Analysis of Verified Replication Packages from the American Journal for Political Science

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INTRODUCTION

Since 2015, the American Journal for Political Science (AJPS) started to require researchers upload replication materials (code, data, and metadata) that's necessary to reproduce the analytic results and cooperated with Odum institute on the verification process:



INTRODUCTION

 Therefore, it should be more likely to successfully reproduce the analytic results from packages deposited after the implementation of this policy than from packages deposited before the policy.

- Used python to characterize datasets in AJPS Dataverse, including plot generation and identification of verified datasets.
- Then tried to replicate two datasets that contains only R scripts.

First Step: download and characterize

<u>Using Python to:</u>

- Get a list of DOI of all existing datasets in AJPS dataverse through its search API
- Get the metadata of all these datasets through OAI_ORE exporter using DOI list
- Do some analysis on the metadata

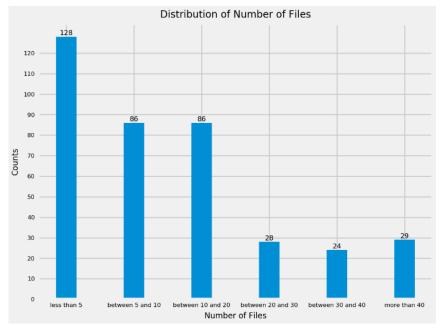
First Step: download and characterize

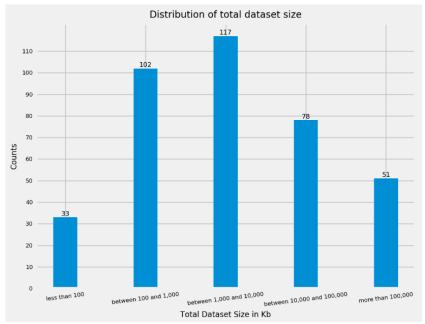
The title, publication date, number of files, total file size, if it contains a codebook, if it have gone through the Odum verification, and the number of script files in different coding language:

4	Α	В	С	D	Е	F	G	Н	1	J	K	L	М	N	0	Р	Q	R	S	Т	U	V	W	X
1	DOI	title	publication_date t	otal_size_kb	num_files o	odebook	verified_note	bash	stata	julia	python	R	С	C++	Matlab	fortran	SAS	Java	SPSS	Mathemati	PHP	Scilab	ArcGIS	code_sum
2	10.7910/DVN/29911	An Empirical Validation St	4/6/2015	826713.75	37 ['validate-	TRUE	(()	0	0	3	0	0	0	0 ()	0	0 0	()	0	0 3
3	10.7910/DVN/QJD1OW	Are Voters More Likely to	5/6/2013	174202.83	2 []	FALSE	(()	0	0	0	0	0	0	0 ()	0	0 0	()	0	0 0
4	10.7910/DVN/26544	Identifying Judicial Empat	6/19/2014	4149.07	3 []	FALSE	0	()	0	0	1	0	0	0	0 ()	0	0 0	()	0	0 1
5	10.7910/DVN/26467	Connecting the Candidate	6/10/2014	8200.94	1 []	FALSE	C	()	0	0	0	0	0	0	0 ()	0	0 0	()	0	0 0
6	10.7910/DVN/H6CUHY	The Power of Partisanship	6/11/2013	760.44	7 []	FALSE	0	()	0	0	2	0	0	0	0 ()	0	0 0	()	0	0 2
7	10.7910/DVN/QQ69RH	Economic Explanations for	10/29/2012	666.18	8 []	FALSE	() :	2	0	0	2	0	0	0	0 ()	0	0 0	()	0	0 4
8	10.7910/DVN/24387	Is the U.S. Supreme Court	1/27/2014	138.57	4 []	FALSE	()	L	0	0	1	0	0	0	0 ()	0	0 0	()	0	0 2
9	10.7910/DVN/27672	Making Young Voters: The	10/24/2014	1210438.38	14 []	FALSE	() :	2	0	0	1	0	0	0	0 ()	0	0 0	()	0	0 3
10	10.7910/DVN/SQNMPH	Fight the Youth: Youth Bul	10/29/2012	908.22	1 []	FALSE	(()	0	0	0	0	0	0	0 ()	0	0 0	()	0	0 0
11	10.7910/DVN/27466	Signaling Alliance Commit	1/27/2015	33458.53	1 []	FALSE	(()	0	0	0	0	0	0	0 ()	0	0 0	()	0	0 0
12	10.7910/DVN/24937	On The Validity Of The Re	3/18/2014	21460.64	4 []	FALSE	0) :	2	0	0	0	0	0	0	0 ()	0	0 0	()	0	0 2
13	10.7910/DVN/27499	Competency Costs in Fore	10/3/2014	423.99	4 []	FALSE	(()	0	0	0	0	0	0	0 ()	0	0 0	()	0	0 0
14	10.7910/DVN/ASBWSA	Activation, Conversion, or	4/15/2013	263.97	3 []	FALSE	((ו	0	0	0	0	0	0	0 ()	0	1 0	(ס	0	0 1
15	10.7910/DVN/AZTWDW	Working Twice as Hard to	4/15/2013	112.86	8 ['DeSante	FALSE	()	L	0	0	1	0	0	0	0 ()	0	0 0	()	0	0 2
16	10.7910/DVN/WZR4UH	Do better monitoring insti	8/27/2013	271.9	1 []	FALSE	(()	0	0	0	0	0	0	0 ()	0	0 0	()	0	0 0
17	10.7910/DVN/UA9G8U	Do Perceptions of Ballot S	2/12/2013	58437.71	5 []	FALSE	(:	2	0	0	0	0	0	0	0 ()	0	0 0	()	0	0 2
18	10.7910/DVN/26867	The Effect of Fact-Checkin	7/31/2014	47.24	1 []	FALSE	0	(ו	0	0	0	0	0	0	0 (ו	0	0 0	(ס	0	0 0
19	10.7910/DVN/PZAOO6	Deep Interactions with MI	7/27/2012	9604.92	2 []	FALSE	(()	0	0	1	0	0	0	0 ()	0	0 0	()	0	0 1
20	10.7910/DVN/26457	No News is News: Non-Igr	6/10/2014	143.03	10 ['UN_code	FALSE	(()	0	0	3	0	0	0	0 ()	0	0 0	()	0	0 3

Second Step: generate some plots

Using the csv file I got from the first step, I drew some plots to get a whole view of the AJPS dataverse, notebook link: https://dashboard.wholetale.org/tale/view/5d406051cc895d0f74354993

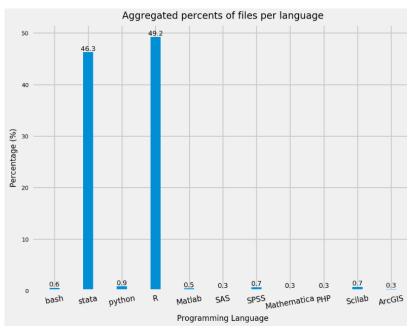


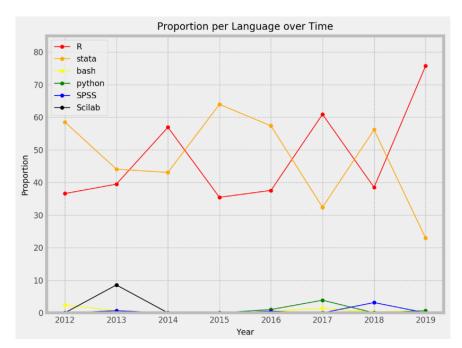


Second Step: generate some plots

Using the csv file I got from the first step, I drew some plots to get a whole view of the AJPS

Dataverse:





Second Step: generate some plots

- Based on the histograms and plots I got from the second step, R and stata are the two most popular coding language in AJPS Dataverse.
- As a result, I decided to compare the verification process of two datasets that contains only
 R files, one of them has gone through the Odum verification and the other has not.

Third Step: identify verified datasets

As mentioned above, the replication policy was adopted by AJPS on March 2015. However, there are also some datasets in AJPS Dataverse that was published later than that date and have not been checked by Odum:



Third Step: identify verified datasets

- In most cases, verified datasets would have corresponding statement in its "Notes" in Metadata, like "This dataset underwent an independent verification process...".
- However, these statements always varies from dataset to dataset:

```
unique_note,count
```

There is no note in this dataset.,98

"This dataset underwent an independent verification process that replicated the tables and figures in the primary article. For the supplementary materials, verification was performed solely for the successful execution of code. The verification process was carried out by the Odum Institute for Research in Social Science at the University of North Carolina at Chapel Hill. \r\n\chr\c/\br\r\nThe associated article has been awarded Open Materials and Open Data Badges. Learn more about the Open Practice Badges from the Center for Open Science.
\chr\c/\br\r\n\r\n",61

"This dataset underwent an independent verification process that replicated the tables and figures in the main article and those included in supplementary materials on which primary findings are contingent. The verification process was carried out by the Odum Institute for Research in Social Science at the University of North Carolina at Chapel Hill.\r\n
br>\r\nThe associated article has been awarded Open Materials and Open Data Badges. Learn more about the Open Practice Badges from the Center for Open Science.
br>\r\n\",29

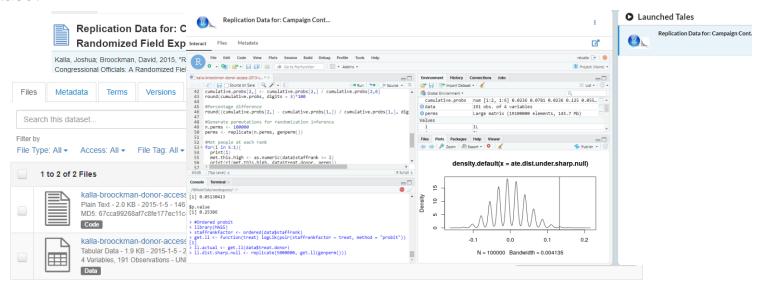
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\shr\s/br\>\r\n\r\n",19

"This dataset underwent an independent verification process that replicated the tables and figures in the primary article. For the supplementary materials, verification was performed solely for the successful execution of code. The verification process was carried out by the Odum Institute for Research in Social Science at the University of North Carolina at Chapel Hill.\r\n\brace\rangle\ran

Third Step: identify verified datasets

- After analyzing all kinds of unique notes, we found that "independent verification" is a
 proper phrase to pick out all verified datasets.
- Used this phrase as judging condition, divided verified datasets and others into two dataframes for further analysis.

The first dataset I verified is "Replication Data for: Campaign Contributions Facilitate Access to Congressional Officials: A Randomized Field Experiment", it was published before March 2015 and has not gone through the Odum verification. There are two files contained in this dataset.



There is a table and two figures in the corresponding article:

TABLE 1 Results: Access Gained in Constituent and Revealed Donor Conditions

Level of Official Group Met	Constituent Condition Frequency	Revealed Donor Condition Frequency	Constituent Condition Cumulative Probability	Revealed Donor Condition Cumulative Probability	p-Value: Revealed Donors More Likely to Gain Access at or above This Rank
Member of Congress	2.4%	7.8%	2.4%	7.8%	p = .07
Chief of Staff	0.0%	4.7%	2.4%	12.5%	p = .006
Legislative Director or Deputy Chief of Staff	3.1%	6.2%	5.5%	18.8%	p = .005
DC-Based Legislative Assistant or Local District Director	25.2%	18.8%	30.7%	37.5%	p = .17
Other District-Based Staffer	12.6%	10.9%	43.3%	48.4%	p = .26
No Meeting	56.7%	51.6%	100%	100%	_

FIGURE 1 Access Gained to Congressional Staffers, by Experimental Condition

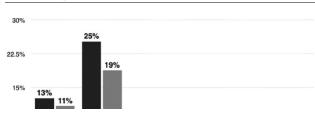
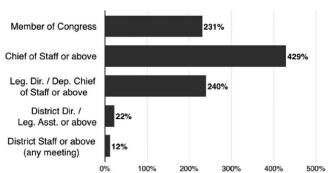


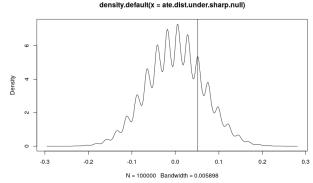
FIGURE 2 Percentage Increase in Access Revealed Donors Gained, at or above Each Level.



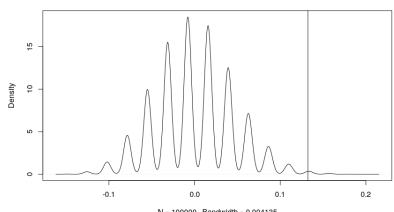
Note: Each bar shows the percent increase in the share of meetings that occurred at or above each level in the Revealed Donor condition relative to the Constituent condition. These can be obtained by comparing the fourth column of 1 to the third column.

Here is the output of the R file in dataset:

```
> round(cumulative.probs, digits = 3)*100
      2.4 2.4 5.5 30.7 43.3 100
      7.8 12.5 18.8 37.5 48.4 100
[1] 5
$ate
                 $ate
[1] 0.05450295
                 [1] 0.06791339
$p.value
[1] 0.07332
                $p.value
                 [1] 0.17004
[1] 4
$ate
                 [1] 1
[1] 0.101378
                 $ate
$p.value
                 [1] 0.05130413
[1] 0.00634
                $p.value
[1] 3
                 [1] 0.25386
$ate
[1] 0.1323819
$p.value
[1] 0.00506
```



density.default(x = ate.dist.under.sharp.null)



N = 100000 Bandwidth = 0.004135

As for the verification report, these problems are all from AJPS data verification checklist:

Curation checklist

Supporting Documentation and Information:

- Does data package include a README file (.txt format) containing the names of all files with a brief description and any other important information regarding how to replicate the findings (i.e., the order files need to be run, etc.)?
 No, this package does not contain a README file.
- 2. Does data package include a Codebook (.pdf format) with variable definitions for all variables in the analysis dataset(s) and value labels for categorical variables?

No, this package does not contain a Codebook.

3. Does data package Includes clear information regarding the software version used to conduct analysis?

No, this package does not mention the specific software version.

4. Does data package include source datasets? If so, does it include complete references for source datasets?

No, the dataset used to generate plots is created by the authors of this paper.

3. Does data package include software command file(s) for reconstructing th analysis dataset from the original data source and/or extracting and mergi multiple original source datasets, including information on source dataset version and access date(s)?

No, the dataset used to generate plots is created by the authors of this paper.

Command Files & Tools:

Does data package include commands needed to reproduce all tables, figured and other analytical results presented in the article and supplementary materials?

No, the output of the R code in the data package does not match with table and figures in the article.

2. Does data package include commands/instructions for installing macros c packages?

Yes, the R code file contains commands for installing packages.

Does data package include comment statements used to explain the analy steps and distinguish commands for tables, figures, and other outputs? Yes, there are brief comment statements before most blocks of the R code.

Legislative offices were then randomly assigned to treatment conditions within each of these 64 blocks, with one office in each block being randomly assigned to the Revealed Donor condition and the other two offices assigned to the Constituent condition. Treatment offices were selected by block—assigning each observation a random number with Stata 12's runiform() function and selecting the office in each block with the lowest random number for the treatment group.

Data curation result: Major issues

Data curation notes:

The data package is lack of codebook and README file.

Replication result: Major issues

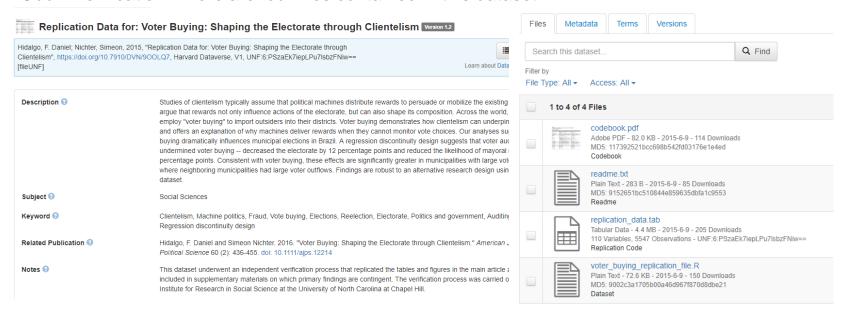
Replicate notes:

Code:

 The output of the R code in the data package does not match with table and figures in the article (Table 1, Figure 1 & 2). Please upload the corresponding R script (and probably stata script) to the data package.

Jackman, and Rivers 2004; Jackman 2013), the number of members of the political organization that resided within 40 miles of the district office where the meeting would be held, and Barack Obama's share of the 2012 two-party presidential vote in the district. Legislative offices were allocated to these blocks using blockTools in R, which seeks to construct the blocking scheme that minimizes the differences between observations within each block as determined by the Mahalanobis distance (Moore and Schnakenberg 2013).

The second dataset I verified is "Replication Data for: Voter Buying: Shaping the Electorate through Clientelism", it was published after March 2015 and has already gone through the Odum verification. There are four files contained in this dataset.



There are seven graphs and three tables in the article, and almost all the R script outputs match with the analytic result in article, which is a huge improvement compared to the last dataset.

Curation checklist

Supporting Documentation and Information:

- Does data package include a README file (.txt format) containing the names of all files with a brief description and any other important information regarding how to replicate the findings (i.e., the order files need to be run, etc.)?
 Yes, this package contains a README file with brief descriptions of all files in it.
- 2. Does data package include a Codebook (.pdf format) with variable definitions for all variables in the analysis dataset(s) and value labels for categorical variables?

Yes, there is a Codebook in the package containing descriptions and primary sources of every variable in the analysis dataset, which is also included in the package.

3. Does data package includes clear information regarding the software version used to conduct analysis?

Yes, the related information is included in the R code file in dataverse.

4. Does data package include source datasets? If so, does it include complete references for source datasets?

Yes, the data in the analysis dataset come from multiple sources, the authors mentioned the data sources in Codebook.

Analysis Dataset(s):

 Does data package include the analysis dataset(s) in a file format readily accessible to the social science research community (i.e., text files, delimited files, Stata files, R files, SAS files, SPSS files, etc.)?

Yes, there is an R data file in the data package, includes the dataset used to generate the graphs and tables in the article.

2. Does data package include a unique case identifier variable linking each observation in the analysis dataset to the original data source?

Yes, the related information is included in the Codebook.

3. Does data package include software command file(s) for reconstructing the analysis dataset from the original data source and/or extracting and merging multiple original source datasets, including information on source dataset(s) version and access date(s)?

No, the dataset used to generate plots and tables is directly given to us in the dataverse.

Command Files & Tools:

1. Does data package include commands needed to reproduce all tables, figures, and other analytical results presented in the article and supplementary materials?

Yes, the output of the R code in the data package matches with the table and figures in the article.

However, there are still some minor problems:

Codebook

"Voter Buying: Shaping the Electorate through Clientelism," *American Journal of Political Science* F. Daniel Hidalgo and Simeon Nichter

Brazil Dataset for RDD ("data")

Variable Name	Description	Pri
above	Above the 80% discontinuity threshold (dummy variable based on "elecpopratio.pct")	Authors' Calculation
average_section_size	Average number of voters per precinct	www.tse.gov.br
branconulo.perpop04	Blank and null votes in 2004 as percentage of 2007 population	www.tse.gov.br; ww
branconulo.perpop08	Blank and null votes in 2008 as percentage of 2007 population	www.tse.gov.br; ww
chall_age	Age of challenger in 2004	www.tse.gov.br
codigo	Municipality code - IBGE (Census Bureau)	www.ipeadata.gov.l
dist.statecap	Distance from state capital (in kilometers)	www.ipeadata.gov.l
donation_diff	Difference in donations received by incumbent and 2nd place challenger in 2004	www.tse.gov.br
elecpopratio	June 2006 Electorate divided by July 2006 population [Note: These dates used by TSE for audit.]	www.tse.gov.br; dat
elecpopratio.pct	June 2006 Electorate divided by July 2006 population (percent) [Note: These dates used by TSE for audit.]	www.tse.gov.br; dat
electorate.june.2006	June 2006 Electorate [Note: Used by TSE for audit.]	www.tse.gov.br
electorate.perpop06	2006 Electorate as a percentage of 2007 population	www.tse.gov.br; ww

Data curation result: Minor issues

Data curation notes:

 The data package is lack of software command file for reconstructing the analysis dataset from the original source datasets.

Replication result: Success with modification

Replicate notes: Table 1 & Figure 1:

Lack of corresponding code to generate these two outputs.

Figure 4a:

- Typo on one parameter: 'xintercept', line 149
- Warning message: "Ignoring unknown parameters: degree", line 142

Figure 4b:

- Typo on one parameter: 'xintercept', line 164
- Warning message: "In comma_format(digits = 10): 'digits' argument is deprecated, use 'accuracy' instead.FALSE"

Figure 6:

Warning message: "Ignoring unknown parameters: degree", line 225

Wrap up

Final Outputs:

- One CSV file, 381 rows 24 columns, contains characteristic information of AJPS datasets.
- One jupyter notebook, showing histograms and plots, giving a whole view of AJPS Dataverse.
- Git repo: https://github.com/jingxianna/ajps-dataset-analysis, containing these two files along with python script and some other outputs (like file extension list).
- Two replication tales in Whole Tale.

THANK YOU! Q & A