

cchsflow: An open science approach to transform & combine population health datasets

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Agenda

- Background of Canadian Community Health Survey (CCHS)
- Issues relating to CCHS cycles
- cchsflow: development and current status
- recodeflow: development and current status

Canadian Community Health Survey (CCHS)

- CCHS is a population-based cross-sectional survey of Canadians that has been administered by Statistics Canada every two years since 2001.
 - Information related to health status, health care utilization and health determinants for the Canadian population.
- CCHS is one of the largest and most robust ongoing population health surveys worldwide with approximately 130,000 respondents per cycle.
- Available as public use microdata file (PUMF) from 2001-2018.

Issue

- Data cleaning, including transforming variables into harmonized or common variables, is typically the most time-consuming part of data analyses.
- With the CCHS, data cleaning and harmonization issues arise when combining CCHS surveys.
 - The names of variables change across cycles.
 - The categories change across cycles.

Categorical age:

- 2001 CCHS: DHHAGAGE,
 15 categories.
- 2005 CCHS: DHHEGAGE,16 categories.

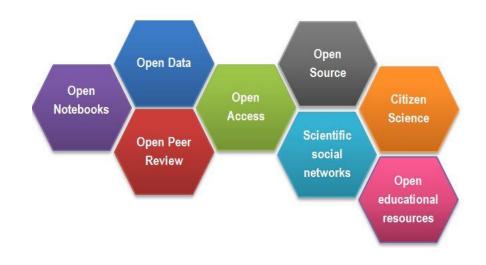
Variable Name	DHHAGAGE	Length	2	Position	16 - 17		Variable N	Name [HHEGAGE	Length	2	Position	26	- 27	
Question Name							Question I	Name A	ANC_AGE						
Concept	Age - (G)						Concept	A	Age - (G)						
Question							Question	٧	Vhat is your age?						
Universe	All respondents						Universe	-	All respondents						
Note	Based on DHHA_AGE.						Note		Derived from DHHE_DOB, DI	HHE_MOB and DHHE_	YOB	during intervi	ew and c	onfirmed	with respondent.
Content			Code	S	Sample	Population	Content			Co	de	\$	Sample		Population
12 TO 14 YEARS			1		6,476	1,186,119	12 TO 14 Y	YEARS			1		6,172		1,235,378
15 TO 19 YEARS			2	1	11,081	2,131,999	15 TO 17 Y	YEARS			2		6,145		1,304,374
20 TO 24 YEARS			3		7,584	2,112,568	18 TO 19 Y	YEARS			3		3,989		813,009
25 TO 29 YEARS			4		8,742	2,006,021	20 TO 24 Y	YEARS			4		7,740		2,239,016
30 TO 34 YEARS			5	1	10,281	2,158,989	25 TO 29 Y	YEARS			5		9,227		2,103,064
35 TO 39 YEARS			6	1	12,447	2,587,642	30 TO 34 Y				6		10,252		2,079,630
40 TO 44 YEARS			7	1	12,886	2,707,970	35 TO 39 Y				7		10,058		2,282,458
45 TO 49 YEARS			8	1	11,388	2,369,433	40 TO 44 Y				8		11,172		2,803,793
50 TO 54 YEARS			9	1	10,255	2,051,946	45 TO 49 Y				9		9,143		2,532,177
55 TO 59 YEARS			10		8,355	1,585,225	50 TO 54 Y				10 11		10,296		2,251,247
60 TO 64 YEARS			11		7,152	1,244,611	55 TO 59 \ 60 TO 64 \				12		10,645 9,268		1,973,801
65 TO 69 YEARS			12		6,842	1,151,556	65 TO 69 N				13		7.846		1,580,369 1,213,621
70 TO 74 YEARS			13		6,360	1,003,709	70 TO 74 \				14		7,124		1,030,975
75 TO 79 YEARS			14		5,237	740,459	75 TO 79 \				15		5,961		807,900
80 YEARS OR OLDE	R		15		5,794	749,088		OR OLDER			16		7,183		875,354
55 . E 5 OK OEBE		Total	.5		30,880	25,787,334	OU TENIO	, on older		Total		10	32,221		27,126,165
		Total			,0,000	20,. 01,004									, .,

Traditional method: hard-coding data across cycles

- Writing scripts that recode individual variables.
- Problems:
 - Labour intensive.
 - Error prone.
 - No standardized method of recoding variables.

```
**VISIBLE MINORITY;
ethnicity a= "Unknown";
if SDCDGCGT= 1
                                                         then ethnicity a="White";
                                                         then ethnicity a="Non-White";
       else if SDCDGCGT = 2
** HOUSEHOLD INCOME (provincial-level);
            Income pr 5="Unknown";
            Income ca 5="Unknown";
         If INCDVRPR in (1, 2) then Income pr 5= "Q1";
         If INCDVRPR in (3, 4) then Income pr 5= "Q2";
         If INCDVRPR in (5, 6) then Income pr 5= "Q3";
         If INCDVRPR in (7, 8) then Income pr 5= "Q4";
         If INCDVRPR in (9, 10) then Income pr 5= "Q5";
         If INCDVRCA in (1, 2) then Income ca 5= "Q1";
         If INCDVRCA in (3, 4) then Income ca 5= "Q2";
         If INCDVRCA in (5, 6) then Income ca 5= "Q3";
         If INCDVRCA in (7, 8) then Income ca 5= "Q4";
        If INCDVRCA in (9, 10) then Income ca 5= "Q5";
** EDUCATION;
               Education Cat= "Unknown";
               If EHG2DVR3= 1
                                     then Education_Cat= "LessThanSecondary";
          else If EHG2DVR3= 2
                                     then Education Cat= "SecondaryGraduate";
          else if EHG2DVR3 in (3, 4) then Education Cat= "MoreThanSecondary";
   /* Education - 5 cat*/
          Education d = "Unknown";
          If EHG2DVR3 = 1 then Education d = "LessThanSecondary";
          else If EHG2DVR3 in (2, 3, 4) then Education_d = "SecondaryGraduate";
```

Open science



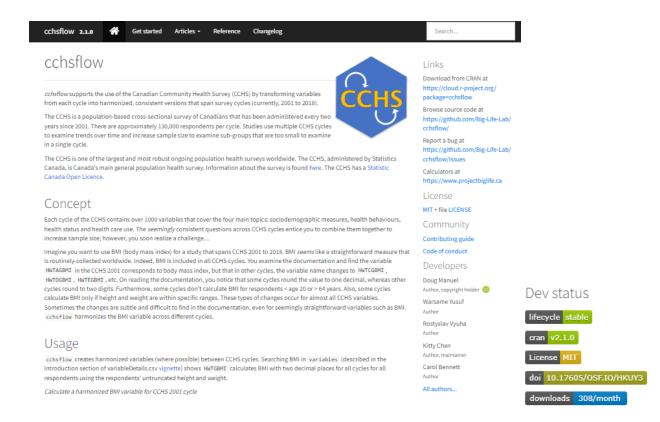
https://www.fosteropenscience.eu/content/ what-open-science-introduction Defined as "transparent and accessible knowledge that is shared and developed through collaborative networks". (Vicente-Saez, Martinez-Fuentes, 2018)

• Includes:

- Sharing of data (e.g. the CCHS PUMF).
- Use of open source languages (e.g. R, Python, Julia).
- Sharing of code.

New approach: cchsflow

- R package developed in 2019 that transforms and harmonizes CCHS variables across survey cycles.
- Contains a repository of 330+ variables from 2001 to 2018 for PUMF and share files.
- Available for installation through the Comprehensive R Archive Network (CRAN).



https://big-life-lab.github.io/cchsflow/

Using cchsflow

- Can be used to transform individual variables or entire survey cycles.
- Provides metadata for each variable.
- Transformed datasets can then be combined to create a harmonized dataset across many years.

Example 1: Transforming BMI in the 2001 survey cycle

```
No variable_details detected.

Loading cchsflow variable_details

No variables detected.

Loading cchsflow variables

Using the passed data variable name as database_name

NOTE for ADL_02: In the 2001 CCHS, respondents were asked, "Because of any condition or healt h problem, do you need the help of another person in shopping forgroceries or other necessiti es?"

NOTE for ALCDTTM: In CCHS cycles 2001, 2003, and 2005, ALCDTTM was derived from ALCDTYP in wh ich former and never drinkers were combined into "No drink in the last 12 months"

NOTE for ALCDTYP: Don't know (7) and refusal (8) not included in 2001 CCHS

NOTE for ALWDDLY: 2007-08, 09-10, 2010, 2012 cycles are categorical

NOTE for ALWDWKY: shown as categorical variable in CCHS 2014 cycle
```

Example 2: Transforming the entire 2001 survey cycle

Contents of the cchsflow package

Specification worksheets:

- variables.csv specifies all the variables available in the package.
- variable_details.csv details about each variable (which cycles it is found, category structure etc.).

Processing functions:

- rec_with_table() recoding of variables & survey cycles.
- set_data_labels() adding labels to transformed variables and survey cycles.
- merge_rec_data() merging and labelling transformed survey cycles.

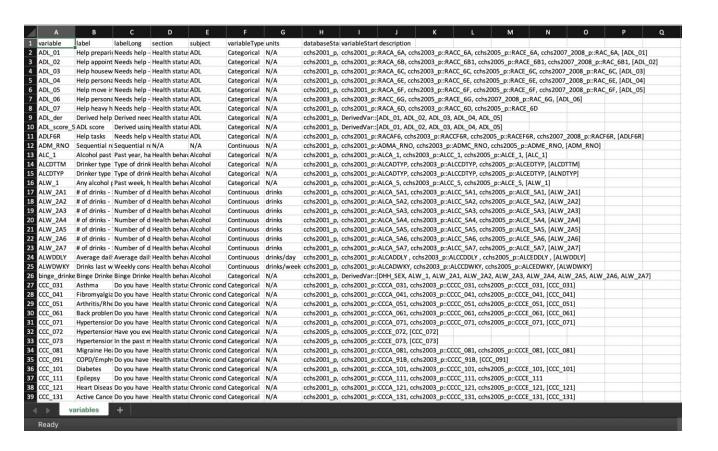
Derived variable functions:

Custom functions to generate derived variables.

• Sample data:

- Subsets of 200 respondents for each CCHS cycle from 2001 to 2018 (PUMF).
- Subsets of 200 respondents for each CCHS cycle for 2009 2012 (share files)

variables.csv



- Specifies all the variables available in *cchsflow*.
- Provides metadata of each variable.
 - Variable labels.
 - Variable type.
 - Subject and section.
 - Units (if applicable).
 - Description of variable.

variable_details.csv

- Outlines the structure of each variable.
- Guides the transformation process by:
 - Identifying the survey cycles the variable is available.
 - Specifying the original and final variable names.
 - Specifying the original and final variable types (categorical or continuous).
 - Specifying the original and final category structure (original and final ranges for continuous variables).
- Provides additional metadata of each variable.
 - Provides labels of categories.
 - Notes are provided to identify potential issues when combining between survey cycles.

A	в с	D E F	G	H I	J	К	L	М	N	O P	•	Q	R	S	Т	U	v
l variable	dummyVaria toType	databaseSta variableStart fromType	recTo	numValidCat catLabel	catLabelLong	units	recFrom	catStartLabe	variableStar	t variableStart notes							
ADL_01	ADL_01_cat2 cat	cchs2001_p, cchs2001_p:: cat		1 2 Yes	Yes	N/A		1 Yes	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in prep	paring meals
ADL_01	ADL_01_cat2 cat	cchs2001_p, cchs2001_p:: cat		2 2 No	No	N/A		2 No	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in prep	paring meals
ADL_01	ADL_01_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::a	2 not applicab	not applicab	N/A		6 not applicabl	Needs help	Because of any cond	dition or he	alth probler	m, do you i	need the help	of another p	person in prep	paring meals
ADL_01	ADL_01_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	[7,9]	don't know (Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in prep	paring meals
ADL_01	ADL_01_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	else	else	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in prep	paring meals
7 ADL_02	ADL_02_cat2 cat	cchs2001_p, cchs2001_p:: cat		1 2 Yes	Yes	N/A		1 Yes	Needs help	Because of a In the	2001 CCHS	, responden	ts were as	ked, "Because	of any cond	dition or heal	th problem,
ADL_02	ADL_02_cat2 cat	cchs2001_p, cchs2001_p:: cat		2 2 No	No	N/A		2 No	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
ADL_02	ADL_02_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::a	2 not applicab	not applicab	N/A		6 not applicabl	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
0 ADL_02	ADL_02_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	[7,9]	don't know (Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
1 ADL_02	ADL_02_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	else	else	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
2 ADL_03	ADL_03_cat2 cat	cchs2001_p, cchs2001_p:: cat		1 2 Yes	Yes	N/A		1 Yes	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in doir	ng normal ev
3 ADL_03	ADL_03_cat2 cat	cchs2001_p, cchs2001_p:: cat		2 2 No	No	N/A		2 No	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in doir	ng normal ev
4 ADL_03	ADL_03_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::a	2 not applicab	not applicab	N/A		6 not applicabl	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in doir	ng normal ev
5 ADL_03	ADL_03_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	[7,9]	don't know (Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in doir	ng normal ev
6 ADL_03	ADL_03_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	else	else	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in doir	ng normal ev
7 ADL_04	ADL_04_cat2 cat	cchs2001_p, cchs2001_p:: cat		1 2 Yes	Yes	N/A		1 Yes	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in pers	sonal care su
8 ADL_04	ADL_04_cat2 cat	cchs2001_p, cchs2001_p:: cat		2 2 No	No	N/A		2 No	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in pers	sonal care su
9 ADL_04	ADL_04_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::a	2 not applicab	not applicab	N/A		6 not applicabl	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in pers	sonal care su
0 ADL_04	ADL_04_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	[7,9]	don't know (Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in pers	sonal care su
1 ADL_04	ADL_04_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	else	else	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in pers	sonal care su
2 ADL_05	ADL_05_cat2 cat	cchs2001_p, cchs2001_p:: cat		1 2 Yes	Yes	N/A		1 Yes	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in mov	ving about in
3 ADL_05	ADL_05_cat2 cat	cchs2001_p, cchs2001_p:: cat		2 2 No	No	N/A		2 No	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in mov	ving about in
4 ADL_05	ADL_05_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::a	2 not applicab	not applicab	N/A		6 not applicabl	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in mov	ving about in
5 ADL_05	ADL_05_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	[7,9]	don't know (Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in mov	ving about in
6 ADL_05	ADL_05_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	else	else	Needs help	Because of any cond	dition or he	ealth probler	m, do you i	need the help	of another p	person in mov	ving about in
7 ADL_06	ADL_06_cat2 cat	cchs2003_p, cchs2003_p:: cat		1 2 Yes	Yes	N/A		1 Yes	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
8 ADL_06	ADL_06_cat2 cat	cchs2003_p, cchs2003_p:: cat		2 2 No	No	N/A		2 No	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
9 ADL_06	ADL_06_cat2 cat	cchs2003_p, cchs2003_p:: cat	NA::a	2 not applicab	not applicab	N/A		6 not applicabl	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
0 ADL_06	ADL_06_cat2 cat	cchs2003_p, cchs2003_p:: cat	NA::b	2 missing	missing	N/A	[7,9]	don't know (Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
1 ADL_06	ADL_06_cat2 cat	cchs2003_p, cchs2003_p:: cat	NA::b	2 missing	missing	N/A	else	else	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
2 ADL_07	ADL_07_cat2 cat	cchs2001_p, cchs2001_p:: cat		1 2 Yes	Yes	N/A		1 Yes	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
3 ADL_07	ADL_07_cat2 cat	cchs2001_p, cchs2001_p:: cat		2 2 No	No	N/A		2 No	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
4 ADL_07	ADL_07_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::a	2 not applicab	not applicab	N/A		6 not applicabl	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
5 ADL_07	ADL_07_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	[7,9]	don't know (Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
6 ADL_07	ADL_07_cat2 cat	cchs2001_p, cchs2001_p:: cat	NA::b	2 missing	missing	N/A	else	else	Needs help	Because of any phys	sical condit	tion or ment	al conditio	n or health pr	oblem, do y	ou need the h	nelp of anoth
7 ADL_der	ADL_der_cat cat	cchs2001_p, DerivedVar:: N/A	Func::adl_f	fui N/A N/A	N/A	N/A	N/A	N/A	Derived need	Derived neec Derive	d variable	based on AD	L_01, ADL	_02, ADL_03,	ADL_04, AD	L_05	
8 ADL_der	ADL_der_cat cat	cchs2001_p, DerivedVar:: N/A		1 2 Needs help	Needs help	N/A	N/A	Needs help v	Derived need	Derived needs help	with tasks						
9 ADL_der	ADL der cat cat	cchs2001_p, DerivedVar:: N/A		2 Does not ne	Does need h	N/A	N/A	Does need he	Derived need	Derived needs help	with tasks						

variable_details +

rec_with_table()

- Function used to transform variables in a given survey cycle.
- Uses information from variables.csv and variable_details.csv to transform variables.
- Can be used to transform individual variables or an entire survey cycle using all available variables in package.

```
transformed2001 <- rec_with_table(data = cchs2001_p, notes = FALSE)
#> No variable_details detected.
#> Loading cchsflow variable_details
#> No variables detected.
#> Loading cchsflow variables
#> Using the passed data variable name as database_name
```

rec_with_table(data, variables, variable_details, notes)

Specify which dataset to be recoded.

Specify which variables to be recoded. Function will recode all variables in package variables sheet if not specified.

Specify a variable details sheet.
Function will use package details sheet if not specified.

Specify if notes should be printed to console during recode.

Other processing functions

- set_data_labels()
 - Adds labels to transformed data.
 - Uses metadata specified in *variables.csv* and *variable_details.csv* to label variables.

- merge_rec_data()
 - Binds transformed data together into one dataset.
 - Adds labels to final transformed dataset.

```
#> No variable_details detected.
#> Loading cchsflow variable_details
#> No variables detected.
#> Loading cchsflow variables
#> Using the passed data variable name as database_name

transformed2012 <- rec_with_table(data = cchs2012_p, notes = FALSE)
#> No variable_details detected.
#> Loading cchsflow variable_details
#> No variables detected.
#> Loading cchsflow variables
#> Using the passed data variable name as database_name

combined_cchs <- merge_rec_data(transformed2001, transformed2012)</pre>
```

transformed2001 <- rec_with_table(data = cchs2001_p, notes = FALSE)</pre>

•	ADL_01 \$ Help preparing meals	ADL_02 \$ Help appointments/errands	ADL_03 \$ Help housework	ADL_04 \$ Help personal care	ADL_05 Help move inside house	ADL_07 Help heavy household chores
1	2	2	2	2	2	2
2	2	1	1	2	2	1
3	2	2	2	2	2	2
4	2	2	2	2	2	1
5	2	2	2	2	2	2
6	2	1	1	2	2	1
7	2	2	2	2	2	2
8	2	2	2	2	2	2
9	2	2	2	2	2	2
10	2	2	2	2	2	2
11	2	2	2	2	2	2
12	2	2	2	2	2	1
13	2	2	2	2	2	2
14	2	2	2	2	2	2
15	2	2	2	2	2	2
16	2	2	2	2	2	2
17	2	2	2	2	2	2
18	2	2	2	2	2	2
19	2	2	2	2	2	2
20	2	2	2	2	2	2
21	2	2	2	2	2	2
22	1	2	1	1	2	1
23	2	2	2	2	2	2
24	2	2	2	2	2	2
25	1	1	1	2	2	1
26	2	2	1	2	2	1
27	2	2	2	2	2	2
28	2	2	2	2	2	2

Derived variables

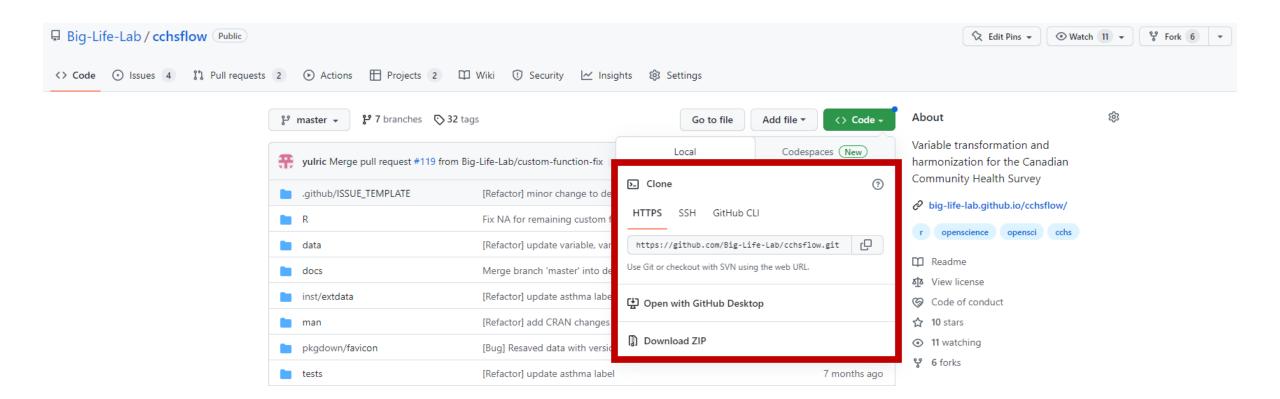
- Along with transforming existing CCHS variables, cchsflow can be used to create derived variables.
- Simple derived variables can be created using variable_details.csv, complex variables require custom functions.
- Can be based on transformed CCHS variables, other derived variables, or both.

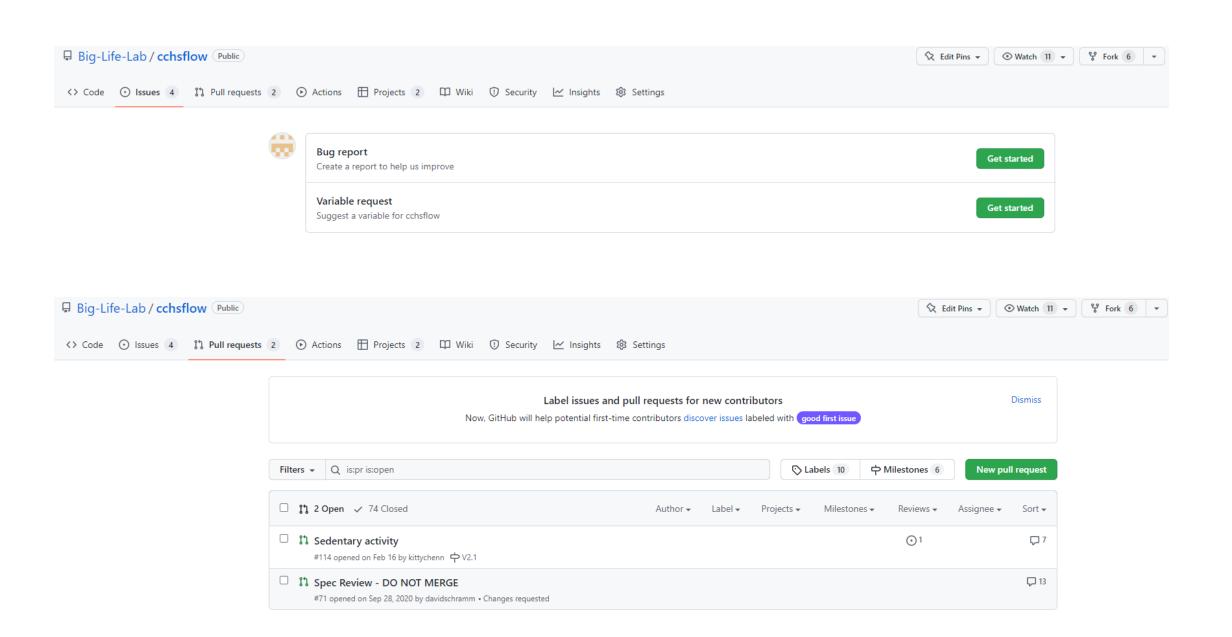
```
adjusted_bmi_fun <-
function(DHH_SEX, HWTGHTM, HWTGWTK) {
    # BMI adjusted for male
    if_else2(
        (!is.na(HWTGHTM)) & (!is.na(HWTGWTK)) & DHH_SEX==1,
        -1.07575 + 1.07592*(HWTGWTK / (HWTGHTM * HWTGHTM)),
    # BMI adjusted for female
    if_else2(
        (!is.na(HWTGHTM)) & (!is.na(HWTGWTK)) & DHH_SEX==2,
        -0.12374 + 1.05129*(HWTGWTK / (HWTGHTM * HWTGHTM)),
        tagged_na("b")
    )
    )
}</pre>
```

Custom function for adjusted BMI.

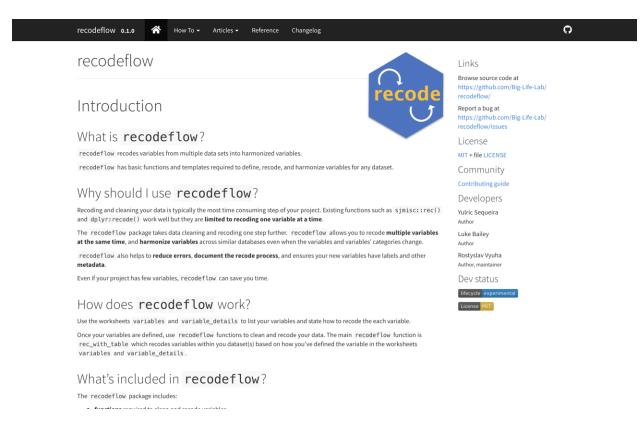
Contributing to cchsflow

- Package is publicly available on GitHub: https://github.com/Big-Life-Lab/cchsflow
- There are two ways users can contribute to the package:
 - Cloning the repository to their computer and submitting changes via pull requests.
 - Instructions on how to add variables can be found here: https://big-life-lab.github.io/cchsflow/articles/how to add variables.html
 - Using the issues section where users can request variables to be added or submit bug reports to help improve the package.



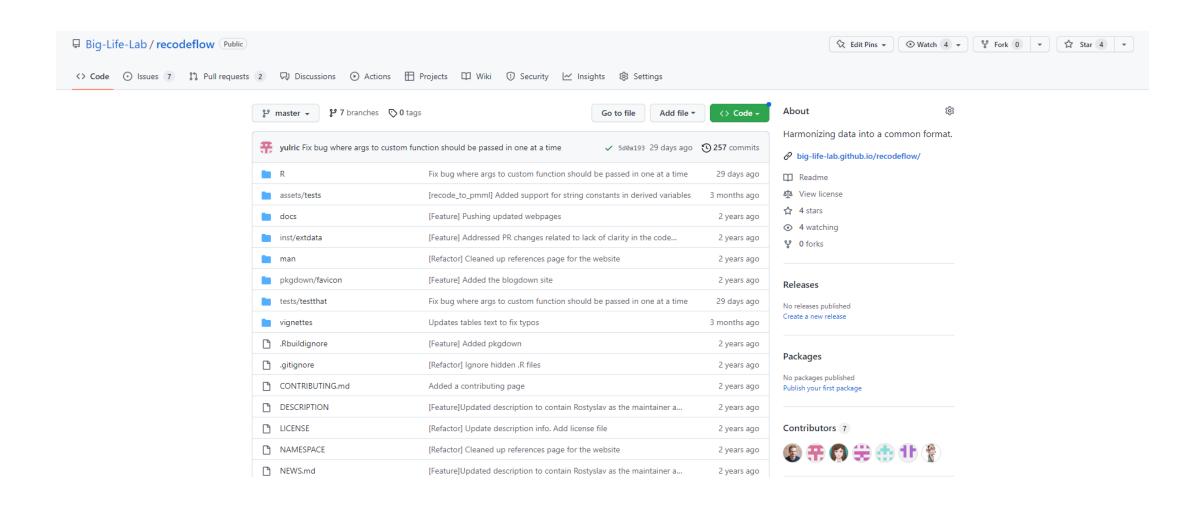


Transforming non-CCHS data: recodeflow



https://big-life-lab.github.io/recodeflow/

- While cchsflow can be a powerful tool in transforming variables, it is restricted to data from the CCHS.
- recodeflow has been developed to transform and harmonize variables from other surveys and datasets.
 - Uses the same transformation principles as cchsflow.
- Available for installation on CRAN.



Users can contribute to the package on the GitHub repository: https://github.com/Big-Life-Lab/recodeflow/

Summary

- *cchsflow* is an open-source package that transforms and harmonizes variables across numerous CCHS survey cycles.
- Instead of spending time recoding and transforming variables, Canadian health researchers can use cchsflow's existing library of variables to conduct longitudinal analyses.
- Specification worksheets are used to guide the transformation process and provide metadata of transformed variables.
- The use of GitHub allows users to contribute to the package, allowing them to add variables that may be of value to other researchers.
- recodeflow can be used to transform variables from other surveys and datasets using the same transformation principles.

References

• Vicente-Saez R, Martinez-Fuentes C. Open Science now: A systematic literature review for an integrated definition. Journal of Business Research 2018. https://doi.org/10.1016/j.jbusres.2017.12.043.

Questions?