# Reproducibility, Preservation, and Access to Research with ReproZip and ReproServer

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Slides: osf.io/4uc3p

# Reproducibility....



# As all things, reproducibility is defined as a spectrum

Reviewable Research: Sufficient detail for peer review & assessment.

Replicable Research: Tools are available to duplicate the author's results using their data. Confirmable Research: Main conclusions can be attained independently without author's software.

Auditable Research: Process & tools archived such that it can be defended later if necessary.

Open/Reproducible Research: Auditable research made openly available

Article **Documentation** Code Data Environment

Stodden et al ICERM report (2013)

# ReproZip tries to solve...

# Workload & Time Challenges

It is a time commitment to get data and code ready to share, and to share it

Otherwise known as...

#### the Incentive Problem

Reproducibility takes time, and is not always valued by the academic reward structure

"Insufficient time is the main reason why scientists do not make their data and experiment available and reproducible."

Carol Tenopir, Beyond the PDF2 Conference

"77% claim that they do not have time to document and clean up the code."
Victoria Stodden, Survey of the Machine Learning Community – NIPS 2010

# ReproZip tries to solve...

#### **Technical Obsolescence**

Technology changes affect the reproducibility

## Normative Dissonance<sup>1</sup>

Espoused values don't always match practice

Otherwise known as...

# The Pipeline Problem

Reproducibility requires skills that are often not included in most curriculums!

"It would require huge amount of effort to make our code work with the latest versions of these tools." Collberg et al., Repeatability and Benefaction in Computer Systems Research, University of Arizona TR 14-04

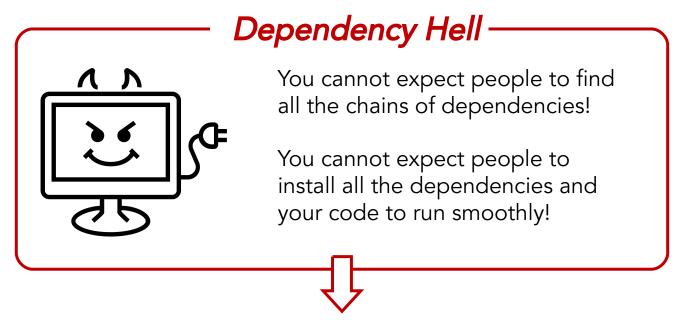
# Even if runnable, results may differ...

The Effects of FreeSurfer Version, Workstation Type, and Macintosh Operating

System Version on Anatomical Volume and Cortical Thickness Measurements

We investigated the effects of data processing variables such as FreeSurfer version (v4.3.1, v4.5.0, and v5.0.0), workstation (Macintosh and Hewlett-Packard), and Macintosh operating system version (OSX 10.5 and OSX 10.6). Significant differences were revealed between FreeSurfer version v5.0.0 and the two earlier versions. [...] About a factor two smaller differences were detected between Macintosh and Hewlett-Packard workstations and between OSX 10.5 and OSX 10.6

# The main problem ReproZip solves



**Gap:** tools that can automatically capture all the dependencies in the original environment <u>and</u> automatically set them up in another environment

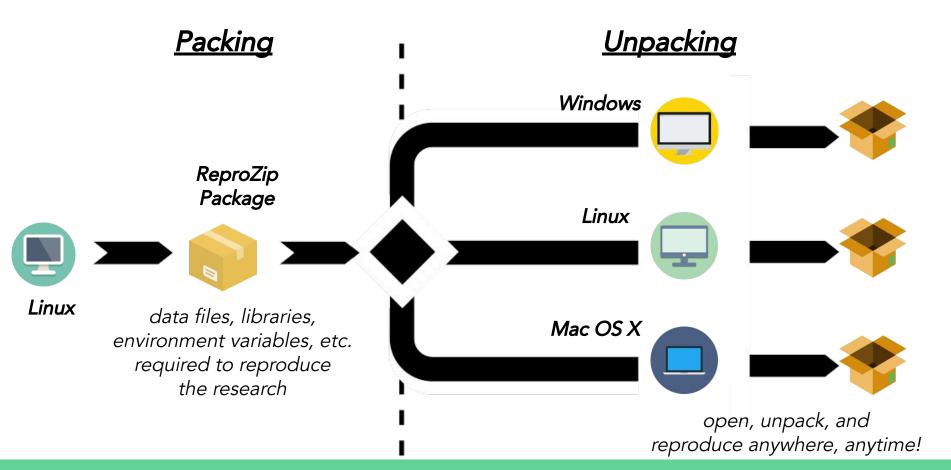
# Reproducibility Packer!

necessary data files, libraries, environment variables, etc. required to reproduce your data analysis

open, unpack, and reproduce anywhere, anytime!



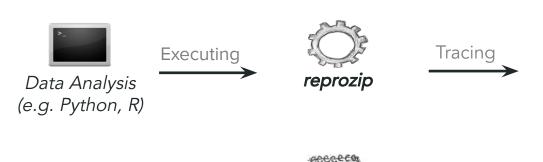
# ReproZip: Reproducibility in 2 Steps







#### Computational Environment *E* (Linux)











#### **Experiment Provenance**

#### **Data**

Input files, output files, parameters

#### Workflow

Executable programs and steps

#### **Environment**

Environment variables, dependencies, ...

# ReproZip can pack:

Current Use Cases:

Data analysis scripts / software (any language, you name it!)

Graphical tools

Interactive tools

Client-server applications (including databases)

Jupyter notebooks

MPI experiments (setting up the experiment can be involved but...)

... and much more!

#### Academic Use Cases

- Recommended by the <u>Information</u>
   <u>Systems Journal</u>, Reproducibility Section
- Recommended by the <u>ACM SIGMOD</u> <u>Reproducibility Review</u>
- Listed on the ACM <u>Artifact Evaluation</u>
   Process Guidelines

#### Outside Project Integration

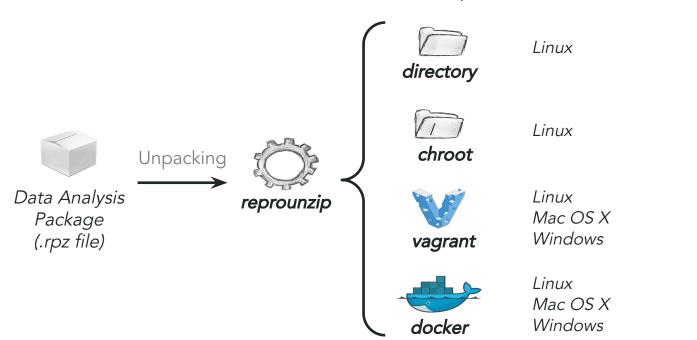
- Integrated as a component of <u>CoRR</u>
- Archiving data journalism apps, e.g.:
   Stacked Up
- Used by <u>neurodocker</u> to build minimal Docker images

... and many more!





Potentially in a different environment / Operating System





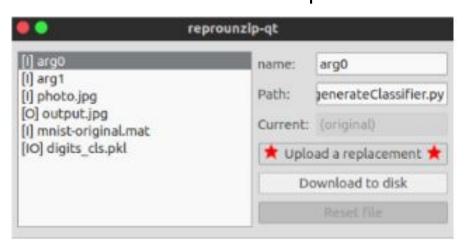


VisTrails



# Users can reproduce and extend the original work

## **Download Outputs**



## **Upload New Inputs**



# Why we think our approach is good for preservation

#### Well-bundled:

• Captures \*everything\* your work touches, which is what it needs to rerun! With lots of \*extremely\* technical metadata!

#### Generalizable:

• The RPZ format is simple but effective and very generalizable. It can interoperate, be read/accessed by, and run with a lot of software

#### Future-proofing:

 We can always add/remove unpackers to give users in the future full access to the bundle. As long as there are VMs, containers, or Linux, we can re-execute the bundle contents

# BUT WAIT!

What if you don't want to download ReproUnzip and Docker or Vagrant??

# ReproServer to the rescue! No preservation w/o access!

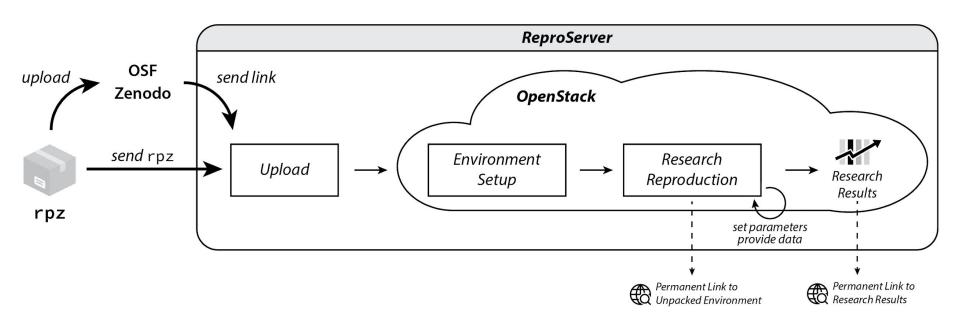


# ReproServer, reproducibility in-browser!

necessary data files, libraries, environment variables, etc. required to reproduce your data analysis



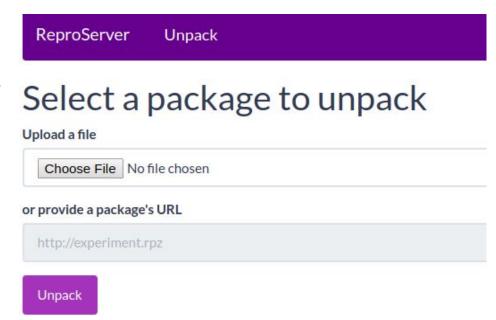
# ReproZip + ReproServer = Access to Reproducible Work!



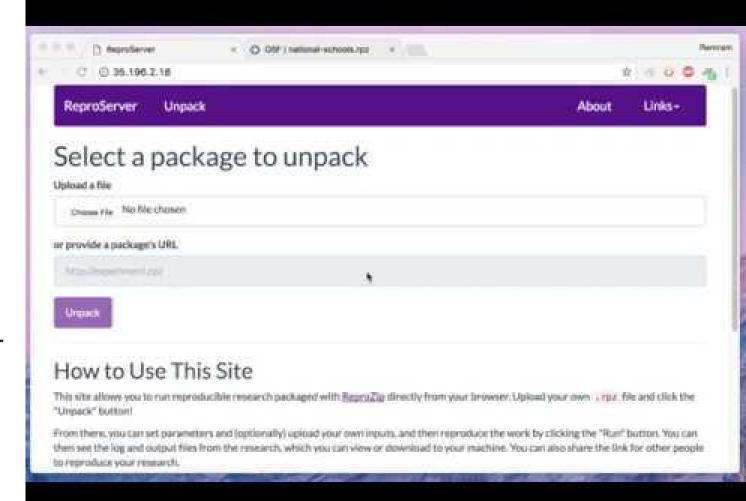
# ReproServer -- simplifying access



- Runs ReproZip packages in the browser, no local software needed
- Allows changing input data & configs
- Gives you a URL to include in papers to reproduce your experiment
- Offloads archiving responsibility to people who are good at it (ayo)
- No lock-in: build on your laptop, pack automatically, reproduce anywhere

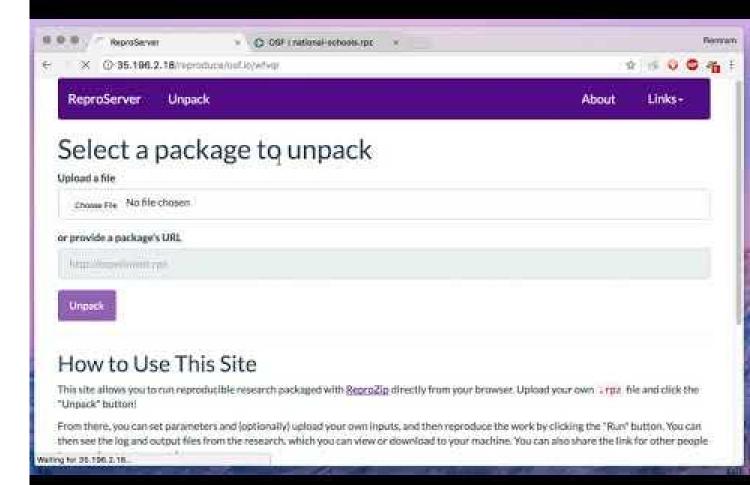


Unpacking local RPZ with ML Scripts from ReproServer



Unpacking
R plots in
RPZ bundle
DIRECT
From the

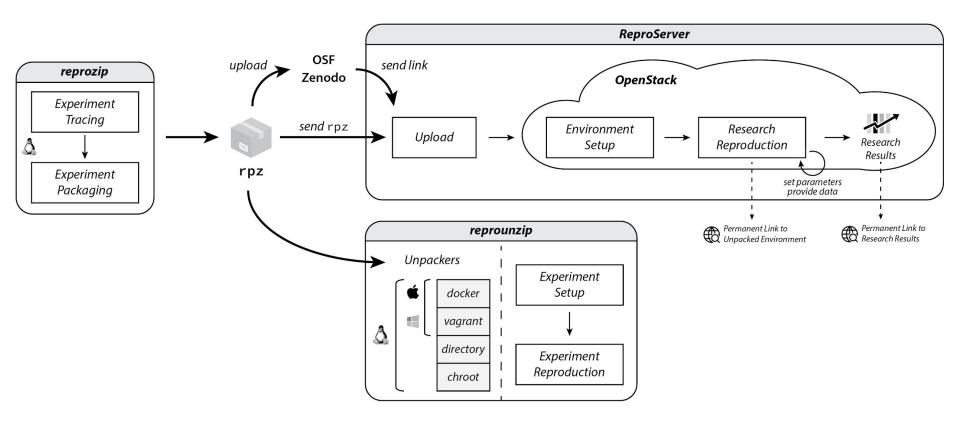
**OSF** 



# ReproZip + ReproServer = Preservation + Access!

- ReproZip provides local, non-locked-in, reproducible packing of research -- easily integrated into existing workflows:)
- ReproServer provides a way for other users to interact with RPZ bundles from the comfort of their browser; easing access, review, and reuse of research materials
  - BONUS: see the work in the original computational environment
  - BONUS: can read in RPZ bundles from wherever they live (no duplicate upload necessary if in a repository)
  - o BONUS: can be run locally at your institution (e.g. don't have to rely on centralized infrastructure not controlled by y'all)

# The full ReproZip-ReproServer Ecosystem



# Other Resources for ReproZip & ReproServer

ReproZip Website:

reprozip.org

ReproZip Examples:

examples.reprozip.org

ReproZip GitHub:

github.com/VIDA-NYU/reprozip

ReproServer GitHub:

github.com/VIDA-NYU/reproserver

ReproZip packing/unpacking: goo.gl/o1Hqrx

Website packing: goo.gl/yMEOZJ

Jupyter notebook packing/replay: goo.gl/NvMHnw

ReproServer demo: goo.gl/Wk7Xnz

ReproServer OSF integration: goo.gl/XfF78z

# Summary:

- ReproZip provides the preservation + reproducible bundle of work from researchers
- ReproServer provides easier access to the materials of ReproZip bundles in-browser
- No preservation w/o access!

# Thank You:

Fernando Chirigati, ReproZip OG dev & team member!

Juliana Freire, ReproZip Pl

Moore & Sloan, for the green

Our users, for their feedback and continued help in dev!