linkrep: Data Linkage Quality Reports

Documentation

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1 Data Inputs

1.1 main_data

main_data includes the de-identified data from the left dataset as well as a binary or logical variable indicating whether the record linked or not. Missing values in the dataset should be represented by NA. See the How to Format Data for Report section for details on formatting data for desired output.

E.g.,

^	gender Gender	birth_year Birth Year	linked
1	М	1963	1
2	F	2003	0
3	F	1965	1

main_data is used in the creation of the following elements:

Tables:

- Linked data representativeness table
- Linkage rate table

Figures:

• Linkage rate over time bar plot

Values:

- Linkage rate
- Number of records in the left dataset

Why isn't the linkage rates over time plot displaying?

The plot will only display if acquisition year and acquisition month variables are present in main_data and passed to linkage_quality_report through acquisition_year_var and acquisition_month_var

E.g.,

•	gender Gender	birth_year Birth Year	inked	acq_year Acquisition Year	acq_month Acquisition Month
1	М	1963	1	2010	10
2	F	2003	0	2022	3
3	F	1965	1	2015	1

If the plot is still not displaying, the date range is not wide enough to display a meaningful plot (e.g., if acq_year = 2024 and acq_month = 4 for all records, then only one bar can be made in the plot hence, there's no distribution to look at therefore, the plot will never display).

1.2 missing_data_inidcators

missing_data_indicators includes binary or logical missingness indicators for the variables you wish to be displayed in the linked data representativeness table, the linkage rate table and the missingness table.

E.g.,

•	first_name_missing Missing Given Name	last_name_missing Missing Surname	postal_code_missing Missing Postal Code
1	TRUE	FALSE	TRUE
2	FALSE	FALSE	FALSE
3	FALSE	FALSE	TRUE

Naming conventions:

If you have variables listed in your strata_vars that also appear in missing_data_indicators, use one of the following naming conventions for them to be recognized as the same variable:

1. Give them the same variable name suffixed by "_missing"

E.g., main_data:

^(gender ‡	birth_year [‡]	linked [‡]
1	NA	1963	1
2	F	2003	0
3	F	1965	1

missing_data_indicators:

1	gender_missing	first_name_missing	4
1	1	(0
2	0		1
3	0	(0

2. Label them the same

E.g., main_data:

(gender Gender	\$ birth_year	inked
1	NA	1963	1
2	F	2003	0
3	F	1965	1

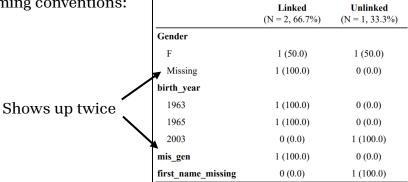
missing_data_indicators:

(mis_gender Gender	first_name_missing	\$
1	1		0
2	0		1
3	0		0

Linkage rate table with naming conventions:

	Linked (N = 2, 66.7%)	Unlinked (N = 1, 33.3%)
Gender		
F	1 (50.0)	1 (50.0)
Missing	1 (100.0)	0 (0.0)
birth_year		
1963	1 (100.0)	0 (0.0)
1965	1 (100.0)	0 (0.0)
2003	0 (0.0)	1 (100.0)
first_name_missing	0 (0.0)	1 (100.0)

Linkage rate table without naming conventions:



Missingness is pulled from the NA values of that variable therefore, the only reason to include the same variable in both **main_data** and **missing_data_indicators** is to display its missingness in the missingness table. To ensure the missingness table is displayed, set the display_missingness_table parameter to TRUE.

missing_data_indicators is used in the creation of the following elements:

Tables:

- Linked data representativeness table
- Linkage rate table

• Missingness table

1.3 algorithm_summary_data

algorithm_summary_data is used in the creation of the following element:

• Algorithm summary table

The data is output exactly as it is received, so format it according to your desired output.

E.g.,

•	blocking_vars Blocking Schema	matching_vars Matching Criteria	linkage_rate Linkage Rate
1	given name, surname	birth year	72.3
2	given name, birth year, birth month	surame, sex	5.5

1.4 performance_measures_data

performance_measures_data is used in the creation of the following elements:

Tables:

• Performance measures table

Figures:

• Performance measures radar chart

The data is output exactly as it is received, so format it according to your desired output.

E.g.,

*	ppv Positive Predictive Value	npv Negative Predictive Value	sensitivity Sensitivity	specificity \$\frac{\pi}{2}\$ Specificity
1	80.7	99	92.4	100

1.5 definitions

definitions includes term definitions for important terms used throughout the report. It should be formatted as a two-column dataset: Term and Definition.

E.g.,	Term	Defintion
	Positive predictive value (PPV)	Proportion of predicted positive matches that are truly positive
	Negative predictive value (NPV)	Proportion of predicted negative matches that are truly negative
	Sensitivity	Proportion of positive matches the algorithm correctly identified
	Specificity	Proportion of negative matches the algorithm correctly identified

1.6 abbreviations

abbreviations includes abbreviations used throughout the report. It should be formatted as a two-column dataset: Abbreviation and Definition.

0.,	Abbreviation	Definition					
	CHI	George & Fay Yee Centre for Healthcare Innovation					
	MCHP	Manitoba Centre for Healthcare Policy					
	MH	Manitoba Health					
	PHIN	Personal Health Identification Number					

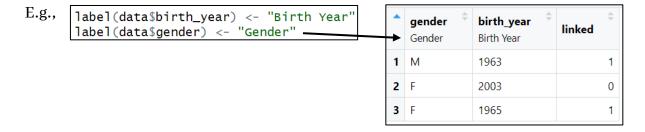
1.7 How to format data for report

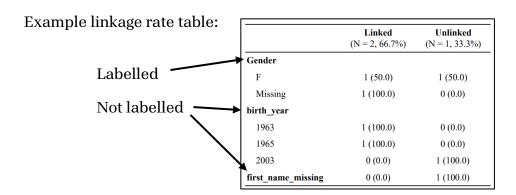
Data elements are used as received, so the more formatted they are, the cleaner the output will be.

Variable Names:

To modify the output of the variable names in the tables do one of the following:

1. Label the variable names using label() in the Hmisc package (Harrell Jr F (2024). Hmisc: Harrell Miscellaneous. R package version 5.1-3, https://CRAN.R-project.org/package=Hmisc).





2. Name the original variables as desired

E.g.,

•	Gender [‡]	Birth Year	linked [‡]
1	М	1963	1
2	F	2003	0
3	F	1965	1

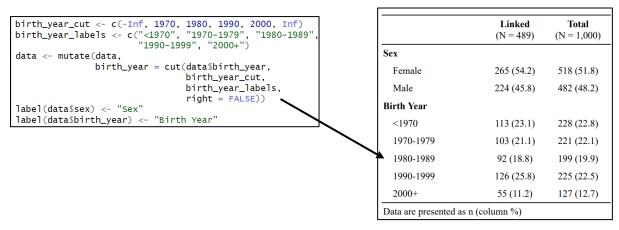
Variable values:

Values output in the stratified tables are output as received.

If you wish to change their values or categorize them, you must do so before passing the data to the function through **main_data**.

E.g.,

Linked data representativeness table:



2 Report Customizations

2.1 Quarto templates

To perform any of the following, you will need to modify at least one of the Quarto templates. If you have not done so already, download the default templates by visiting https://github.com/CHIMB/linkrep/blob/main/inst/templates/base_quarto_report_template.qmd and

https://github.com/CHIMB/linkrep/blob/main/inst/templates/extra_textual_content.qm d and selecting "Download raw file" on each. Open the files in RStudio to begin editing.

If you need guidance on understanding the template files, please refer to the Quarto tips: Understanding the report template section.

2.1.1 Modify text elements

Step 1: Locate the text elements you wish to modify

Step 2: Modify the text:

- For more information on writing in Markdown visit https://www.markdownguide.org/basic-syntax/
- If you are incorporating dynamic elements (e.g., table reference) into the text, refer to the syntax used in the template, or for more guidance visit https://quarto.org/docs/visual-editor/technical.html
- To modify the citations (e.g., [@fellegisunter]), see the References section

Step 3: Save the files you modified and pass their paths to the **linkage_quality_report** function through the appropriate parameter: base_quarto_report_template.qmd \rightarrow quarto_report_template; extra_textual_content.qmd \rightarrow extra_textual_content_quarto_template.

2.1.2 Add or remove tables & figures

<u>Note</u>: The datasets passed into **linkage_quality_report** are not accessible in the Quarto report template therefore, they must be provided separately using one of the strategies below.

For each new element, you must create at least one new R chunk in the Quarto template. Create the R chunk where you wish the element to output.

Option 1: Code the data and element directly into the Quarto file

Create the data directly in the R chunk:

```
fr}
data <- data.frame(a = c("apple", "apricot"), b = c("banana", "blueberry"))</pre>
```

Or import the data:

```
{r}
data <- read.csv("C:/Users/stoughte/Downloads/linked_data.csv")</pre>
```

Search "import __ file in R" where __ is a file type (e.g., xlsx) for guidance on how to import other file types

Then create the new element below your data:

```
# | label: tbl-new_table
# | tbl-cap: This is a table about fruits
library(flextable)
data <- read.csv("C:/Users/stoughte/Downloads/linked_data.csv")
flextable(data)

New table</pre>
Table caption and label
```

Option 2: Source the data into the Quarto file and create the element directly in it Open a new R file and create your data in it:

```
plot_data.R ×

| Source on Save | Run | Source
| Source on Save | Run | Source
| Source | Source on Save | Run | Source
| Source | Source | Run | Source | Source
| Source | Source | Run | Source |
```

Save the file and source it into the Quarto file:

```
source("C:/Users/stoughte/Documents/linkrep/R/plot_data.R")
```

Option 3: Source the data and a function to generate the element into the Quarto file Open a new R file and create your data and a function to generate the new element:

Source the file into the Quarto document and call the function:

```
#| label: tbl-summary
#| tbl-cap: This is a summary table
source("C:/Users/stoughte/Documents/linkrep/R/summary_table.R")
summary_table()
```

Option 4: Save the element as an image and import it into the Quarto file Generate the element and save it as an image:

```
bist.R x

library(grDevices)
  important_numbers <- sample(50:100, 1000, TRUE)
  out_path <- "C:/Users/stoughte/Downloads/histogram.png"
  png(out_path, units = "in", width = 5, height = 5, res = 350)
  hist(important_numbers)
  dev.off()</pre>
```

Import the image where you want it to be displayed in the report:

```
![Important numbers.](C:/Users/stoughte/Downloads/histogram.png){#fig-imp_nums}
```

Save the modified Quarto file and pass its file path to the **linkage_quality_report** function through the **quarto_report_template** parameter.

<u>Note</u>: Once data has been imported into the Quarto file it can be used anywhere below therefore, if you wish to add multiple elements using the same data, you only need to import the data once. By 'import' I'm referring to any of the strategies used above.

For more information on including figures in Quarto see https://quarto.org/docs/authoring/figures.html.

For more information on including tables in Quarto see https://quarto.org/docs/authoring/tables.html

Remove elements:

Option 1: Utilize the function parameters

Linkage rates over time plot:

Leave the following parameters out of the linkage_quality_report function call:

- acquisition_year_var
- acquisition_month_var

Algorithm summary table:

Leave the following parameters out of the **linkage_quality_report** function call:

- algorithm_summary_data
- algorithm_summary_tbl_footnotes

Performance measures table and figure:

- Leave the following parameters out of the **linkage quality report** function call:
- performance_measures_data
- performance measures tbl footnotes
- classification_metrics_used
- ground truth
- ground_truth_missing_var

Missingness table:

Leave the following parameters out of the **linkage_quality_report** function call:

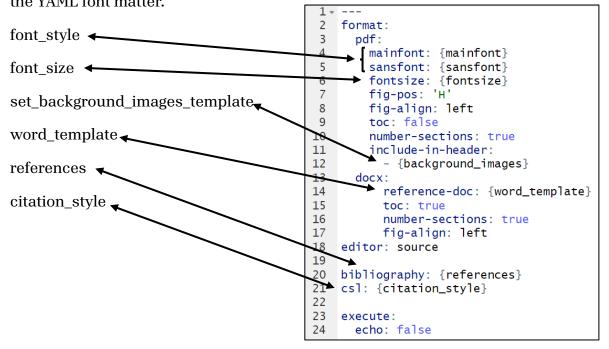
- missing_data_indicators
- missingness_tbl_footnotes

Option 2: Permanently remove the elements from the Quarto file

Suppose you wish to remove elements that cannot be removed using the parameter inputs, such as removing the performance measures table but keeping the figure. In that case, you will need to remove them from the Quarto template file. To do so, delete the R chunks associated with that element and any of its references throughout the report (e.g., @tbl-performance_measures_tbl). Save the modified Quarto file and pass its file path to the <code>linkage_quality_report</code> function through the <code>quarto_report_template</code> parameter.

2.1.3 Set metadata

There are a couple of parameters in the **linkage_quality_report** that can be set directly in the Quarto template file if you wish. They are located at the top of the Quarto file in the YAML font matter.



Example:

```
2
    format:
 3
      pdf:
        mainfont: "Arial"
 4
        sansfont: "Arial"
 5
 6
        fontsize: 10pt
        fig-pos: 'H'
 8
        fig-align: left
 9
        toc: false
        number-sections: true
10
11
        include-in-header:
12
          - "C:/Users/stoughte/Downloads/set_bg_images.tex"
13
      docx:
14
          reference-doc:
    "C:/Users/stoughte/Downloads/word_template.docx"
15
          toc: true
          number-sections: true
16
17
          fig-align: left
18
   editor: source
19
    bibliography: "C:/Users/stoughte/Downloads/references.bib"
20
21
    csl: "C:/Users/stoughte/Downloads/apa.csl"
22
23
    execute:
24
      echo: false
```

If you choose to do this, you do not need to input those parameters when you call the function.

Save the modified Quarto file and pass its file path to the **linkage_quality_report** function through the **quarto_report_template** parameter.

2.1.4 Quarto tips: Understanding the report template

YAML font matter: contains metadata and configuration options for the report

```
2
    format:
 3
      pdf:
        mainfont: {mainfont}
 5
        sansfont: {sansfont}
        fontsize: {fontsize}
 7
        fig-pos: 'H'
 8
        fig-align: left
 9
        toc: false
10
        number-sections: true
        include-in-header:
11
12
          - {background_images}
13
14
          reference-doc: {word_template}
15
16
          number-sections: true
          fig-align: left
17
    editor: source
```

:

R code chunk: performs tasks in R

```
fr load packages, include=FALSE, message=FALSE}
library(flextable)
library(xfun)
```

LaTeX code chunk: performs tasks in LaTeX

```
\section*{List of Abbreviations}
\addcontentsline{toc}{section}{List of Abbreviations}
```

Conditional content: outputs the contents between the div (::: :::) if the condition evaluates to true.

<u>Note</u>: content within the div will be run even if the condition evaluates to false. Wrap conditional code in an if statement within the conditional output to ensure the program doesn't halt.

```
: {.content-visible when-format="pdf"}
   {=tex}
                                                  Conditional content based on the
\section*{Acknowledgements}
                                                  output format. For more information
::: {.content-visible when-format="docx"}
                                                  https://quarto.org/docs/authoring/con
# Acknowledgements {.unnumbered}
                                                  ditional.html.
`r if(!is.null(linkage_rates_over_time_plot)) ":::
{.content-visible}" else "::: {.content-hidden}"
                                                                 Conditional content
  {r linkage rates over time plot}
#| label: fig-linkage_rate_dist
#| fig-cap: !expr paste0("Distribution of linkage rates over
                                                                 based on R objects
acquisition dates for records in ", params$left_dataset_name,".")
if (!is.null(linkage_rates_over_time_plot)){
                                                                 Don't forget the ending
 linkage_rates_over_time_plot
                                                                 :::
```

Headings: unnumbered headings will be unnumbered on the report and in the table of contents; numbered headings will be numbered on the report and in the table of contents.

Unnumbered headings in table of contents:

```
{=tex}
\section*{List of Abbreviations}
\addcontentsline{toc}{section}{List of Abbreviations}

# List of Abbreviations {.unnumbered}
\addcontentsline{toc}{section}{List of Abbreviations}
```

Unnumbered headings not in table of contents:

```
# Acknowledgements {.unnumbered}

**Section** {Acknowledgements}
```

Numbered heading in table of contents:

```
# Results
## Linkage Rate Summary
```

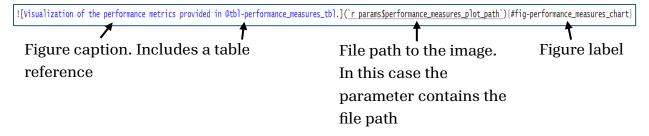
Table & Figure labels and captions: labels are needed to reference the tables and figures. For tables, labels must begin with **tbl-**; for figures, labels must begin with **fig-**. Captions can be made dynamic with the use of R objects.

<u>Note</u>: Must place **!expr** before caption using paste0() to incorporate dynamic elements. You do not need it if you are using simple text.

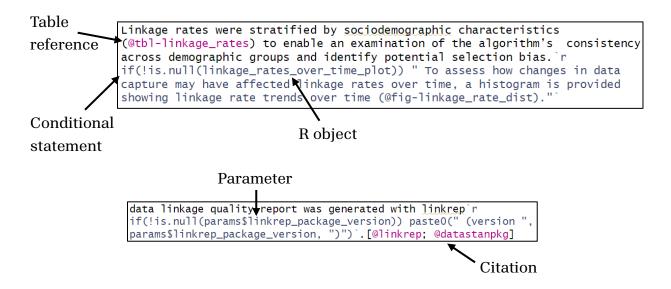
```
#| label: tbl-linkage_rates
#| tbl-cap: !expr paste0("stratified linkage rates for records in ",
params$left_dataset_name, " that linked to the records in ",
params$right_dataset_name, " (N = ", params$num_records_left_dataset,
ifelse(params$data_time_period == "", "", ", "), params$data_time_period, ").")
linkage_rate_table
```

Parameters to the Quarto file.

Images:



Written portions: written portions can incorporate R objects, parameters, table/figure references, citations and much more. Refer to Technical Writing – Quarto for more information.



2.2 References

To perform either of the following, you will need to modify the Quarto template and the references file. If you have not done so already, download the default Quarto template file by visiting

https://github.com/CHIMB/linkrep/blob/main/inst/templates/base_quarto_report_tem plate.qmd and selecting "Download raw file." Download the default references file by visiting https://github.com/CHIMB/linkrep/blob/main/inst/templates/references.bib and selecting "Download raw file."

Open both files in RStudio to begin editing.

2.2.1 Modify reference list

Add references:

Step 1: Add new references to the default references file (.bib file)

Method 1: Manually enter new references using BibTeX syntax

 For more guidance on writing references in BibTeX see https://web.mit.edu/rsi/www/pdfs/bibtex-format.pdf

Method 2: Use Google Scholar's citation generator

Step 1: Go to Google Scholar (search "Google Scholar in Google")

Step 2: Search for the paper you wish to cite and locate it in the displayed list:



Step 5: Copy and paste the generated citation into the references.bib file

```
@article{fellegi1969theory,
  title={A theory for record linkage},
  author={Fellegi, Ivan P and Sunter, Alan B},
  journal={Journal of the American Statistical Association},
  volume={64},
  number={328},
  pages={1183--1210},
  year={1969},
  publisher={Taylor \& Francis}
}
```

Chicago Fellegi, Ivan P., and Alan B. Sunter. "A theory for record

no. 328 (1969): 1183-1210.

pp.1183-1210.

BibTeX

1;64(328):1183-210.

linkage." Journal of the American Statistical Association 64,

Fellegi IP, Sunter AB. A theory for record linkage. Journal of

EndNote RefMan RefWorks

Harvard Fellegi, I.P. and Sunter, A.B., 1969. A theory for record linkage. Journal of the American Statistical Association, 64(328),

the American Statistical Association. 1969 Dec

Step 2: Cite all new references in the Quarto template file using their citation keys

Reference: Citation key

```
@article{fellegisunter,
  title={A theory for record linkage},
  author={Fellegi, Ivan P and Sunter, Alan B},
  journal={Journal of the American Statistical Association},
  volume={64},
  number={328},
  pages={1183--1210},
  year={1969},
  publisher={Taylor \& Francis}
}
```

```
citation @fellegisunter style 1
citation [@fellegisunter] style 2
multiple citations [@fellegisunter; @jarowinkler; @bohensky2011]
```

Citation:

Step 3: Save the modified files and pass their file paths to the **linkage_quality_report** function through the **quarto_report_template** and **references** parameters.

Remove references:

To remove references, you need to remove their citations in the Quarto template file.

Step 1: Locate the references you wish to remove in the references.bib file and identify their citation key.

Step 2: Locate all citations for those references in the Quarto file (e.g., [@fellegisunter]).

Step 3: Delete all citations in the Quarto file

Step 4 (optional): Delete the references in the references.bib file. The above three steps will remove the references from the References section of the report therefore, this step is not necessary.

Step 5: Save the modified files and pass their file paths to the **linkage_quality_report** function through the **quarto_report_template** and **references** parameters.

2.2.2 Modify citation style

To modify the citation style, you will need to pass a file path to a csl file containing the desired citation style to the **linkage_quality_report** function through the **citation_style** parameter.

To modify the citation style, you will need to utilize the **citation_style** parameter in the **linkage_quality_report**.

Step 1: Download your desired citation style.

- Download a file from GitHub citation-style-language/styles: Official repository for Citation Style Language (CSL) citation styles. or,
- Search "{style} citation in csl" (e.g., "apa citation in csl")

Step 2 (optional): If your citation style requires a location change within the text, you will need to manually change their locations. To do so, open the Quarto template file and modify the locations of all the citations.

Step 3: Save the modified files and pass their file paths to the **linkage_quality_report** function through the **quarto_report_template** and **citation_style** parameters.

2.3 Word template

The Word template defines the font, font size, footers, headers, captions, page numbers, and much more for Word reports. To modify the default output styles, download the default Word template by visiting

 $https://github.com/CHIMB/linkrep/blob/main/inst/templates/word_template.docx\ and\ selecting\ "Download\ raw\ file."$

Open the file in Word to being editing.

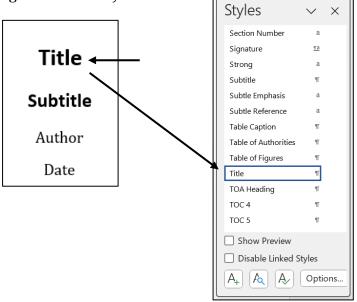
2.3.1 Modify font

To modify the font style, size, colour, etc., perform the following steps.

Step 1: Select the expander in the **Styles pane** on the **Home tab**.



Step 2: Click on the text in the Word document you wish to modify, and its style will become highlighted in the Styles window.



Step 3: Select the arrow next to the style and click

"Modify..."

Select All: (No Data)

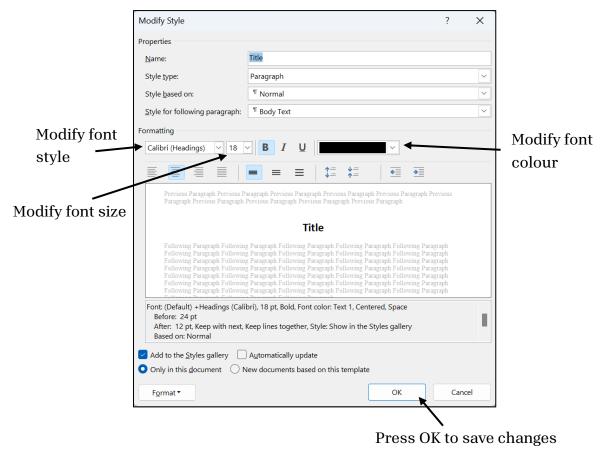
Remove All: (No Data)

Delete Title...

Remove from Style Gallery

Title

Step 4: Modify the font



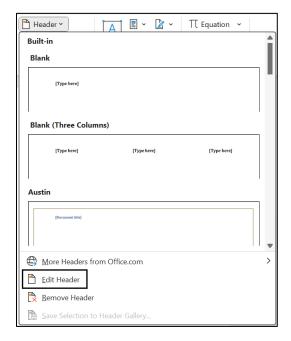
Step 5: Save the modified Word template and pass its file path to the **linkage_quality_report** function through the **word_template** parameter.

2.3.2 Modify footers & headers

Step 1: Navigate to the **Header & Footer pane** in the **Insert tab** and select the section you wish to modify



Step 2: Select either a Built-in option or the edit option. The edit option allows more flexibility, for example, you can add an image (e.g., logo) to the header through that option.



Step 3: Close the header & footer pane.

Step 4: Save the modified Word template and pass its file path to the **linkage_quality_report** function through the **word_template** parameter.

2.3.3 Additional resources

For more information, refer to https://quarto.org/docs/output-formats/ms-word-templates.html or utilize search engines (ex. Search: How to remove page numbers from word document) for more guidance.

2.4 Modify background images

To modify the background of a PDF report, use the image parameters provided in the **linkage_quality_report** function. Images should be letter size (8.5in x 11in) to fit the entire pages width.

Not all parameters need to be used, only the pages you wish to change. Pass the file path of your new background to the function.

Image Parameters:

cover_page

- content_portrait_page
- content_landscape_page
- back_cover_page
- display_back_cover_page
- blank_background

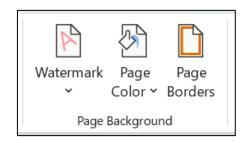
Word Report:

To modify the background of a Word report you can make use of the Word template, however, this will cause the full report to have the same background. If you wish to have more than one background you will need to change each page manually.

Change background in Word template:

Step 1: If you have not done so already, download the default Word template by visiting https://github.com/CHIMB/linkrep/blob/main/inst/templates/word_template.docx and selecting "Download raw file."

Step 2: Navigate to the **Page Background pane** in the **Design tab**



Step 3: Select one of the options

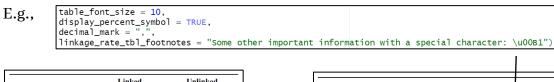
- Watermark: If you wish to add a background image select Watermark, Custom Watermark, Picture Watermark, and select your image. If you don't want the image to washout, unselect the Washout box.
- Page Color: Select a colour for your background
- Page Borders: Select a border for your background

Step 4 (optional): Modify the headers and footnotes to contain logos or additional images. See the Modify footers & headers section for guidance.

Step 5: Save the modified Word template and pass its file path to the **linkage_quality_report** function through the **word_template** parameter.

2.5 Table customizations

Utilize the parameters to modify the table output:



	Linked (N = 489, 48.9%)	Unlinked (N = 511, 51.1%)
Sex		
Female	265 (51.2)	253 (48.8)
Male	224 (46.5)	258 (53.5)
Birth Year		
<1970	113 (49.6)	115 (50.4)
1970-1979	103 (46.6)	118 (53.4)
1980-1989	92 (46.2)	107 (53.8)
1990-1999	126 (56.0)	99 (44.0)
2000+	55 (43.3)	72 (56.7)
Data are presented as n (row %)	