to other forms of code optimization:

- ▶ First have your code working, then make it fast

# Julia/Matlab

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**Key:** You won't get to choose Matlab if you are doing large scale models

# Installation

## Matlab

- ▶ <https://wts.uwo.ca/sitelicense/matlab/>

## Julia

- ▶ <https://juliacomputing.com/products/juliapro.html>
  - ▶ Choose current stable release
  - ▶ Download Visual Studio Code and link Julia
- ▶ Install plots package: `import Pkg; Pkg.add("Plots")`

# Resources

- ▶ Julia's manual (actually very readable): <https://docs.julialang.org/en/v1/>
- ▶ Best allies: Google + StackOverflow + JuliaDiscourse
- ▶ QuantEcon: <https://julia.quantecon.org>
- ▶ Share what you find!

# Appendix

# Appendix Slides

- ▶ Nothing yet...