Winter Institute in Data Science and Big Data

Comparative Computing

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Plan

- Python
 - Basics
 - Data structures
 - Application: working with web data
- Comparative computing
 - Python, R, Shell
 - Polyglot programming and computing tools
 - Computing environment
- Containers and cloud computing
 - Operating systems and system dependencies
 - Docker
 - Cloud computing with Code Ocean

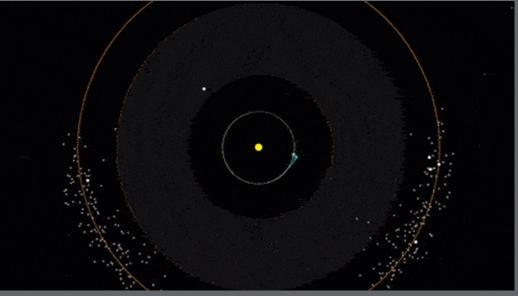
Data Science Toolbox

- Some most used DS tools:
 - Apache Spark
 - BigML
 - D3.js
 - MATLAB
 - Excel
 - tidyverse
 - Tableau
 - Jupyter
 - ggplot2
 - Matplotlib
 - NLTK
 - Scikit-learn
 - TensorFlow
 - Weka
 - ...

Calculating Path to Jupyter Using Excel



we can in a single mission."



Knowing Your Tools

- Recall that data science is an intersection of
 - statistical practice
 - computational tools
 - substantive knowledge
- The interdisciplinary nature of data science
 - Different kinds of statistical practices, computational tools, and substantive focuses
- Goal:
 - Know what you are doing: statistical and substantive knowledge
 - Know how to use your tools
 - Pick up new tools fairly quickly

R vs Python

- Let's forget about Stata.
- Open-source programming language
- High-level, expressive, front-end
 - Both were (partially) written in C
 - Both were Turing complete
 - Fewer lines of code to achieve complex functions
 - Closer to human languages
 - Slow (relatively)
- Vibrant online communities
 - Libraries, support, new things, etc.

R vs Python

• R

- Statistical analysis
- Primarily procedural and functional programming, but can also do OOP
- Academics, researchers, data scientists
- Easier to get started but some rough curves on the way
- Good at data wrangling, exploration, modeling, and visualization
- Can do data scraping, machine learning (deep learning)
 - o caret, tidymodels, keras
- Fewer packages, slow adaptation beyond statistical methods

Python

- General purpose
- Procedural, object-oriented, and functional programming
- Programmers, developers, engineers
- Deeper curve for beginners but smooth, linear later
- Good at data collection, interface with different types of data, machine learning (deep learning)
- Can do data wrangling, modeling, and visualization
 - NumPy, Pandas,
 Seaborn/Matplotlib/Plotly
- Fewer package on modeling (esp. specific models)

R vs Python

- There is *no* programming language wars
- Both can achieve what you want: "Turing complete"
 - Sometimes, one is easier than the other.
- Learn both!
 - Use one when appropriate and to your advantage!

Using Both: Polyglot Programming

- Integrating different languages: wrapper (interface)
- Tools and facilities in programming
 - IDE, code/text editor, interpreter/console
 - Command line and shell
 - Interactive vs non-interactive programming
- Quarto

Wrapper

- Wrapper: interface with other languages
- R interface for python: reticulate
- Python interface for R: rpy2
- R interface for C++: Rcpp
- Python interface for C/C++: Python C-API

Wrapper: Example

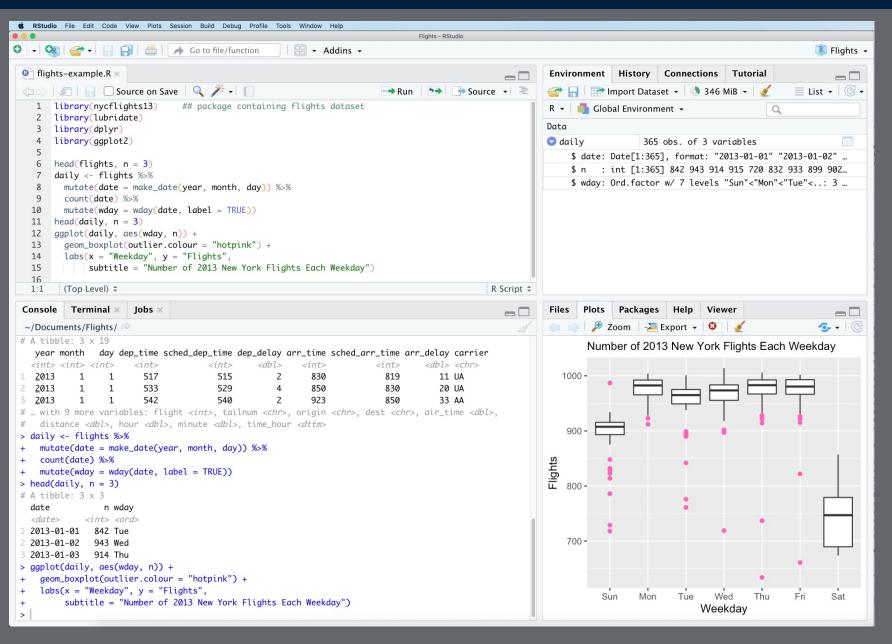
Running Python code in R

```
#install.packages("reticulate")
library(reticulate)
# Specify python location and version
use python("/usr/bin/python3")
# Run one line of python code
py run string("print 'Hello World'")
# Install python library
py install("pandas")
# Use python in R
np <- import("numpy", convert = TRUE)</pre>
np1 \leftarrow np\$array(c(1:4))
np1
# Source python script
source python("somepythoncode.py")
```

Tools

- Integrated Development Environment (IDE)
 - R: RStudio (dominant), but there are others (VSCode)
 - Python: Spyder, PyCharm, VSCode, and lots of others
- What does it mean by *integrated*?
 - Text/code editor
 - Interpreter/console
 - Other tools: Git, debugging tool, file manager, viewer, etc.

RStudio as an example



Command Line Interface (CLI)

- Command line tools
 - Mac/Linux: Terminal
 - Windows: Command Prompt, PowerShell
- Command-line interface (CLI).
 - CLI vs GUI (Graphical User Interface)

R and Python with CLI

Mac/Linux:

```
R
python
python3
```

• Windows

```
# Command Prompt

"C:\Program Files\R\R-4.1.2\bin\R.exe"

"C:\Users\[Your User Name]\anaconda3\python.exe"

# PowerShell
& "C:\Program Files\R\R-4.1.2\bin\R.exe"

# For python, Anaconda Prompt

python
```

Non-Interactive Mode

- Interactive vs non-interactive mode
 - Batch execution
- R: source methods

```
source("script.R")
```

Python

```
exec(open("script.py").read())
```

Non-Interactive Mode using Command Line

Mac/Linux:

```
R CMD BATCH script.R

Rscript script.R

Rscript -e "rnorm(100)"

python script.py

python -c "print('hello world')"
```

Windows

```
# Command Prompt

"C:\Program Files\R\R-4.1.2\bin\R.exe" CMD BATCH script.R

"C:\Program Files\R\R-4.1.2\bin\Rscript.exe" script.R

"C:\Program Files\R\R-4.1.2\bin\Rscript.exe" -e "rnorm(100)"

#### For PowerShell, remember to add &

"C:\Users\[Your User Name]\anaconda3\python.exe" script.py

"C:\Users\[Your User Name]\anaconda3\python.exe" -c "print('hello world')"
```

Shell

- The shell is a user interface for access to an operating system's services.
 - Most often we interact with the shell using a command-line interface (CLI).
- Usage:
 - Batch run
 - Multiple scripts, long running time, etc.
 - Remote machines, cloud computing

Some Commonly Used Commands

- Unique to OS
 - Mac OS (Unix) and Linux (Unix-like) commands are 90% similar
 - Linux is the most common OS for super computer and cloud computing

```
cd [foldername] # change directory
ls # list contents
pwd # print working directory
rm [filename] # remove files
mv [filename] [destination] # move files
cp [filename] [destination] # copy files
mkdir [foldername] # create folder
touch script.py # create file
cat script.py # print file
echo "hello world" # output text
grep [option] [pattern] [files] # search text
man mkdir # getting help
Rscript --help
```

Some Commands for Cloud Computing

• Log on and file transfer

```
ssh [remote user]@[remote machine address]
ssh baole@zorro.american.edu
scp -r ~/Desktop/myfolder baole@zorro.american.edu:~/Documents/
```

Run scripts without hangup

```
nohup R CMD BATCH script.R & screen
```

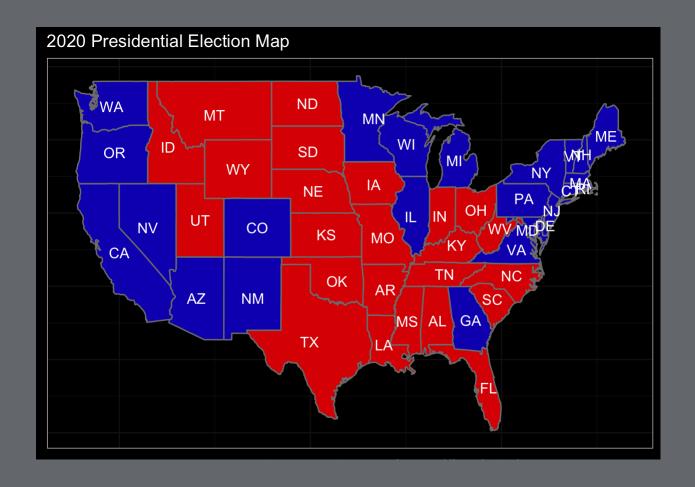
Shell Script

```
#!/bin/sh
# This is a comment!
echo 'Starting ...'
mkdir
python python-script1.py
python python-script2.py
python python-script3.py
R CMD BATCH rscript1.R
nohup R CMD BATCH rscript2.R &
R CMD BATCH rscript3.R
echo 'Finished!'
```

- Try out one aforementioned way to run the following Python and R scripts
 - demo/election-2020.py
 - demo/election-map-2020.R

State	Candidate	Party	Votes	Percent	EC_vote
Alabama	Trump	Republican	1441170	62.0	9
Alabama	Biden	Democrat	849624	36.6	0
Alabama	Jorgensen	Libertarian	25176	1.1	0
Alabama	Write-ins		7312	0.3	0
Alaska	Trump	Republican	189951	52.8	3
Alaska	Biden	Democrat	153778	42.8	0

- Try out one aforementioned way to run the following Python and R scripts
 - demo/election-2020.py
 - demo/election-map-2020.R



• Use Wrapper

```
library(reticulate)
use_python("/usr/bin/python3")
source_python("election-2020.py")
source("election-map-2020.R")
```

Use command line

```
python election-2020.py
Rscript election-map-2020.R
```

Computing Environments

- Hardware
- Software
 - Operating systems
 - System dependencies
 - R/python: versions, packages/libraries

Environment Management in R

- renv: project dependency management
 - Works with R Project

```
install.packages("renv")
```

- Functions:
 - renv::init(): initiate to include all R packages currently used by the project.
 - renv::snapshot():save the state of project dependency.
 - renv::restore(): restore the state of project dependency when it's under a new environment.

Environment Management in R

• Workflow:

- Call renv::init() to initialize a new project-local environment with a private R library,
- Work in the project as normal, installing and removing new R packages as they are needed in the project,
- Call renv::snapshot() to save the state of the project library to the lockfile (called renv.lock),
- Continue working on your project, installing and updating R packages as needed.
- Call renv::snapshot() again to save the state of your project library if your attempts to update R packages were successful, or call renv::restore() to revert to the previous state as encoded in the lockfile if your attempts to update packages introduced some new problems.

Environment Management in Python

venv: virtual environments

```
pip install virtualenv
```

- Workflow:
 - Call python3 -m venv myproj in shell to create a virtual environment
 - Call source myproject/bin/activate to activate the environment
 - Work in the environment, installing and removing libraries as normal
 - Deactivate the environment by calling deactivate

Environment Management in Python

- conda has powerful, built-in environment management
 - Downside: platform specific
- Workflow:
 - Use conda create -n myproj python to create a Python virtual environment (click "y" to proceed).
 - Call conda activate myproj to activate the environment.
 - Work in the environment, installing and removing libraries using condainstall.
 - Call conda env export > environment.yml to save the version info to environment.yml.
 - Call conda deactivate to stop the environment.

- 1. Create a new folder and R project.
- 2. Open R studio and initiate an R environment.
 - renv::init():initiate to include all R packages currently used by the project.
 - renv::snapshot():save the state of project dependency.
 - *renv::restore(): restore the state of project dependency when it's under a new environment.
- 3. Install a new R package: e.g. fortunes, cowsay, etc.
- 4. Use the library in an R script: e.g. library(fortunes); fortune()
- 5. Install and use a older version of an R package: e.g. devtools::install_version("ggplot2", version = "3.3.6", repos = "http://cran.us.r-project.org").
- 6. Create a new R environment snapshop.
- 7. Check out renv. lock file to make sure the versions are correct.
- Note: renv require that you have Rscripts that uses the packages in order to make them recorded in renv.lock

Multilingual Publishing with Quarto

- A open-source scientific and technical publishing system
- Dynamic document with reveal.js
- Next generation of Rmarkdown/Jupyter notebook: Python, R, Julia, Observable, or even language that doesn't exist yet.
- IDE: VS Code, RStudio, Jupyter Lab, etc.

Quarto Demo