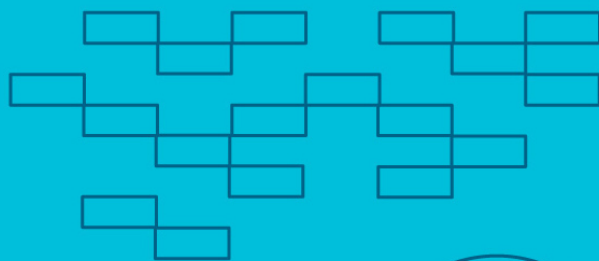




Integrating R & Python into a Data Science program

Tiffany Timbers & Ian Flores Siaca

University of British Columbia



UBC Master of Data Science

FALL SEP - DEC

Block 1 (4 weeks)

- 511 - Programming for Data Science
- 521 - Computing Platforms for Data Science
- 542 - Communication and Argumentation
- 551 - Descriptive Statistics and Probability for Data Science

Block 2 (4 weeks)

- 523 - Data Wrangling
- 531 - Data Visualization I
- 512 - Algorithms and Data Structures
- 552 - Statistical Inference and Computation I

Block 3 (4 weeks)

- 561 - Regression I
- 532 - Data Visualization II
- 571 - Supervised Learning I
- 513 - Databases and Data Retrieval

WINTER JAN - APR

Block 4 (4 weeks)

- 562 - Regression II
- 573 - Feature and Model Selection
- 572 - Supervised Learning II
- 522 - Data Science Workflows

Block 5 (4 weeks)

- 563 - Unsupervised Learning
- 553 - Statistical Inference and Computation II
- 524 - Collaborative Software Development
- 574 - Spatial and Temporal Models

Block 6 (4 weeks)

- 575 - Advanced Machine Learning
- 541 - Privacy, Ethics and Security
- 554 - Experimentation and Causal Inference
- 525 - Web and Cloud Computing

SPRING MAY - JUN

**CAPSTONE
PROJECT**
(8 weeks)

Languages used: R, Python, R & Python

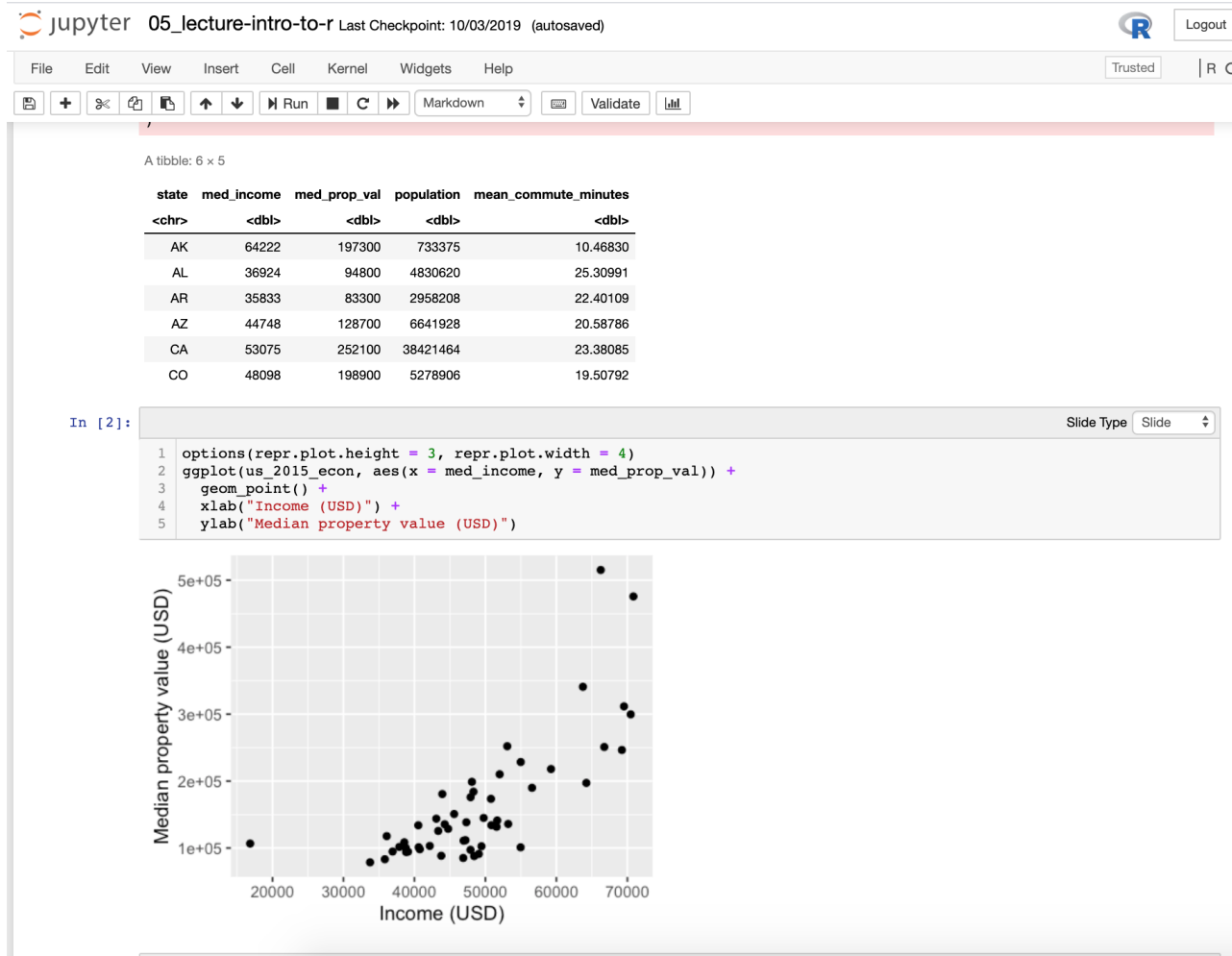
UBC Master of Data Science program

Tools we teach for R & Python harmony

- RStudio
- Jupyter
- knitr & R Markdown
- feather file format
- reticulate
- Make
- Docker
- plotly Dash



Example 1: R in Jupyter!



Example 2: RStudio as a Python IDE!

The screenshot shows the RStudio IDE interface. The top menu bar includes File, Edit, Code, View, Plots, Session, Build, Debug, Profile, Tools, Window, and Help. The status bar at the top indicates the current project is `~/Documents/ubc-mds/DSCI_522_dsci-workflows_students - master - RStudio` and the user is Tiffany Timbers. The left pane shows the file explorer with the following files: `demo.py`, `quick_csv_stat.R`, `quick_csv_stat.py`, and `testing_python.Rmd`. The main editor displays a Python script for calculating the standard error of the fare (ticket price) from the Titanic dataset. The script imports `pandas` and `numpy`, reads the `data/titanic.csv` file, and prints the standard error of the fare. The right pane shows the Environment pane, which is currently empty. The bottom pane shows the Console, which displays the output of the `reticulate::repl_python()` command, indicating that the Python environment is set up correctly and the script is being executed.

```
4 # This script calculates the standard error for the fare (ticket price)
5 # from titanic.csv. This script takes no arguments.
6
7 import pandas as pd
8 import numpy as np
9
10 def main():
11     # read in data
12     data = pd.read_csv("data/titanic.csv")
13
14     # print out the standard error of fare
15     out = sterror(data["fare"])
16     print(out)
17
18 # standard error function
19
```

Console output:

```
~/Documents/ubc-mds/DSCI_522_dsci-workflows_students/
'help.start()' for an HTML browser interface to help.
Type 'q()' to quit R.

> reticulate::repl_python()
Python 3.7.3 (/anaconda3/bin/python)
Reticulate 1.14 REPL -- A Python interpreter in R.
>>> import pandas as pd
>>> import numpy as np
>>> x = np.array([2, 2, 2])
>>> se = x.std()/np.sqrt(x.size)
>>> se
0.0
>>>
```

Name	Size
demo.py	432 B
demo.R	420 B
parameters.Rmd	440 B
quick_csv_stat.py	900 B
quick_csv_stat.R	870 B
testing_python.md	1.4 KB
testing_python.Rmd	1.1 KB
testing_python_files	

Example 3: GNU Make for polyglot automation!

```
Makefile
1 # Tiffany Timbers, Nov 2018
2 # usage: make all
3
4 # run all analysis
5 all: doc/count_report.md
6
7 # make dat
8 results/isles.dat: data/isles.txt src/wordcount.py
9     python src/wordcount.py data/isles.txt results/isles.dat
10 results/abyss.dat: data/abyss.txt src/wordcount.py
11     python src/wordcount.py data/abyss.txt results/abyss.dat
12 results/last.dat: data/last.txt src/wordcount.py
13     python src/wordcount.py data/last.txt results/last.dat
14 results/sierra.dat: data/sierra.txt src/wordcount.py
15     python src/wordcount.py data/sierra.txt results/sierra.dat
16
17 #create plot
18 results/figure/isles.png: results/isles.dat src/plotcount.py
19     python src/plotcount.py results/isles.dat results/figure/isles.png
20 results/figure/abyss.png: results/abyss.dat src/plotcount.py
21     python src/plotcount.py results/abyss.dat results/figure/abyss.png
22 results/figure/last.png: results/last.dat src/plotcount.py
23     python src/plotcount.py results/last.dat results/figure/last.png
24 results/figure/sierra.png: results/sierra.dat src/plotcount.py
25     python src/plotcount.py results/sierra.dat results/figure/sierra.png
26
27 # make count_report
28 doc/count_report.md: doc/count_report.Rmd results/figure/isles.png results/figure/abyss.png results/figure/last.png
29     Rscript -e "rmarkdown::render('doc/count_report.Rmd')"
30
31 #Clean up intermediate files
32 clean:
33     rm -f results/isles.dat
34     rm -f results/abyss.dat
35     rm -f results/last.dat
36     rm -f results/sierra.dat
37     rm -f results/figure/isles.png
38     rm -f results/figure/abyss.png
39     rm -f results/figure/last.png
40     rm -f results/figure/sierra.png
```

Example 4: Docker for polyglot reproducibility!

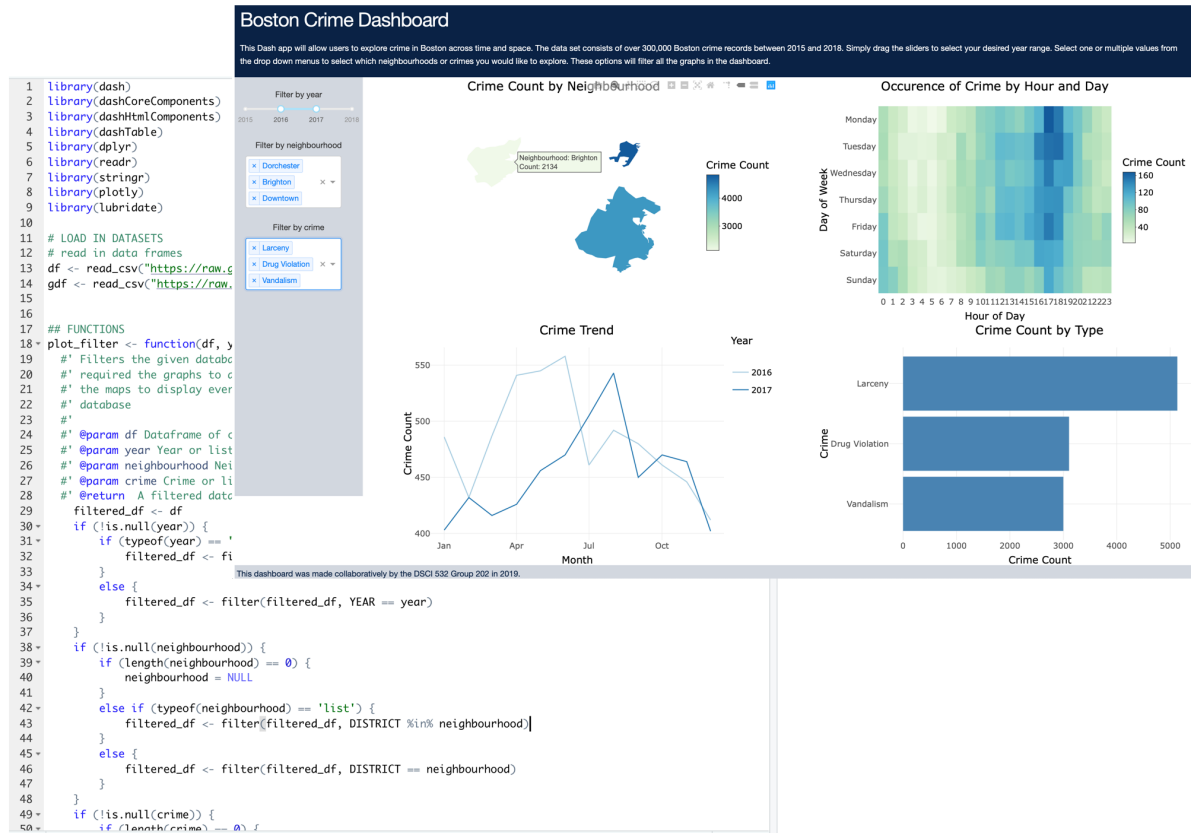
The image shows a Dockerfile and its corresponding Docker Hub repository page. The Dockerfile is a text file with the following content:

```
1 # Docker file for data_analysis_pipeline_eg
2 # Tiffany Timbers, Dec, 2017
3
4 # use rocker/tidyverse as the base image and
5 FROM rocker/tidyverse
6
7 # then install the cowsay package
8 RUN apt-get update -qq && apt-get -y --no-install-recommends install \
9     && install2.r --error \
10     --deps TRUE \
11     cowsay
12
13 # install python 3
14 RUN apt-get update \
15     && apt-get install -y python3-pip python3-dev \
16     && cd /usr/local/bin \
17     && ln -s /usr/bin/python3 python \
18     && pip3 install --upgrade pip
19
20 #
21
22
23
24
25
26
27
28
29
```

The Docker Hub page shows the repository `ttimbers / data_analysis_pipeline_eg`. The description is: "For reproducible analysis. Built from rocker/tidyverse, with ezknitr, Python 3, numpy & matplotlib." The last pushed time is "a year ago". The Docker commands section shows the command to push a new tag to the repository:

```
docker push
ttimbers/data_analysis_pipeline_eg:tagname
```

Example 5: Dashboards in R with plotly Dash!



Pedagogical challenges (and solutions!) for teaching both R & Python

Problem 1: Mixed proficiencies of previous R & Python programming skills between students

Solution 1: Optional questions to challenge more advanced students, and extra practice questions with feedback to support novices.

Pedagogical challenges (and solutions!) for teaching both R & Python

Problem 2: Dual task interference

Solution 2: Learning outcomes in the program include comparing and contrasting the differences between the languages (i.e., we spend a lot of time teaching and assessing whether the students know this).

Pedagogical challenges (and solutions!) for teaching both R & Python

Problem 3: Memory decay during breaks in practice

Solution 3: All blocks in the program have courses that require students to use R & Python

Take homes:

Tips for integrating R & Python into a Data Science program:

- Carefully choose tools that work well with both languages, and skip the ones that don't.
- Expect students to have a heterogeneous knowledge base that may differ between languages, and design exercises to address this.
- Teach the R'isms and the Python'isms and have the students compare and contrast them. Also, asses them on this!
- Structure the program so students repeatedly practice both languages, avoid gaps in one language if possible!

Thanks!

UBC MDS public resources: <https://github.com/UBC-MDS/public>