

# Using Cloud Computing Resources for Big Data and Code Reproducibility

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Code Ocean

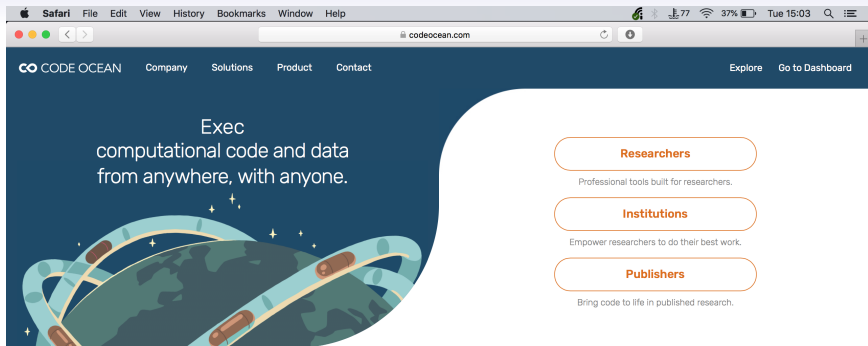
**Winter Institute in Data Science and Big Data**

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9 January 2020



AMERICAN UNIVERSITY  
WASHINGTON, DC



## Code Ocean is a research collaboration platform.

We support researchers from the beginning of a project through publication. With direct access to cloud computing and reproducibility best practices built in, no extra software or hardware is needed.



# What is a capsule?

- Code + (optional) Data + Computational environment = The minimum required for computational reproducibility
- At the core of the capsule: Docker image
- Potential to revolutionize data reproduction and replication

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# What is a capsule?

- Code?
- Data?
- Computational environment?

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codeocean.com/capsule/5973175/tree

CO Private Untitled Capsule Jan 7, 2020 03:25

Capsule File Edit View Tabs Settings Help

Launch Cloud Workstation Collaborate

Files

Core Files

- metadata 91 B
- environment 0 B
- code 0 B
- data Manage Datasets 0 B

Results

Other Files

Upload

or

Start with Sample Files

Commands

results

Your files will appear in the timeline.

Other Files

environment

## Environment

### Starter Environments

We've assembled some common languages and frameworks to get you up and running quickly. You can further customize these environments with multiple languages and additional packages in the next step.

Filter...

By Language:

Python (3.7.3, miniconda 4.7.10)

conda makes this environment a great starting point for installing other languages.  
Ubuntu 18.04 Python

3 more versions >

Python with GPU support (3.7.3, miniconda 4.7.10)

Includes CUDA 10.1 and cuDNN 7 support, conda makes this a great starting point for installing deep learning frameworks and other languages (including Python 2.7).  
Ubuntu 18.04 Python GPU

1 more version >

R (3.5.3)

R is a language and environment for statistical computing and graphics  
Ubuntu 18.04 R

2 more versions >

MATLAB (2019a)

Includes a host of pre-installed toolboxes  
Ubuntu 18.04 MATLAB

4 more versions >

Ubuntu Linux (18.04.3)

Reproducibility

Reproducible Run

Timeline

You have 1 uncommitted change

Describe what changed:

Added metadata.yml

Commit Changes

jan 7, 2020  
Created capsule

# Computational environment

- Base environment
  - ▶ Operating system
  - ▶ Programming language
- Packages/Dependencies

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codeocean.com/capsule/6262297/tree

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Files

Core Files

- metadata 91 B
- environment 178 B
- code 0 B
- data Manage Datasets 0 B

Results

Other Files

Commands

Tabs

results

Your files will appear in the timeline.

Upload

or

Start with Sample Files

environment

## Environment

**R (3.5.3)** [Change](#)

R is a language and environment for statistical computing and graphics  
Ubuntu 18.04 R

## Additional Packages

Customize the selected environment with any other packages you need. You can also use these package managers to install other package managers, such as for different languages. [Learn more](#).

Package Managers	Packages
apt-get	<a href="#">+ Add</a>
R (CRAN)	<a href="#">ggplot2 3.2.1 X</a> <a href="#">magrittr 1.5 X</a> <a href="#">tidyverse 1.2.1 X</a> <a href="#">+ Add</a>
R (GitHub)	<a href="#">+ Add</a>
Bioconductor	<a href="#">+ Add</a>

## Post-Install Script

If a package isn't available via the above package managers, use this script to download, extract and install it. Please note: this script should not be used to download data and cannot access any capsule folders. [Learn more](#).

[Edit Post-Install Script](#)

Reproducibility

Reproducible Run

Timeline

You have 2 uncommitted changes

Describe what changed:

Added Dockerfile, metadata.yml

[Commit Changes](#)

jan 7, 2020

Created capsule



## Example: Actual capsule

# Exercises

On our GitHub repository: 08-03-cloud-authors\_how\_to.pdf

- ① Create a Code Ocean account at <https://codeocean.com>
- ② Create a new capsule
- ③ Add R as the base environment
- ④ Add packages along with their specific versions
- ⑤ Upload data
- ⑥ Upload one .R file
  - ▶ The file should read in the data
  - ▶ The file should create and save one plot with ggplot2
- ⑦ Create a run script for the uploaded .R file
- ⑧ Upload a very rudimentary Readme file
- ⑨ Commit the changes
- ⑩ Execute one successful reproducible run

## Extra exercises

- Add Python 3 to your R base environment via `apt-get`
- Include a full log of the files in `run`
- Save your plot to the subfolder `/figures`
- Create another new capsule by importing your Git repository