Introduction to QAMyData 'health-check' tool for numeric data

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Introductions

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What we will cover today

- 1. The origin of the tool
- 2. What is useful to check for numeric data
- 3. The development of our QAMyData tool
- 4. The tests that are available
- 5. A demo
- 6. Quick techie overview
- 7. Future plans

We will be sharing our slides on our events page:

https://www.ukdataservice.ac.uk/news-and-events/eventsitem/?id=5548



When does data need quality assessing?

Data publishing

- A researcher submitting data to a repository
- A repository for checking quality
- Peer review of published analysis for a journal
- Supporting FAIR Principles

Using data

- A researcher using a new data source
- Preparing data for students learning about quality

When we want data to be healthy and safe





QAMyData Tool

- UK Data Service project to develop a light weight, opensource tool for quality assessment of research data
- A 'data health check' tool that identifies the most common problems in data submitted in disciplines that utilise quantitative methods
- Helps set Data Quality Profiles for data publishers using own default settings





Question

How do you apprise numeric data



Data review

- As data publishers we are aiming to:
 - ✓ Share clean and well documented data
 - ✓ Share data under the right conditions
- Quality issues arise in the data description and data itself
- Datasets to be shared require a Privacy Impact Assessment (e.g. GDPR)
 - Privacy level defines the legal gateway for access



UK Data Service Data Access Policy

Open

 Download/online access under open licence without registration

Safeguarded

 Download/online access: authorised, authenticated and audited users

Controlled

 Remote or safe room access: authorised, authenticated and audited users; projects have been approved users receive specialist training; research outputs are checked

Current ways of checking data

- Getting to know your data:
 - Check structure
 - Look for incorrect, missing, inconsistent values
 - Check for unanticipated/accidental disclosure risk
 - Locate issues and decide how to treat them
 - > Treatment: clean data or flag errors
- Data creators/publishers largely use manual methods:
 - Integrity rules used in data collection
 - Statistical software commands
 - Mostly eyeballing data



How can a tool help?

Flag issues: enable a machine or human to resolve the problems

Be deployed as a service for self deposit repository, e.g.
 DataVerse for a submission health check

Be deployed into data publishing pipelines



Question

Biggest problems encountered with data?



What do you check?

- Do the data values seem correct?
- Do they make sense?
- Check frequency distributions for erroneous outliers
- Check formats of the values entered for a variable
- Check low frequency counts/possible disclosive outliers
- Irritating missing data!



Checking data: example 1

pregnant	sex	age in years	occupation
У	female	29	2018-07-16: 12:37
n	female	15	2018-07-16: 12:38
У	female	32	2018-07-16: 12:39
n	male	37	2018-07-16: 12:40
n	female	-10	2018-07-16: 12:41
n	female	51	2018-07-16: 12:42
n	male	22	2018-07-16: 12:43
n	male	126	2018-07-16: 12:44
n	male	28	2018-07-16: 12:45
у	male	31	2018-07-16: 12:46
n	male	42	2018-07-16: 12:47
У	female	37	2018-07-16: 12:48



Checking data: example 2

T1	m		C	トつ	m	n
LI	111	匸	3	La	111	IJ
•						1

2017-01-22: 10:15

201701241016

2017 01 22 10-17

2017-01-22-1018

2017 01 22 10 19



Checking data: example 3

age	income (£)	education_level	occupation type
40	52,000	postgraduate	professional
34	35,000	A-level	non-professional
25		GCSE	non-professional
30		GCSE	non-professional
28	22,000	GCSE	non-professional
55	37,000	graduate	professional
45		postgraduate	professional
33		A-level	non-professional
41	53,000	postgraduate	professional
43		postgraduate	professional
27	22,500	GCSE	non-professional



Data review: what to look for

- Basic file checks
- Metadata issues
- Data integrity Issues
- Disclosure review and control



Scoping the tests

- In-house procedures for data checking
- Prepared 'dirty' test datasets for evaluation
- Reached out to other archives/data publishers to gather information on their own QA checks
- Feedback from tool use in early training

Basic file checks

File opens

Checks whether acceptable format

Bad filename check, regular expression pattern - RegEx

Regex requires quotes "[a-z]". To use a special characters, e.g. a backslash (\) a backslash before is required e.g. \\



Metadata checks

No label for user defined missing values e.g. - 9

Odd characters in variable names and labels

Spelling mistakes (non-dictionary words) in

Spelling mistakes (non-dictionary words) in value

variable labels using a dictionary file

labels using a dictionary file

Count on grouping variables

Missing variable labels

not labelled

Report on number of cases and variables

Always run

SPSS only

Must be set to true

User specifies the characters

User specifies the characters

User specifies the characters

User specifies the characters

User specifies a dictionary file

User specifies a dictionary file

Odd characters in value names and labels Maximum length of variable labels e.g. > 79 Maximum length of value labels e.g. > 39

Data integrity checks		
Report number of numeric and string variables		
Check for duplicate IDs	User specifies the variables. Multiple variables can be added on new lines e.g. - Caseno - AnotherVariableHere	
Odd characters in string data	User specifies the characters	
% of values missing ('Sys miss' and undefined missing)	User sets the threshold, e.g. more than 25%	
Spelling mistakes (non-dictionary words) in string data using a dictionary file (can check if date format set correctly!)	User specifies a dictionary file	
	III UK Data	

Disclosure checks

Unique values or low thresholds (freqs of categorical vars or minimum values)

User sets the threshold value, e.g. 5

Direct identifiers using RegEx pattern search

User runs separately for postcodes, telephone numbers etc.
Advise tests are separately as may

be resource intensive

Direct identifiers/named entities in string data using a dictionary file

Specify a dictionary file containing lists of stop words or named entities e.g. for places, names etc.
Advise tests are separately as may be resource intensive

Key-identifiers and non-identifying variables (combinations of key variables) – we use and train on sdcMicro



Formats and test selection

- Accepts formats: SPSS, Stata, SAS, CSV
- Modular design: user configures for: data type, threshold

Checks can be commented out or omitted to exclude them from the checks to be run

```
# Variable Configuration

[variable_config.odd_characters]
setting = ["!", "#", " ", "@", "ë", "ç", "ô", "ü"]
desc = "Variable names and labels cannot contain certain 'odd' characters."

[variable_config.missing_variable_labels]
setting = true
desc = "Variables should have a label."

[variable_config.label_max_length]
setting = 79
desc = "Variable labels cannot exceed a max length"
```

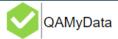


RegEx

Title **Email - Overly Simple** Details Expression ^\w+@[a-zA-Z]+?\.[a-zA-Z]{2,3}\$ **Description** Simple email expression. Doesn't allow numbers in the domain name and doesn't allow for top level domains that are less than 2 or more than 3 letters (which is fine until they allow more). Doesn't handle multiple "." in the domain (joe@abc.co.uk). **Matches** joe@aol.com | ssmith@aspalliance.com | a@b.cc **Non-Matches** joe@123aspx.com | joe@web.info | joe@company.co.uk Author **Steven Smith** Rating:



Reporting



teaching-data%set.sav

Raw Case Count: 10210 Aggregated Case Count: 0

Total Variables: 188

Data Type Occurrences: Numeric: 186, String: 2

Created At: 2019-02-18 13:37:39 Last modified at: 2019-02-18 13:37:39

File Label:

File Format Version: 2

File Encoding: WINDOWS-1252 Compression type: Rows

Basic File Checks

Name	Status (N)	Description
Bad file name	failed (1)	File name should match the user specified pattern

Metadata Checks

Name	Variable odd characters		
Missing variable labels	# (limited to 1000)	Variable	Row number
Variable odd characters	1	OwnTV	ā
Variable label max length	2	V137	

Demo



Software decisions

Use existing open source libraries where possible

- SPSS Java libraries IBM is licenced and difficult to deploy, Dext project
- Stata Java libraries cross-version implementation not good
- R libraries Haven based on Readstat difficult to deploy, server licence, performance
- Python libraries no good stable libraries for statistical packages
- Enter Readstat



Using the ReadStat library

- A command-line tool and C library for reading files from popular stats packages
- Originally developed for Wizard for free stat data analysis on a Mac
- Supports SPSS, Stata and SAS files new & old formats
- In active development since 2012, continually receiving security patches and bug fixes from the open source community
- Currently used by the R library Haven, part of the Tidyverse collection of R packages for data science



RUST programming language

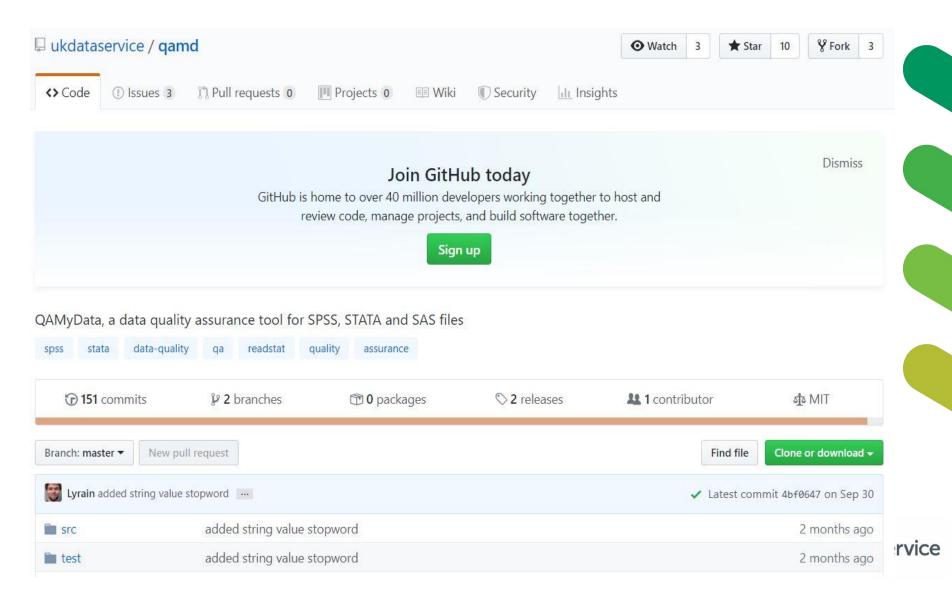
- Tried the following wrappers: Java, Clojure, R, Python
- RUST from the Mozilla Foundation for improving the Firefox browser: an environment that demands things just 'work'
- Performance: Rust generates executables that run very fast, without needing to write low level C code; easily integrates with other languages
- Reliability: enables the developer to eliminate many classes of bugs at compile-time
- Productivity: has great documentation, a friendly compiler with useful error messages, and excellent tooling

Deployment

- Downloadable to run on Linux, Windows, Mac
- Simple to install and deploy from our Github
- Lightweight to run and set tests edit config file
- Wiki with documentation
- Space for suggesting new tests
- Released under a MIT licence
- 2020: Will deploy as a service, prior to ReShare upload



GitHub space



Try it out

Evaluation has been conducted with:

- UKDS data curation staff
- Peer data repositories in our international network
- Data owners, researchers, data managers, quant.
 methods lecturers, journal publishers for data peer review
- More testing by you!

Advocate data publishers to develop a Data Quality Profile with stated thresholds



Resources

- Table of Available Tests
- Download and Run Guide, including step by step for editing config. file, setting own thresholds
- Teaching resources, slides, exercises and test data
- A blog

https://www.ukdataservice.ac.uk/about-us/our-rd/qamydata.aspx

Question

How might you use QAMyData in your own work?



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Keep connected

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Thank you Any questions?

