

Data Transparency with DDI and Colectica

Introduction and case studies

About Me

- Colectica
 - 2006 present
- DDI Technical Committee, Invited Expert
 - **2009 present**
- Wisconsin Longitudinal Study
 - **2004 2006**

About Colectica

- Software for standards-based metadata management
 - Concepts and classifications
 - Survey design and specification
 - Data documentation
 - Data lifecycle, methods, and quality
- Metadata Repository and Portal

Overview

- Introduction
 - Discoverability, Transparency, and Reproducibility
 - Data Documentation Initiative (DDI) Standard
- Lineage throughout the Data Lifecycle
 - Data Sources, Comparability, and History
- Colectica and DDI Case Studies
 - Official Statistics and Research Surveys
- Recommendations

Discoverability

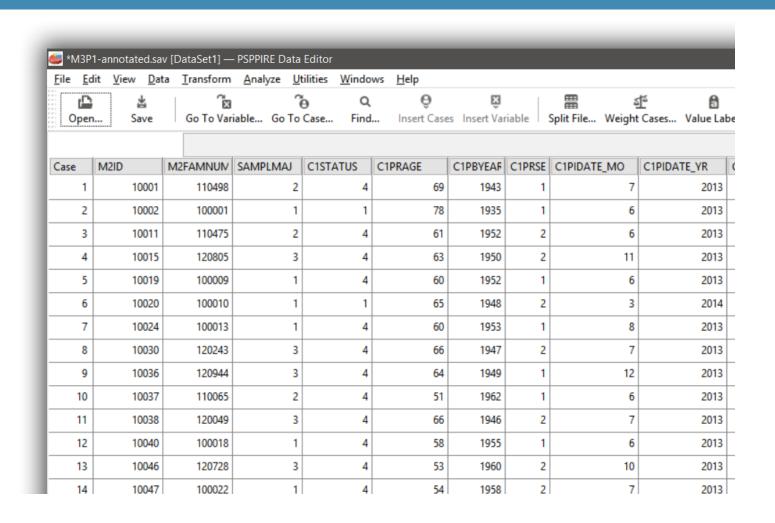
- □ Good standards exist to describe datasets
 - schema.org
 - DCAT
 - Plenty more

Discoverability

- Good places to look
 - Google
 - ICPSR
 - Data.gov

Once we discover a dataset: then what?

Data



Metadata

Variable	Name	Туре	Width	Decimals	Label	Value Labels	Missing Values	Colu
1	M2ID	Numeric	. 5	0	MIDUS 2 ID number	None	None	10
2	M2FAMNUM	Numeric	. 6	0	MIDUS 2 Family number	None	None	10
3	SAMPLMAJ	Numeric	. 8	0	Major sample identification	{1, MAIN RDD}	None	10
4	C1STATUS	Numeric	. 1	0	Completion status of M3 re	{1, COMPLETED M3 CATI ONLY	None	10
5	C1PRAGE	Numeric	. 2	0	Respondent's age	None	None	11
6	C1PBYEAR	Numeric	. 4	0	Respondent's year of birth	None	None	8
7	C1PRSEX	Numeric	. 1	0	Respondent's sex	{1, MALE}	None	6
8	C1PIDATE_MO	Numeric	. 8	0	Interview date - Month	None	None	13
9	C1PIDATE_YR	Numeric	. 8	0	Interview date - Year	{9997, DON'T KNOW}	None	13
10	C1PAA1	Numeric	. 1	0	Recession began with spec	{1, YES}	7, 8	5
			١.	_				1.

Metadata

4	C1STATUS	Numeric	***	1	0	Completion status of M3 re	{1, COMPLET
5	C1PRAGE	Numeric	***	2	0	Respondent's age	None
6	C1PBYEAR	Numeric	***	4	0	Respondent's year of birth	None

Statistical tools have limited metadata

- Data types
- Variable labels
- Value labels

No metadata

Open Save Go To Variable Insert Variable Split File Weight Cases Value Labels									
Variable	Name	Туре		Width	Decimals	Label	Value Labels	Missing Values	Col
1	NEWID	String		8			None	None	8
2	DIRACC	String		1			None	None	1
3	DIRACC_	String		1			None	None	1
4	AGE_REF	Numeric		8	0		None	None	8
5	AGE_REF_	String		1			None	None	1
6	AGE2	Numeric		8	0		None	None	8
7	AGE2_	String		1			None	None	1
8	AS_COMP1	Numeric		8	0		None	None	8
9	AS_C_MP1	String		1			None	None	1
10	AS_COMP2	Numeric		8	0		None	None	8
11	AS_C_MP2	String		1			None	None	1
12	AS_COMP3	Numeric		8	0		None	None	8
13	AS_C_MP3	String		1			None	None	1
- 44	AC COMPA	м .		^	^		N.		_

The metadata problem

- Metadata is needed to understand data
- Statistical tools have limited metadata capabilities
- No ability to record information about variable lineage
- Nothing about methods or quality

Discoverability is not Transparency

Transparency

- AAPOR Transparency Initiative calls for
 - Funding
 - Question Wording
 - Population, sampling, weighting information
 - Modes of collection
 - Contact information

Reproducibility

- In addition to data:
 - Methods
 - Full data lineage
 - Data transformation code

Data Documentation Initiative



- □ Since 1995
- Open standard for describing data
 - Focus on social, behavioral, and economic sciences
 - XML
- Users
 - National Statistical Institutes
 - University Research Groups
 - Data Archives
 - Other Data Producers and Publishers

DDI Content

Data

Classifications

Quality

Data collection

Research Lifecycle

Foundational

Data Processing

Data

Dataset

A data file, database, or other source of data

Data Layout

Describes the layout of a data file

Variable

A column in a dataset

Variable Statistics

Summary statistics for a single variable

NCube

Aggregate data

Represented Variable

Describes the common information of one or more harmonized variables

Conceptual Variable

Describes the common information of one or more harmonized variables

Classifications

Classification Family

Classification Series

Statistical Classification

Classification Level

Classification Item

Classification Correspondence Table

Classification Index

Quality

Quality Statement

A set of statements with information about how a study was conducted

Quality Standard

Describes all information that a quality statement should record

Data Collection

Instrument

A survey or other data capture instrument

Question

A question that can appear in a survey instrument

Question Grid

A question grid that can appear in a survey instrument

Question Block

A question block that can appear in a survey instrument

Statement

A statement that can appear in a survey instrument

Instruction

Information for an interviewer or respondent

Computation

Source code that performs calculations, validation, or other actions

Sequence

A set of items in an instrument, used for grouping, paging, or other organization

Data Collection

Describes the processes and methods used to collect data

Research Lifecycle

Study

A single research project

Series

A repeated set of studies

Archive

Information about how a study is archived for long term preservation

Foundational

Concept

An abstract idea or general notion

Category

A class of people or things

Code List

A list of categories, each with an assigned value

Universe

A population being studied

Organization

An institution, company, or other group

Data Processing

Processing Event

Information about who performed data processing and how it was performed

General Instruction

Any sort of data processing instructions

Generation Instruction

Data processing that creates new variables or datasets

DDI Items

- All items are identified
- Items can be registered in a repository
 - □ ISO 11179
- Full audit trail of changes to information

Lineage throughout the Data Lifecycle

- Methods Documentation
- Quality Reports
- Variable Lineage
- Structured Questionnaires

Methods

Methods in DDI

- Data Collection
 - Timing
 - Weighting
 - Sampling

Methods in DDI

- Coverage
 - Time
 - Geography
 - Topics

Methods in DDI

- Collection Events
 - Organizations
 - Data Sources
 - Modes
 - Actions to minimize losses

Quality Reports

Quality Reporting

- Quality Reports for Eurostat
- Concepts, methods, quality assessments
- European standards
 - □ SIMS, ESMS, ESQRS
- Supported in DDI through the QualityStatement element

Variable Lineage in DDI

Source questions

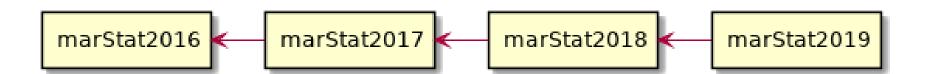
Source variables

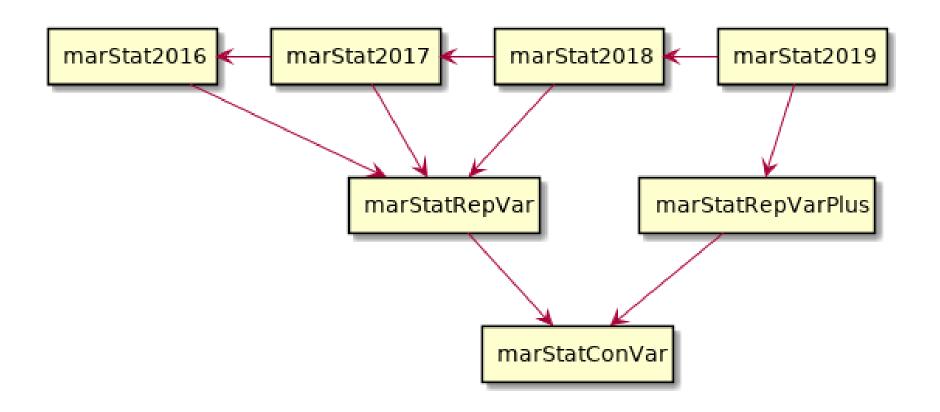
Variables measured across time, in different studies

Versioning

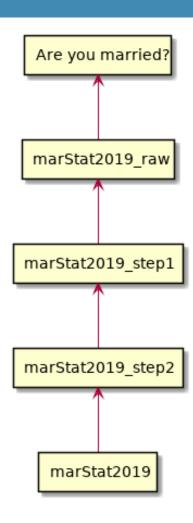
BasedOn

Variable Concordance

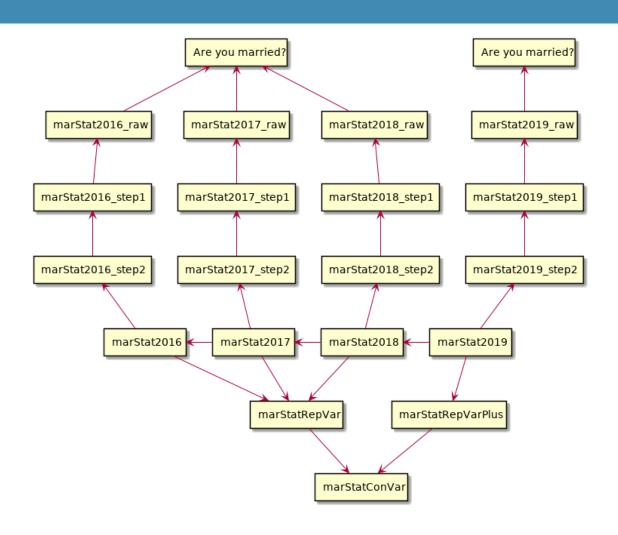


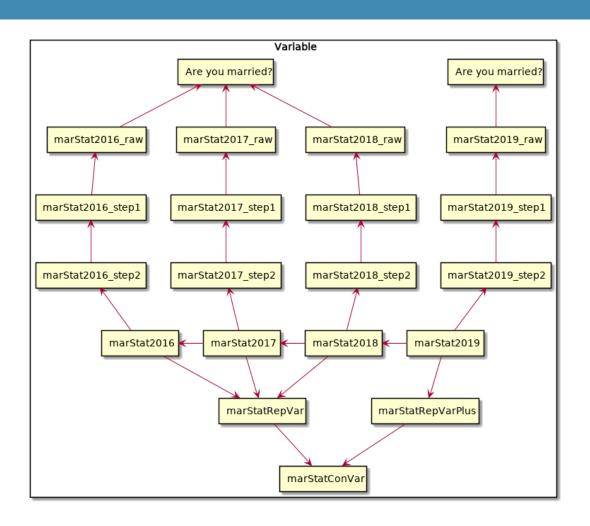


Variable Sources



Combined Lineage





Show the lineage in different ways

Reports and discovery portals can make use of this lineage

Documenting Data Transforms

C2Metadata Overview

- Continuous Capture of Metadata
- George Alter, PI
- Funding from National Science Foundation
 - Data Infrastructure Building Blocks (DIBBs)









C2Metadata Overview

- Extract transforms by parsing statistical source code
 - SPSS
 - Stata
 - SAS
 - R (tidyverse)
 - Python (pandas)
- Record information about the transforms in a structured way
- Update DDI metadata with information about the transforms

C2Metadata Tools

- In active development
- Desktop, command line, and web tools
- Developer libraries
- c2metadata.org and gitlab.com/c2metadata

Structured Data Transform Language

- SDTL
- Machine readable descriptions of data transforms
- JSON, XML, RDF representations

Structured Questionnaires

Questionnaire Documentation in DDI

- Questions
- Sequences
- Logic
- Full survey instruments

Questionnaire Documentation in DDI

- Questions can be sources for variables
- Questions can be re-used across many surveys

Case Studies: Official Statistics













Statistics New Zealand







DataInfo⊕ Explore our metadata

Find information about our data

DataInfo+ gives you one place to search and browse for information about our statistical activities and data.

Find our series



Series

Search or browse a list of series we produce. Find descriptions of series, including their frequency and collection methods

Find out more about what we measure and how we produce our statistics



Concepts

Search or browse for information about the concepts explored in our studies, including the statistical terms we use.



Classifications

Search a list of classifications we use.



Populations

Search or browse a list of populations we study.



Search for classification codes by keyword or browse for codes by classification.



Variables

Search or browse a list of variables used in our etudioe including their descriptions



Questionnaires and forms

Search a list of the instruments used in our studies.

- - □ Data Collections (3)
 - ☐ CPI Data Collection 2011☐ CPI Data Collection 2014
 - E GFT Data Collection 2014
 - CPI Data Collection 2017

 - □ (a) Population Sets (1)
 - Consumers Price Index Population



CPI Data Collection 2017







🔼 Data Dictionary

Data Collection Methodology

Methodology

Field collection

Statistics NZ price collectors gather prices directly from retail outlets.

Sample size

We collected about 100,000 prices from about 2,800 retail outlets and 2,300 other businesses and landlords.

General information

Imputation

Due to unavailability at the time of price collection, on average we impute 1–2 percent of prices (not including seasonal items such as winter clothing) each quarter. We often do this by carrying forward the previous quarter's price. Other imputation we do is to apply the movements of similar categories of items.

Review of the CPI

Reviews of the CPI are undertaken every three years. We implemented the latest review when the December 2017 CPI was published. The review involved reselecting the basket of representative goods and services, updating the new national expenditure weights, and updating regional expenditure weights.

Consumers price index review: 2017 has more information.

Impact of GST rise on the CPI

	By: Alphabetical - Item Type - Metadata Rank - Version Date Item	Description	Metadata Rank
(ii)}	2001 Post-enumeration Survey		0
(ii)	2006 Post-enumeration Survey		0
(ii)	2013 Post-enumeration Survey		0
(ii)}	2018 Census of Population and Dwellings		0
(ii)}	Abortion Statistics		0
(ii)	Accommodation Survey (2013 to current)		0
(ii)}	Agriculture Production Surveys and Censuses		0
(ii)}	Alcohol Available for Consumption		0
(ii)}	Annual Balance Sheets 2007-17		0
(ii)}	Annual Enterprise Survey		0
())	Balance of Payments and International Investment Position Statistics		0
())	Births		0
(ii)}	Building Consents Issued		0
(ii)}	Business Demography Statistics		0
())}	Business Frame		0
(1) }	Business Operations Survey		0

Statistics Denmark

- Eurostat Quality Reporting
 - 25+ people enter quality information
 - Review and approvals
 - Export from DDI Lifecycle to SIMS metadata structure
 - Deliver to Eurostat

Classifications

CLASSIFICATIONS

Population and elections	~
Living conditions	~
Education and knowledge	~
Culture and National Church	~
Labour, income and wealth	^
Statistics Denmark's Classification of Occupations (DISCO-08) DISCO in wage statistics	
Prices and consumption	^
European Classification of Individual Consumption according to Purpose (ECOICOP) - Statistics Denmark European Classification of Individual Consumption according to Purpose (ECOICOP) - Eurostat	
National accounts and government finances	^
Classification of the functions of government (COFOG) Classification by sector in the statistical business register (ESR) Classification by sector in the European system of accounts (ESA2010) Social protection expenditure (ESSPROS)	

Koder og kategorier

ÅBN HIERAKIET	DOWNLOAD -						
+ 1: Ledelsesarbejde	CSV						
+ 2: Arbejde, der foru	DDI	e niveau inden for pågældende omr					
+ 3: Arbejde, der forudsætter viden pa mellemniveau							
+ 4: Almindeligt kontor- og kundeservicearbejde							
- 5: Service- og salgs	arbejde						
- 51: Servicearbejo	de						
- 511: Service-	og kontrolarbejde und	der transport og rejser					
- 5111: Servicearbejde af passagerer i forbindelse med rejser							
511110: Passagerbetjening under rejser							
511120: Passagerbetjening i lufthavne og havneterminaler							
+ 5112: Kontrolarbejde under rejser							
+ 5113: Turis	t- og rejselederarbejd	de 🖟					
+ 512: Kokkearbejde							
+ 513: Tjenere og bartendere							
+ 514: Frisørarbejde og kosmetologarbejde samt beslægtede funktioner							
+ 515: Inspektørarbejde inden for rengøring, husholdning og ejendomme							
+ 516: Andet se	rvicearbejde						
+ 52: Salgsarbejde	(ekskl. agentarbejde)						
+ 53: Omsorgsarbe	ejde						
+ 54: Rednings- og overvågningsarbejde							

INSEE (France)

- Survey instrument specification using INSEE tooling, using DDI Lifecycle
- Study level information using Colectica
- Connect information in metadata repository, via
 DDI Lifecycle

Central Statistics Office (Ireland)

- Questionnaire specification
 - Use Blaise to collect data
 - Designing LFS using DDI Lifecycle
 - Will be able to connect data back to specified questions

Case Studies: Research Studies



























Finnish National Election Study (FNES)

□ Portal with rich variable details

Welcome

Welcome to the FNESdata longitudinal survey metadata portal. The portal contains the metadata of four surveys in the Finnish National Elections Study series. Studies range from 2003 to 2015 and they are listed below. You can browse individual datasets, search specific variables on the search page and easily explore the datasets to find and investigate new, interesting viewpoints to existing data. By collecting your findings into the basket, you can save custom codebooks from hand-picked variables.



FSD1260 Finnish National Election Study 2003

The survey consists of two parts which were collected after the 2003 parliamentary elections in Finland with the help of face-to-face interviews and a supplementary, self-administered questionnaire. Swedish-speaking population is over-represented in the data. The interview data is Finland's contribution to the international Comparative Study of Electoral Systems program (CSES). Variables q19-q22, q51-q65_11, and q67-q80 are national election study variables, variables q23_1-q50 and q66 are CSES variables, variables beginning with 'p' are self-administered questionnaire variables, and the rest are background variables.

Keyword

Internet; election campaigns; elections; expectations of future; parliamentary elections; political attitudes; political participation; political party affiliation; political party preference; voting

FSD2269 Finnish National Election Study 2007

Browse Data

Codebook

Documentation

Data from Aila



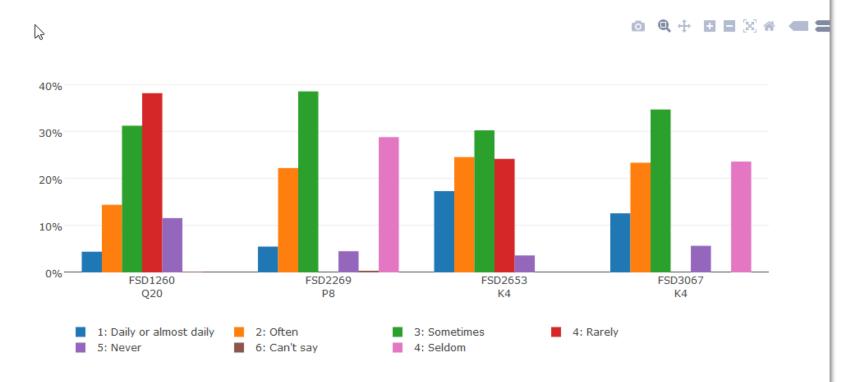


[fnes10] How often do you discuss politics with others?

Details...

Comparability Class

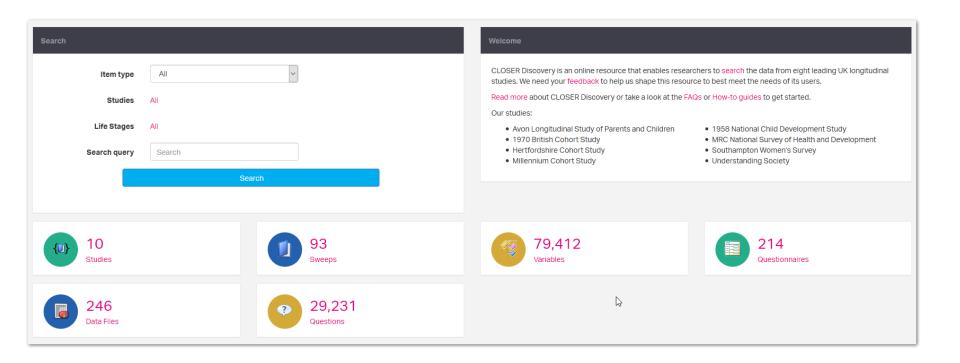
Wording in Question

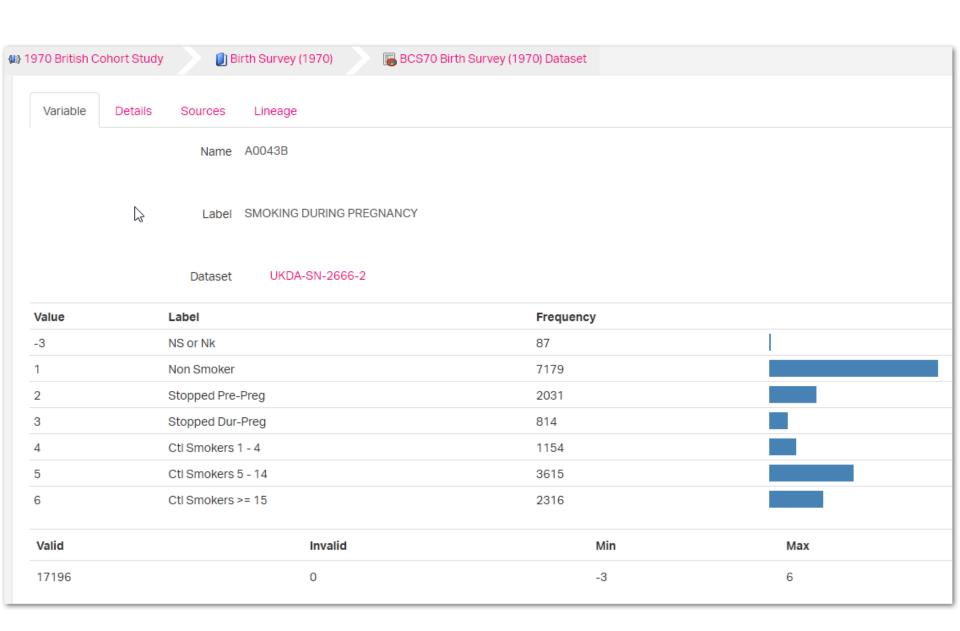


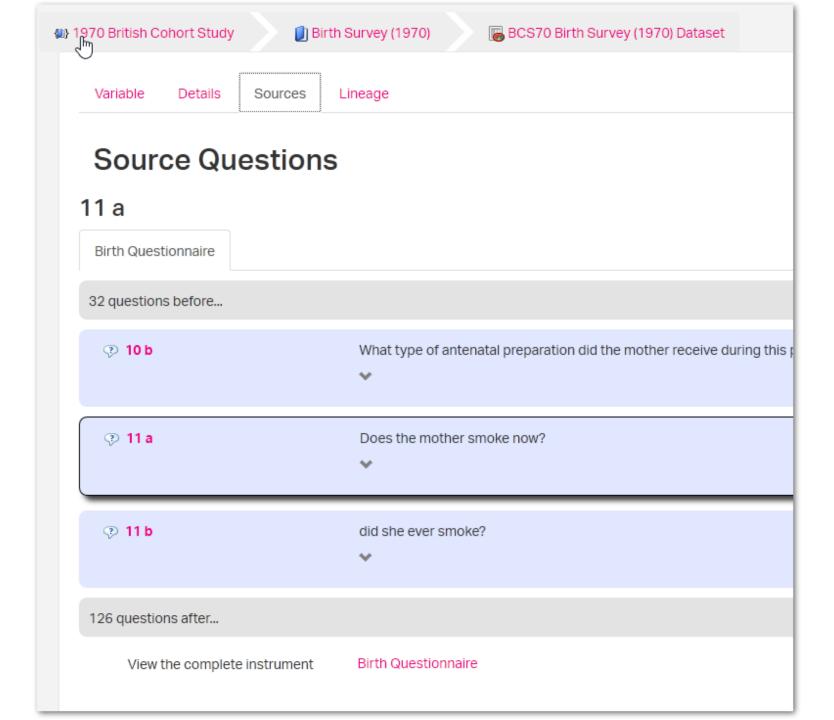
Dataset Varial	ole Valid Inva	First Ilid Min Quartil	Third e Median Quartile	Max Mean StdDev
FSD1260 Q20	1270	1		6
FSD2269 P8	1016	1		6
FSD2653 K4	1298	1		5
FSD3067 K4	1587	1		5

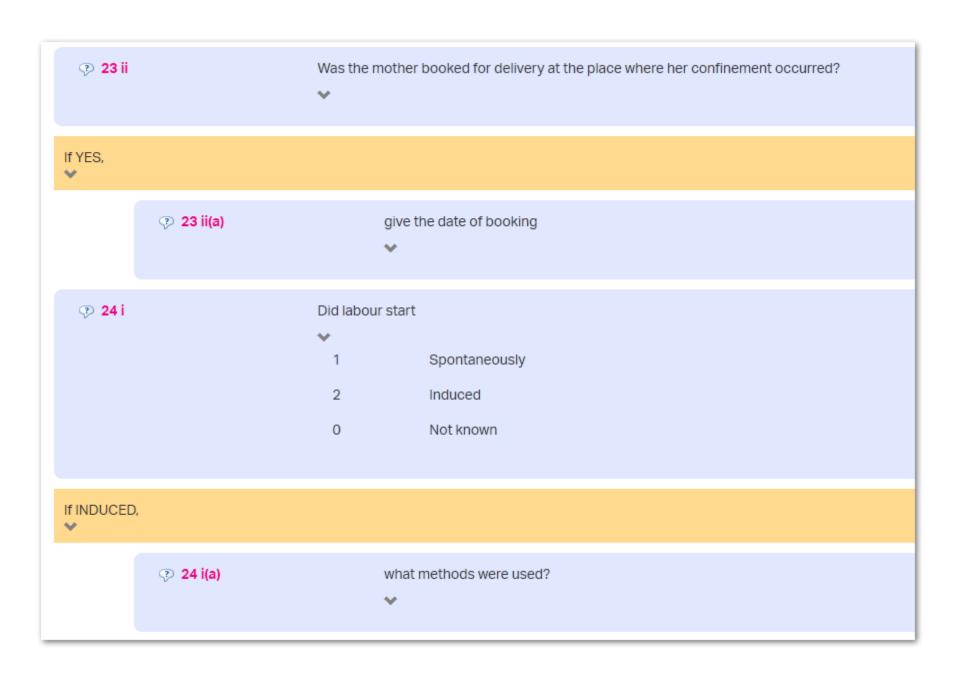
CLOSER

- Metadata portal
- □ 10 British cohort studies
- 80,000 variables
- ☐ 30,000 questions
- □ 200+ survey instruments









US Studies

- Midlife in the United States (MIDUS)
- National Health and Aging Trends (NHATS)
- National Social Life, Health, and Aging Project (NSHAP)
- National Archive of Computerized Data on Aging (NACDA)

Recommendations

- Use or mandate standards that support lineage
- Fund research projects for new specifications and tools

Use Standards for Data Lineage

- DDI data documentation standard
- AAPOR Transparency Initiative

Funding Research

- Specifications and Tooling
- DDI originally funded by Health Canada
 - Now by its members
- SDTL funded by NSF DIBBs

Recap

- Transparency requires rich information, not just searchability
 - Methods
 - Data Lineage

Thank You

Jeremy Iverson

jeremy@colectica.com

Variables across time in Portal

		M1P1	M2P1	M3P1
E	Marital status	A1PB17	B1PB19	C1PB19
=	# of Times married	A1PB19	B1PB20	C1PB20
	Month of marriage	A1PB18MO	B1PB21M	C1PB21M
=	Year of marriage	A1PB18YR	B1PB21Y	C1PB21Y
=	How 1st marriage ended	A1PB20	B1PB22	C1PB22

		1996	1997	1998	1999	2000	2001	2002	2003	2004	2005	2006	2007	2008	2009	2010
+	PAYPHONX Total expense for public phone	0	0	0		0	0									
٢	OTHLNDRX Cost for non-	0	0	0		0	0	0	0	0	0	0	0	0	0	0

Concordance							
Statistics	Code Comparison	Correspondence Tree					
% of valid %	of total						
		M1P1 A1PB17	M2P1 B1PB19	M3P1 C1PB19			
MARRIED		65.69 %	70.71 %	67.20 %			
SEPERATED		2.83 %					
SEPARATED			1.63 %	1.49 %			
DIVORCED		13.54 %	12.89 %	13.25 %			
WIDOWED		5.00 %	7.04 %	11.00 %			
NEVER MARR	IED	12.94 %	7.73 %	7.05 %			
DON'T KNOW	1						
REFUSED							
INAPP							

Sources in Portal

Lineage



Question text in a data dictionary

% C1PB19

Label

Marital status currently

Question Text

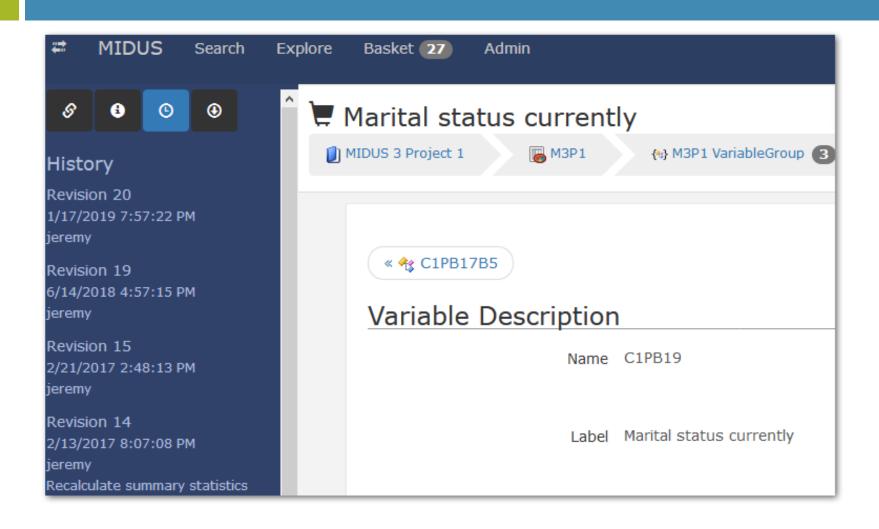
Are you married, separated, divorced, widowed, or never married?

Forward Skip

IF <u>C1PB19</u> = NEVER MARRIED, DK, OR REFUSED, GO TO <u>C1PB30</u>.

Value	Label	Frequency	%
1	MARRIED	2,211	67.1%
2	SEPARATED	49	1.5%
3	DIVORCED	436	13.2%
4	WIDOWED	362	11.0%
5	NEVER MARRIED	232	7.0%
7	DON'T KNOW	2	0.1%
8	REFUSED	2	0.1%

Version history in Portal



Recording variable lineage

- Tools let users specify this information manually
- DDI
 - References
 - Versions
 - Variable cascade

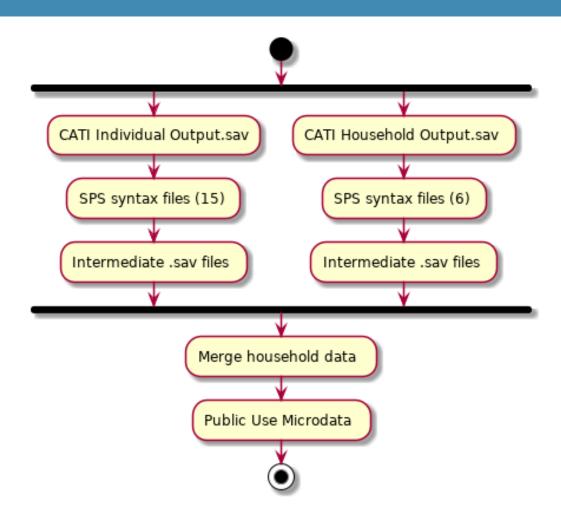
DDI Lifecycle is pretty good at variable lineage

- Many useful ways to record the information
- Many useful ways to display the information
- But: it is time intensive

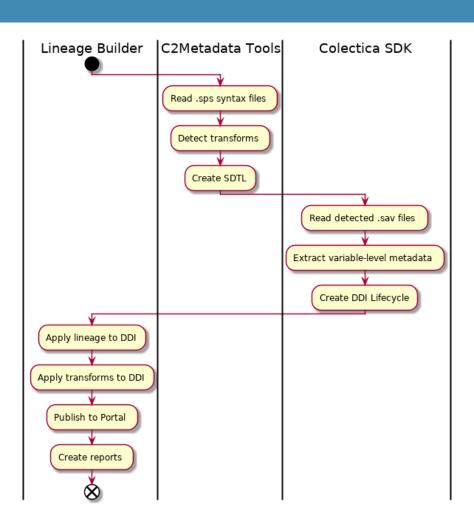
MIDUS Overview

- Midlife in the United States
 - Longitudinal study, since 1995
 - MIDUS 3 Project 1
 - 2,339 questions
 - 2,575 public use variables
 - 21 transform files

MIDUS 3 Transform Pipeline



Applying C2Metadata to MIDUS



Applying C2Metadata to MIDUS

- Read .sps syntax files
- 2. Detect transforms, creating SDTL
- 3. Read .sav files, extracting DDI variable metadata
- 4. Apply lineage to DDI (set source variables)
- 5. Apply transforms to DDI
- 6. Publish to Portal
- 7. Create reports

Lineage Builder Tool

- Dependencies
 - C2Metadata.Common .NET library
 - Colectica SDK
- Inputs
 - 21 SPSS syntax files (.sps)
 - 20 Data files (.sav)

Detected Transforms

Transform	Count
analysis	353
comment	261
select	240
setValueLabels	151
recode	73

Detected Transforms

Transform	Count
setDatasetProperty	42
compute	38
setMissingValues	28
load	23
save	19
setVariableLabel	17
rename	13
setDisplayFormat	11
keepVariables	9
delete	5
mergeDatasets	2

Lineage Builder Outputs

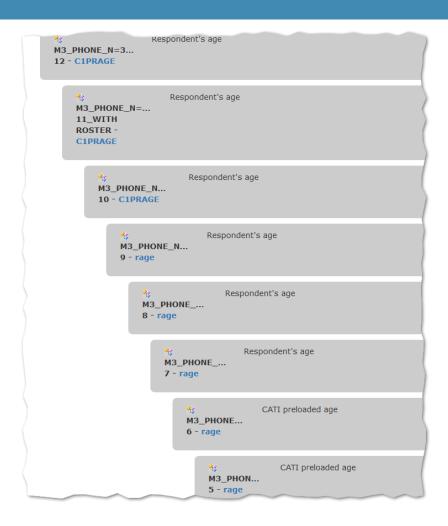
- □ DDI for 11,032 variables in 19 intermediate datasets
- 2,575 public use variables with documented lineage

Lineage in Portal (before)

Lineage



Lineage in Portal (after)



Summary

Summary

- Variable-level lineage helps understand data
- Statistical packages do not provide much help here
- DDI Lifecycle allows rich descriptions of lineage
- Tools allow manual and automated recording of lineage in great detail