# Dynamic Documents with Jupyter Notebooks

# Before We Begin

- Special thanks to Oscar Barriga Cabanillas for helping out today
- Thank you for BITSS for organizing
- How has it been so far?
- A Question:
  - How familiar are you with python? Jupyter?
  - What are you thinking of getting out of this talk?

# How to watch this presentation:

- Either:
  - git clone the repository
  - Start up jupyter lab
  - open presentation.ipynb
  - follow along
- Or:
  - Go to the repository and press the Launch Binder Button
  - To be explained later.

# Why Dynamic Documents?

Dynamic Documents are a part of the bigger picture of Reproducible Science. Sure, there is a fixed cost; **BUT**, they make my life easier in these ways:

- Short term: Easier to document fresh out of the oven results
- Medium term: Fast, reliable and tractable new results
- Long term: You can see how everything was created

# What are Dynamic Documents?

Based on principles of literate programming, we aim at combining code and paper in one single document

- Best framework to achieve the holy grail of one-click reproducible workflow
- Best two current implementations: RMarkdown (R) & Jupyter (Python).
- Stata is catching up: We will come back to this in a second

## The State of Things Now

Currently, the code and the narrative components live in separate universes

## Part of Larger Workflow

- Dynamic documents are best used as part of a larger organized workflow
  - Structuring folders: Data, analysis, output
  - Documenting code
  - Combining both into a final document: Pre analysis or final paper

# Markdown's Entrance

- In terms of writing the "paper"/documentation part of dynamic documents, there are many solutions
   Latex, HTML, RST (ReStructured Text)
- But most have honed in on using Markdown
  - Markdown is an easy way to write formatted text in a plain text format
  - But without as verbose and difficult of a syntax like latex/HTML
- Although basic markdown has the basics for formatting, creating tables, adding figures
- We will use Pandoc, which is used in both the Stata and R sessions

# Markdown Cheatsheet

There are loads of markdown cheatsheats on the web. One can be found here

# Headings

```
Title -> # Title
Section -> ## Section
Subsection -> ### Subsection
Subsubsubsection -> #### Subsubsubsection
```

#### Lists

- My list
  - an *italic* and **bold** nested list
- My List
  - an \*italic\* and \*\*bold\*\* nested list

## Math

We assume that comparative advantage is  $\alpha$  and  $\alpha = \beta + \gamma$ 

We assume that comparative advantage is \$\alpha\$ and \$\alpha = \beta + \gamma\$

$$y_{it} = X_{it}\beta + \varepsilon_{it}$$
$$X_{it} = Z_{it}\gamma + \nu_{it}$$

```
$$\begin{aligned}
y_{it} = X_{it}\beta + \varepsilon_{it} \\
X_{it} = Z_{it}\gamma + \nu_{it}
\end{aligned}$$
```

# What is Pandoc?

- Pandoc is sort of what it says: pan (all), doc (document)
- It's a way to convert between and across different file formats
  - Word -> HTML
  - Latex -> Markdown
  - HTML -> XML
  - Anything to anything
- See Pandoc's website for all input and output filetypes

# The Magic of Pandoc

- Pandoc and Markdown allows you to create one file that can then be used in many different places
- Example:
  - You're writing your CV and want to put it up in various places.
  - Your website needs HTML
  - One job posting allows PDF
  - One job posting only allows Word
- Ordinarily, you would need to have three versions, Word, HTML, PDF
  - This might get unruly as you change one but forget to change the other
  - What if there's another file format you might need?
- With Pandoc and markdown, you would:
  - write your CV in markdown
  - convert to PDF, Word and PDF with pandoc

# What are Jupyter Notebooks?

- A way to do literate programming and dynamic documents
- Provide code and writing/analysis, on a language agnostic platform
  - Meaning that it is not restricted to just one language
  - Currently there are so-called kernels for many languages
  - Including Stata, Python, R, C, Golang, C++, Fortran and more coming!
- Uses the power of Markdown/Latex Math and Code to tell a story and provide an efficient workflow
- Convert into several different formats including Latex, HTML, Presentations etc...
- The Jupyter server is also available in other text editors such as Atom and VS Code.
- And now available in STATA!

## Under the Hood

- You can think of Jupyter as broadly being made up of two parts:
  - A JSON document that organizes text between markdown, code, figures, widgets, etc...
  - A server that loads a "kernel" with a particular language and knows how to translate the markdown to formatted text and the code to execution
  - A web interface (although not required)

# Why Jupyter Notebooks?

- Jupyter is ubiquitous
- Jupyter is used by basically all of the data science community
- Jupyter is used by other software (VS Code, Atom/Hydrogen)
- Since Jupyter is a JSON document and built using web tools, anything that uses webtools can use it
- Science and publishing is changing (PDFs are becoming old, open access and web journals are becoming more popular)
  - Present results in a dynamic way
  - Interactive
  - More efficient to show quick interactive widget to experiment with colleagues/advisors than 50 figures in a static PDF

#### Extensions

JupyterLab (the web interface) comes with many extensions for anything you might want:

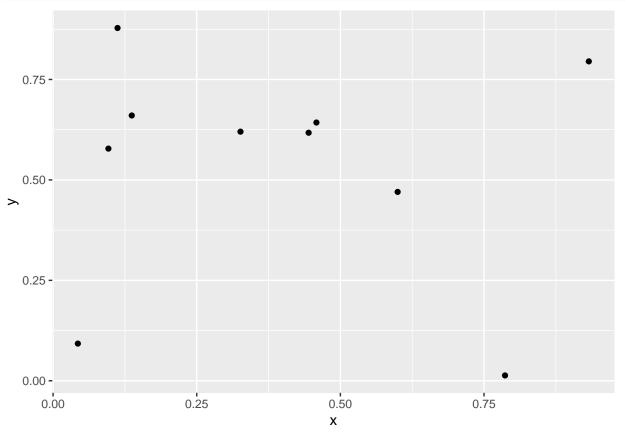
- A language server
- multicursor support
- git integration
- and more...

# Running Code

```
x = runif(10)
treat = as.integer(x > .2)
y = runif(10)
df <- data.frame(y,x,treat)</pre>
df
                          x treat
##
## 1 0.87805127 0.11219245
## 2 0.47013845 0.59966248
                                1
## 3 0.79501093 0.93237279
                                1
## 4 0.57786800 0.09628145
                                0
## 5 0.62008621 0.32616692
                                1
## 6 0.64284423 0.45829637
## 7 0.09260582 0.04312246
                                0
## 8 0.66039666 0.13696395
                                0
## 9 0.61743353 0.44478960
                                1
## 10 0.01334338 0.78652827
```

# **Figures**

```
library(ggplot2)
ggplot(df, aes(x = x, y=y)) + geom_point()
```



## library(stargazer)

##

## Please cite as:

## Hlavac, Marek (2018). stargazer: Well-Formatted Regression and Summary Statistics Tables.

## R package version 5.2.2. https://CRAN.R-project.org/package=stargazer

```
mod <- lm("y ~ treat + x")
```

stargazer(mod)

% Table created by stargazer v.5.2.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu

% Date and time: Thu, Dec 09, 2021 - 04:15:07 PM

Table 1:

	$Dependent\ variable:$
	NA
treat	0.027
	(0.363)
x	-0.107
	(0.608)
Constant	0.563**
	(0.168)
Observations	10
$\mathbb{R}^2$	0.007
Adjusted R <sup>2</sup>	-0.277
Residual Std. Error	0.315 (df = 7)
F Statistic	0.023  (df = 2; 7)
Note:	*p<0.1; **p<0.05; ***p<0.01

## Exporting

 $\bullet$  Exporting to HTML, PDF and slides is possible through the menu: File -> Export Notebook as -> PDF

# Binder and Hosting Notebooks

- Jupyter is great and all, but what if you advisor/boss doesn't have Jupyter installed?
- What if they do, but they don't have all the dependencies needed for your cool dashboard?
- That's where binder comes in
- Binder uses docker to create a containerized version of your notebook with all dependencies installed and anyone can access it even if they don't have jupyter installed at all.
- They just need a web browser
- We've already seen how this works, either with the dashboard or with this very presentation!
- All you need is a public github repository and notebook in that repository and that's it!
- Waiting time for spinning up the notebook will vary
- While it's spinning it up, any questions so far?

# Port-forwarding and setting up Jupyter to work on a server

- Many people might have servers in their universities/organizations that are more powerful than a laptop.
- Jupyter allows the ability to run a notebook locally (on your laptop screen), but using the power of the server.
  - This requires jupyter being installed on the server
  - This isn't a difficult thing to do for a sysadmin, so it's worth finding out whether that's possible

#### Setting up jupyter on a server

• The first thing you need to do is log on to the server and start a jupyter instance:

# jupyter notebook --no-browser --port=8888

- This tells the server to start an instance of jupyter, without a browser (we won't need it, nor can a server open up a browser window), in port 8888 (this will be important later)
- For Mac users, you can use ssh to finish the process. Just type: ssh username@host -L 8888:localhost:8888
- Which will forward your computer 8888 port, to the server's 8888 port.
- For Windows, ssh also exists, but you will need to enable it.
  - head to Settings > Apps and click "Manage optional features" under Apps & features.
  - Click Add a Feature, and find OpenSSH
- Then use the same command as for Macs: ssh username@host -L 8888:localhost:8888
- Then go to your browser:
  - localhost:8888 and you should be taken to a Jupyter page and prompted for a token.
  - You can find this token in the window where you started Jupyter on the server
    - \* Copy and paste this token into the prompt, and VOILA!
- Now you have Jupyter running on your computer's browser window, but with the power of the server!

## Taking all this to Pure Text

- One drawback of jupyter (besides dependencies) is the fact that you need to install all of this and use a browser
- Not very good for version control
- Rmd files (used with RMarkdown) are just markdown files with code cells.
  - Great for version control
  - Readble
  - Easy to share and read in its raw form
- Can we do this with Jupyter?
  - Yes! with jupytext

## Shameless self-promotion

• Export notebook to a do-file!

https://github.com/amichuda/jupyter-doexport

# A Stata Equivalent?

- stata-markdown
- dyndoc
- putdocx

• putpdf

# Other Extras not Covered

- jupyter-cache codebraid
- binder and docker