



ETL Training – Day 2



Agenda

Aug 13 (Korea Time)	Contents	Speakers
9:00 – 9:45 AM	ETL Specification Review	Jing Li
9:45 – 11:00 AM	Common issues in ETL Conversion	Mui Van Zandt
11:00 – 11:30 PM	OMOP ETL Development (Lecture)	Mui Van Zandt
11:30 – 12:30 PM	Break	
12:30 – 14:00 PM	OMOP ETL Development (Exercise, Review)	Mui Van Zandt
14:00 – 14:15 PM	Break	
14:15 – 16:15 PM	Data Quality Checks (Lecture, Exercise, Review)	Selva Muthu Kumaran Sathappan



ETL Specification Review



ETL Specification Review

- Review ETL Specification Exercise



Common issues in ETL Conversion



Common OMOP CDM issues

CDM table	Frequently encountered issues	Recommended practice
Person	Person without birth year, or birth year in the future	Remove these person from OMOP conversion. OMOP considers them as invalid person.
	No standard condition_concept_id mapping available	Populate with standard concept IDs where domain_id='Condition' AND standard_concept='S'. Otherwise, populate this field with 0.
Condition_occurrence	Condition_source_concept_id has no mapped vocabulary	Populate with mapped concept id corresponding to the source value, otherwise populate with 0.
	Foreign Key provider_id not from Provider table	Check provider_id not null values, if they have the same provider_id in Provider table. If not leave it as null.
Visit_occurrence	Foreign Key provider_id not from Provider table	Check provider_id not null values, if they have the same provider_id in Provider table. If not leave it as null.
	Discharge_to_concept_id has no mapped standard vocabulary	Populate with standard concept IDs where domain_id='Visit' and standard_concept='S'.



Common OMOP CDM issues – Continued

CDM table	Frequently encountered issues	Recommended practice
Drug_exposure	No standard drug_concept_id mapping available	Populate with standard concept IDs where domain_id='Drug' AND standard_concept='S'. Otherwise, populate this field with 0.
	Drug_type_concept_id is not standard and not in Type Concept domain	Populate with standard concept ids which best represents the provenance of the record. Generally, populate with 32810 for Claim or 32817 for HER.
	Drug quantity < 1	Check if quantity < 1 is reasonable from medical perspective. Could leave it < 1 if reasonable.
	Drug_exposure_start_datetime not in correct format	If time value is available, set it between 00:00:00 and 23:59:59. Otherwise, set it to midnight 00:00:00.
	Days_supply <1	Check why days_supply < 1. Default to 1 if not available.
Drug_era	Drug_era_end_date is abnormal	Populate with the end date of the last Drug Exposure.
Device_exposure	Device quantity < 1	Default to 1 if it is 0, null or negative values.



Common OMOP CDM issues – Continued

CDM table	Frequently encountered issues	Recommended practice
Death	Death dates outside observation period	Refresh Observation_period table if Death table data is updated.
	Events after death	Check and fix abnormal event dates. Otherwise remove these person events.
Observation_period	Person without observation period	Remove these person if no events associated with them.
	Events outside observation period	Refresh Observation_period table after event tables updated and abnormal event dates deleted.
Measurement	Value_as_number is negative or null	Check if it's reasonable from medical perspective, or they have value_as_concept_id populated.
	Measurement_date outside of birth date and death date	Check the records of measurement_date before person's birth date or after death date + 60 days and fix.
Event tables	Records go to wrong CDM tables with different domain	Records should go to corresponding tables with their domain.

1. No standard vocabulary

Issue

- Text fields
- Duplicate and unclear values in source concept names
- Proprietary coding system
- No OMOP standard vocabulary mapping available even though vocabulary is in Athena

CONCEPT_ID	CONCEPT_NAME	CONCEPT_CODE	FREQUENCY	TYPE
1700009030	mg	1700009030	14150	DOSE_UNIT_CONCEPT_ID
1700009035	ml	1700009035	13287	DOSE_UNIT_CONCEPT_ID
1700009025	g	1700009025	7023	DOSE_UNIT_CONCEPT_ID
1700009028	支	1700009028	3234	DOSE_UNIT_CONCEPT_ID
0	No Matching Concept	0	2981	DOSE_UNIT_CONCEPT_ID
1700009017	瓶	1700009017	2882	DOSE_UNIT_CONCEPT_ID
1700009033	盒	1700009033	1263	DOSE_UNIT_CONCEPT_ID
1700009049	片	1700009049	1094	DOSE_UNIT_CONCEPT_ID
1990000577	ug	1990000577	800	DOSE_UNIT_CONCEPT_ID
1700009015	袋	1700009015	384	DOSE_UNIT_CONCEPT_ID
1700009038	粒	1700009038	329	DOSE_UNIT_CONCEPT_ID
1700009022	次	1700009022	125	DOSE_UNIT_CONCEPT_ID
1700009021	万单位	1700009021	52	DOSE_UNIT_CONCEPT_ID
1990001856	NULL	1990001856	32	DOSE_UNIT_CONCEPT_ID
1990002451	lu	1990002451	31	DOSE_UNIT_CONCEPT_ID
1700009019	U	1700009019	28	DOSE_UNIT_CONCEPT_ID
1700009034	IU	1700009034	22	DOSE_UNIT_CONCEPT_ID
174124422	克	174124422	19	DOSE_UNIT_CONCEPT_ID
1990002450	丸	1990002450	6	DOSE_UNIT_CONCEPT_ID
1990000576	滴	1990000576	5	DOSE_UNIT_CONCEPT_ID

Solution

- Own Mapping Team
 - Mapped translated terms to OMOP standard vocabulary
- OMOP Vocabulary Team
 - Prioritized terms for mapping
 - Verify translated terms
 - Confirm translation with medical team
 - Downloaded latest vocabularies
- If cannot map to a standard vocabulary, use `concept_id = 0`



2. Abnormal values

Issue

- Negative, 0, decimals, null values of quantity in device_exposure and drug_exposure table
- Negative, null values of value_as_number in measurement table
- Person year_of_birth before 1900 or in the future

Quantity		
cdm_table	quantity_	records
device_exposure	> 0	8491192
device_exposure	0	2
drug_exposure	<0	2
drug_exposure	0	1
drug_exposure	>0	49385291
procedure_occurrence	> 0	98915335

Solution

- Default to 1 for quantity in device_exposure table
- Check source data if it's reasonable from medical perspective, or they have value_as_concept_id populated
- Check person source birth date
- If valid, leave the values as they were. If not, remove the records as dirty data

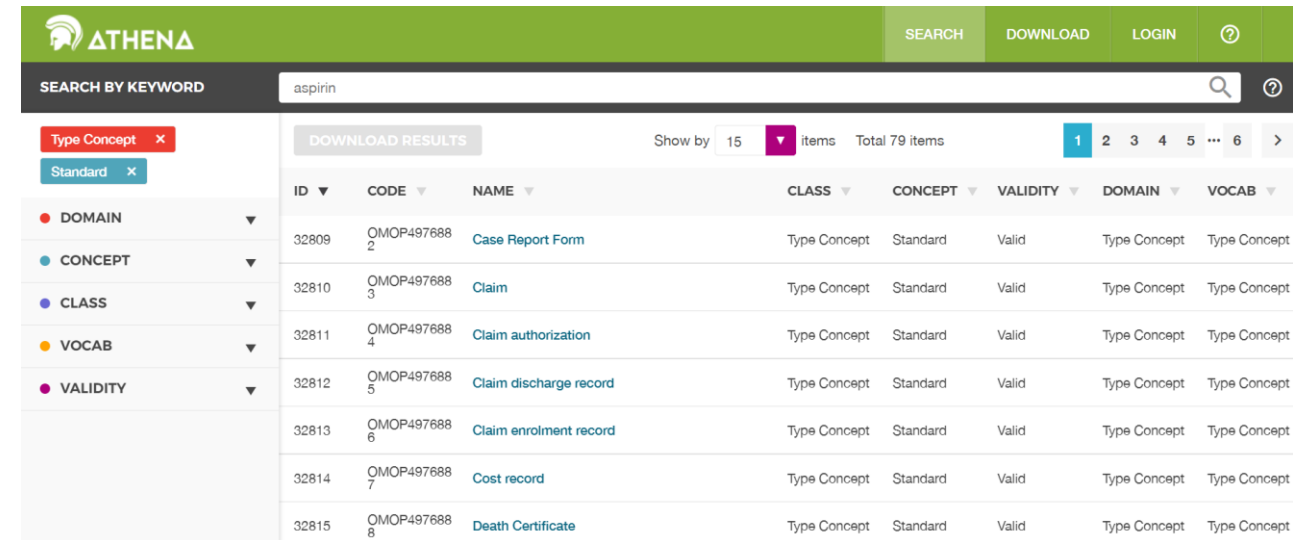
3. Wrong type_concept_ids

Issue

- Wrong provenance of records were assigned to type_concept_ids
- Type_concept_id is not standard

Solution

- Find the best provenance of the record using ATHENA
- Standardize all type_concept_ids in each table
- Guidelines:
 - Use 32810 for Claim
 - Use 32817 for EHR



The screenshot shows the ATHENA search interface. The top navigation bar is green with the ATHENA logo and links for SEARCH, DOWNLOAD, LOGIN, and a help icon. Below this is a search bar with the text 'aspirin'. To the left of the search results is a sidebar with filters: 'Type Concept' (selected) and 'Standard'. The main area displays 'DOWNLOAD RESULTS' for 'aspirin'. It shows a table with columns: ID, CODE, NAME, CLASS, CONCEPT, VALIDITY, DOMAIN, and VOCAB. The table lists 8 items, all with the same provenance (OMOP497688) and concept (Type Concept). The results are paginated, showing items 1 through 6.

ID	CODE	NAME	CLASS	CONCEPT	VALIDITY	DOMAIN	VOCAB
32809	OMOP497688 2	Case Report Form	Type Concept	Standard	Valid	Type Concept	Type Concept
32810	OMOP497688 3	Claim	Type Concept	Standard	Valid	Type Concept	Type Concept
32811	OMOP497688 4	Claim authorization	Type Concept	Standard	Valid	Type Concept	Type Concept
32812	OMOP497688 5	Claim discharge record	Type Concept	Standard	Valid	Type Concept	Type Concept
32813	OMOP497688 6	Claim enrolment record	Type Concept	Standard	Valid	Type Concept	Type Concept
32814	OMOP497688 7	Cost record	Type Concept	Standard	Valid	Type Concept	Type Concept
32815	OMOP497688 8	Death Certificate	Type Concept	Standard	Valid	Type Concept	Type Concept



4. Missing CDM tables

Issue

- Incomplete OMOP CDM tables
- Potential Missing Tables:
 - Procedure_occurrence
 - Device_exposure
 - Visit_occurrence
 - Observation
 - Payer_plan_period
 - Dose_era
 - Location
 - Cost
 - Death
 - Provider

Solution

- Check source data for related domains
- Provide mapping rules from source data to OMOP CDM, and populate the missing tables



5. Mapping to the wrong domain

Issue

- The source vocabulary domain may differ from its mapped standard vocabulary domain
- Example: for CIEL 151927 – Family History of Hypertension, it maps to concept 4050816 [FH: Hypertension](#), which is not in Condition domain, but Observation domain

Solution

- Use the domain from the mapped OMOP standard vocabulary, not the source vocabulary domain
- For each table, the standard concepts should all be from the corresponding domain

Family History of Hypertension	
DETAILS	
Domain ID	Condition
Concept Class ID	Diagnosis
Vocabulary ID	CIEL ?
Concept ID	45956091
Concept code	151927

TERM CONNECTIONS (1)				
RELATIONSHIP	RELATES TO	CONCEPT ID	VOCABU	
Non-standard to Standard map (OMOP)	FH: Hypertension	4050816	SNOMED	

ATHENA	
FH: Hypertension	
DETAILS	
Domain ID	Observation
Concept Class ID	Context-dependent
Vocabulary ID	SNOMED ?
Concept ID	4050816



6. Incorrect logic for Observation_period

Issue

- Not each person has observation period
- Observation period for patients not cover the whole time period of all events
- Observation period end date less than observation period start date

	A	B	C	D
1	person_id	death_date	observation_period_start_date	observation_period_end_date
2	1001359781	4/12/2021	5/3/2009	4/4/2021
3	1000097092	10/20/2010	9/29/2010	10/2/2010
4	1000425383	3/17/2011	2/11/2011	3/11/2011
5	1000053760	12/16/2014	5/1/2011	12/12/2014
6	1000305130	7/6/2011	7/4/2011	7/5/2011
7	1001198016	10/18/2017	3/5/2012	10/11/2017
8	1001889912	4/6/2021	6/28/2012	4/4/2021
9	1000003855	1/20/2013	12/31/2012	1/2/2013
10	1001928093	6/26/2013	6/25/2013	6/25/2013
11	1000231733	4/29/2021	7/18/2014	4/4/2021
12	1001352467	10/25/2015	10/19/2015	10/24/2015
13	1001881134	4/5/2021	9/1/2016	4/4/2021
14	1000212202	9/8/2017	9/2/2016	9/13/2016
15	1001036129	7/8/2018	4/6/2018	7/2/2018
16	1001692998	10/20/2019	11/27/2018	1/20/2019
17	1001799255	4/9/2019	3/22/2019	4/8/2019

Solution

- Check why person has no observation period, invalid person IDs or person without dates?
- Refresh observation table after event tables updated and abnormal event dates deleted
- Check the logic of generating observation period
- If there is no event associated with the patient, delete the patient records



7. Loss of data

Issue

- Less patients once converted to OMOP
- Not all fields are mapped to OMOP

Solution

- Logic is introduced to ensure patients are valid
 - Test patients
 - Patients without birth year
 - Patients without any transaction
 - Depends on the data and scenario
- Some fields are used to derive the logic of the CDM field
 - For example: ICD Type helps determine if the code is an ICD9 or ICD10 code
- Duplicate records
 - The same diagnosis within the same day of a hospital stay



8. Wrong foreign key identifiers and datetime format

Issue

- Foreign key identifiers are invalid
- Event datetime value not in correct format

Solution

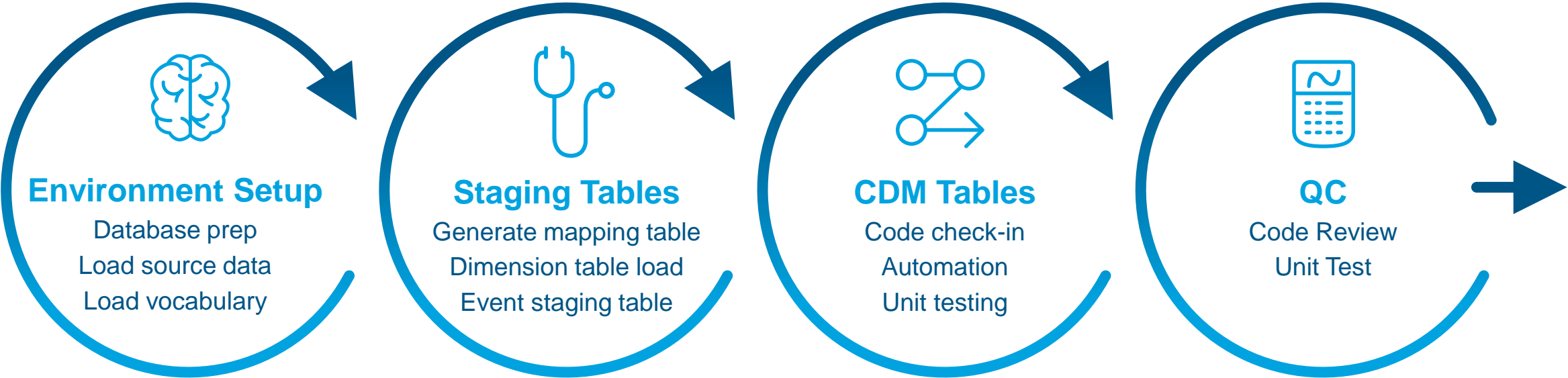
- Check why FK identifiers not work, wrong person IDs or ETL logic?
- If time value is available, set it between 00:00:00 and 23:59:59. Otherwise, set it to midnight 00:00:00



OMOP ETL Development

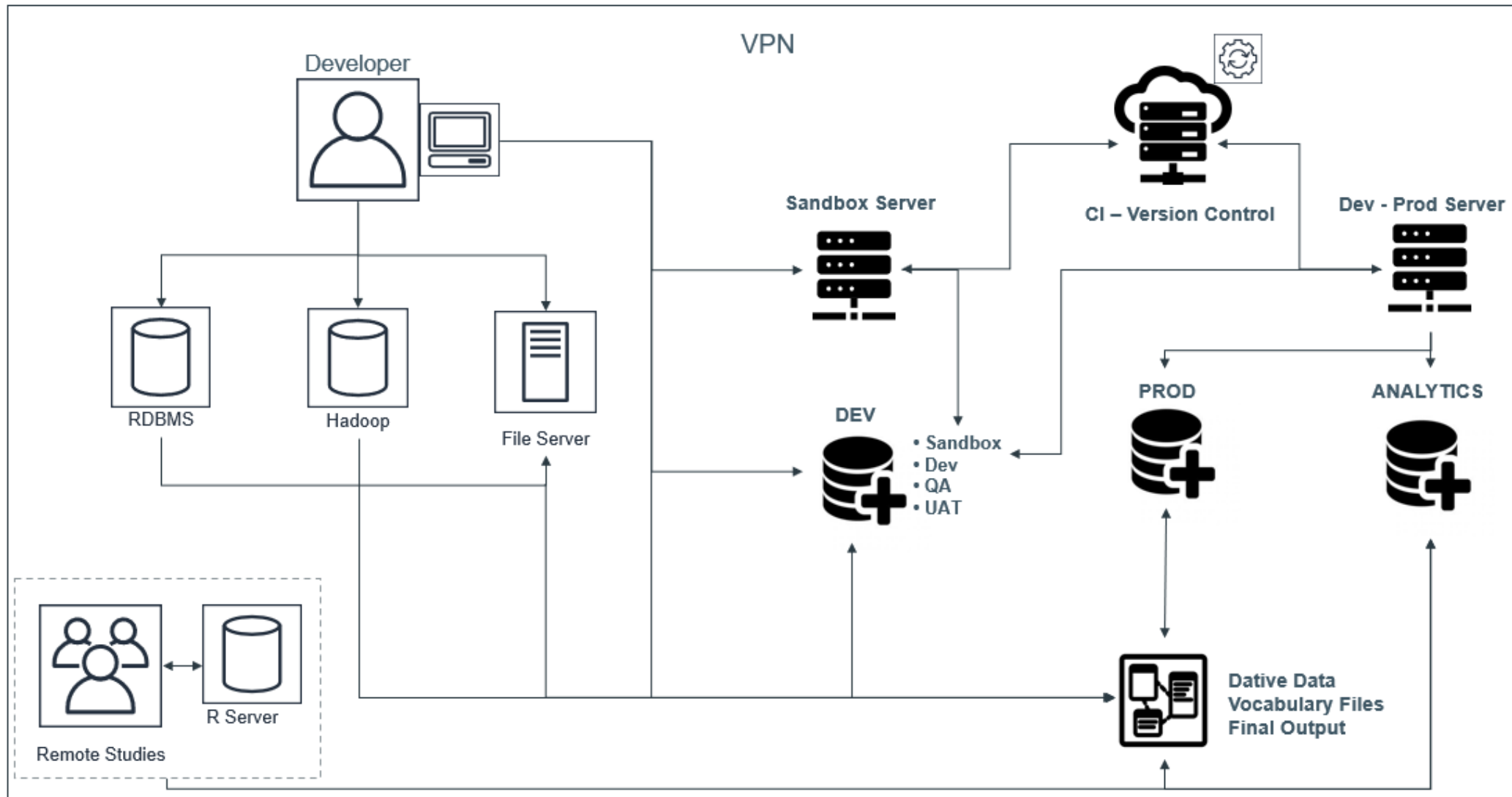


OMOP ETL Workflow





ETL Environment





ETL Process

1

Source data to staging table

- DDL
- Load source data
- Load custom mapping
- Load standard vocabulary
- Load staging table

2

Staging table to OMOP CDM tables

- Generate mapping table
- Dimension table load
- Fact table load

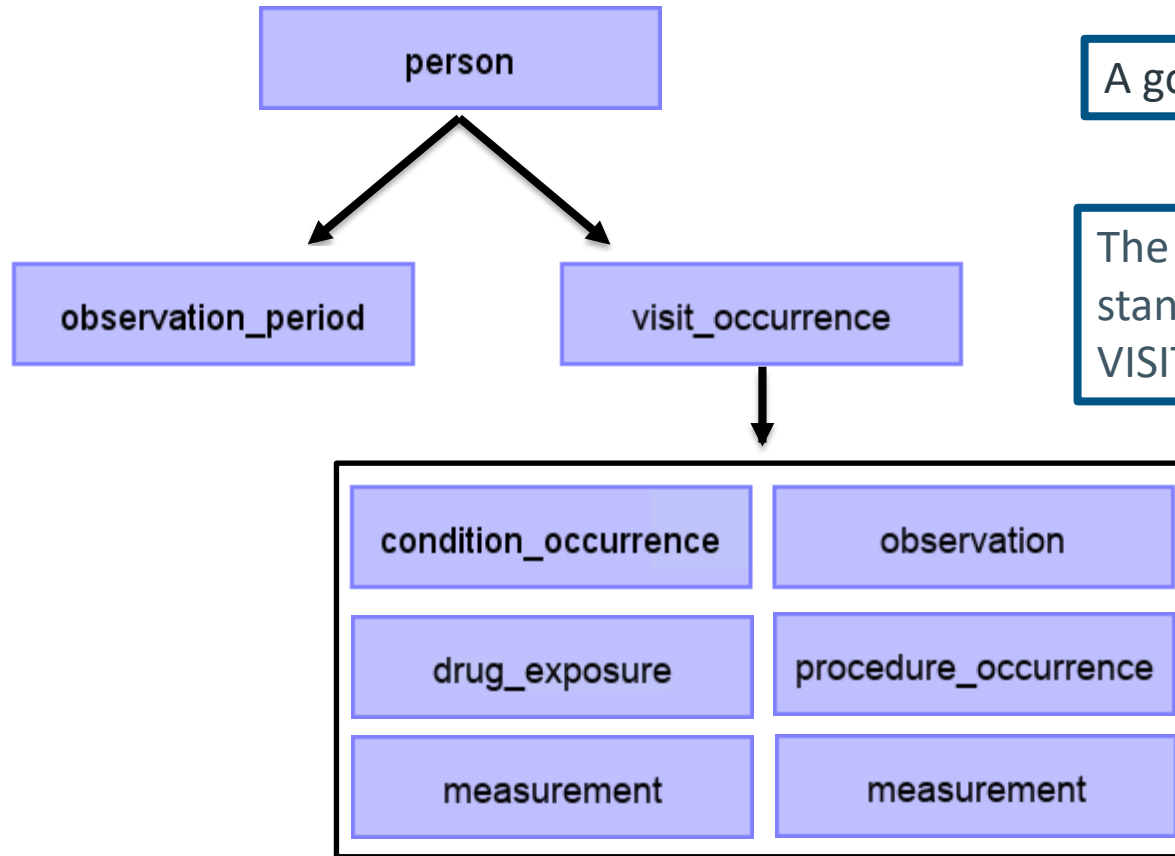
3

QA and Validation

- QA
- Validation
- Demostats
- Achilles



ETL Implementation



A good rule of thumb is to always create the PERSON table first

The VISIT_OCCURRENCE table must be created before the standardized clinical data tables as they all refer to the VISIT_OCCURRENCE_ID



Step 1: Source data to staging table

1. DDL – Create the tables where the source data will land



2. Load the source data into the tables you created



3. Load the custom mapping data into their tables



4. Load the vocabulary data from OHDSI into tables



5. Create the code that will move the source data into the staging table



Step 1: Source data to staging table – Staging table

All events associated with patient

- Visit occurrence
- Observation
- Condition occurrence
- Procedure occurrence
- Measurement
- Drug exposure
- Device exposure
- Specimen

```
person_source_value (VARCHAR(50))
event_start_date (DATE)
event_start_datetime (TIMESTAMP)
event_end_date (DATE)
event_end_datetime (TIMESTAMP)
provider_source_value (VARCHAR(50))
visit_source_value (VARCHAR(50))
visit_detail_source_value (VARCHAR(50))
event_source_value (VARCHAR(250))
event_source_domain_id (VARCHAR(20))
event_source_vocabulary_id (VARCHAR(64))
event_source_maps_to_concept_id (INTEGER)
event_type_category (VARCHAR(50))
value_source_value (VARCHAR(50))
value_domain_id (VARCHAR(20))
value_vocabulary_id (VARCHAR(64))
value_maps_to_concept_id (INTEGER)
unit_source_value (VARCHAR(50))
unit_domain_id (VARCHAR(20))
unit_vocabulary_id (VARCHAR(64))
unit_maps_to_concept_id (INTEGER)
value_as_number (DOUBLE PRECISION)
```

```
stop_reason (VARCHAR(50))
refills (INTEGER)
days_supply (INTEGER)
sig (VARCHAR(65535))
lot_number (VARCHAR(50))
verbatim_end_date (DATE)
route_source_value (VARCHAR(300))
route_domain_id (VARCHAR(20))
route_vocabulary_id (VARCHAR(64))
route_maps_to_concept_id (INTEGER)
table_name (VARCHAR(128))
field_name (VARCHAR(128))
event_sort_category (VARCHAR(20))
event_sort_field (VARCHAR(50))
qid (VARCHAR(200))
load_row_id (BIGINT)
```



Step 2: Staging table to OMOP CDM tables

1

Generate mapping table

- Create the table that will map your source codes to the standard vocabulary

2

Load dimension tables

- Includes person, location, care_site, and provider
- As these are not events, they must be coded separately from the event staging table
- Data from these tables will be used in the fact tables, so this is done first

3

Load fact tables

- Also called event tables, these are where the events go
- The bulk of the data goes into these tables
- Much of the work mapping for these tables will have been done in step 1



Step 3: Code and Unit Testing

QA



- Code review and more in-depth quality assurance
- Code reviews are quick double checks on your code
- More robust QA should be performed at the end as a final check

Validation



- In validation the data itself is checked for consistency and integrity
- Standardized code can be used to check the whole dataset quickly for obvious errors

Achilles



- A program developed by OHDSI to find errors in the data
- Descriptive statistical analysis with reporting and data quality checks



Code Review After ETL Development



Peer review of
new/modified
code



Allows for “another
set of eyes”



Designed to catch
bugs/errors



Enforces standards



Knowledge
Transfer/information
sharing



Reduce
rework/troubleshooting
in the future

```
/// </summary>
/// <param name="orderedChildIds">A collection of child ids.</param>
/// <param name="movedChildId">The id of the moved child.</param>
public void ChangeChildSortOrder(int[] orderedChildIds, int movedChildId)
{
    + if (orderedChildIds == null)
    + {
    +     throw new ArgumentNullException("orderedChildrenIds");
    + }

    + bool found = false;
    + ItemToItem moved = null;
    + ItemToItem previous = null;
    + ItemToItem next = null;
    + foreach (int orderedChildId in orderedChildIds)
    + {
    +     ItemToItem current = ChildItems.FirstOrDefault(c => c.ChildId == orderedChildId);
    +     if (current != null)
    +     {
    +         + if (current.ChildItem.ItemId == movedChildId)
    +         + {
    +             + moved = current;
    +             + found = true;
    +         }
    +         + else
    +         + {
    +             +
    +         }
    +     }
    + }
```





Coding Best Practices

**Code
execution**

Does it work?
Does it follow the ETL
rules?

**Code
documentation**

Can it be interpreted?
Is a guideline or SOP?

**Code
standards**

Are there coding
standards?
Is the code written in
the most efficient way?

**Code
review**

Does it conform to
internal guidelines?
Does both developer
understand the same
ETL rules?



Version Control

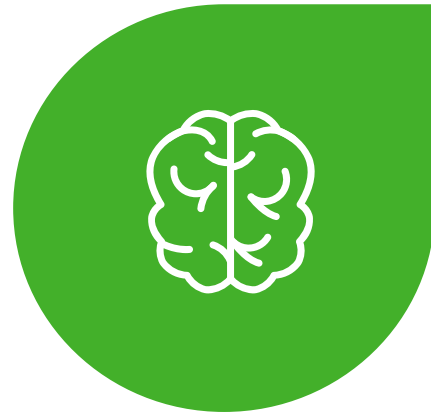


Version control – Why

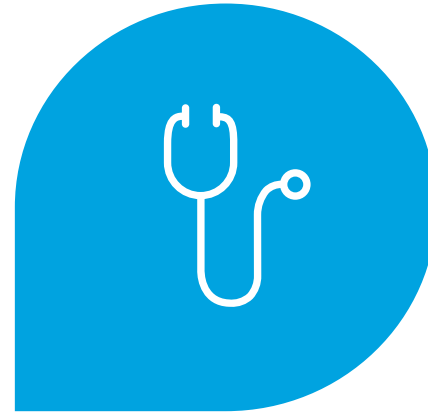
Helps manage changes to a software system over time



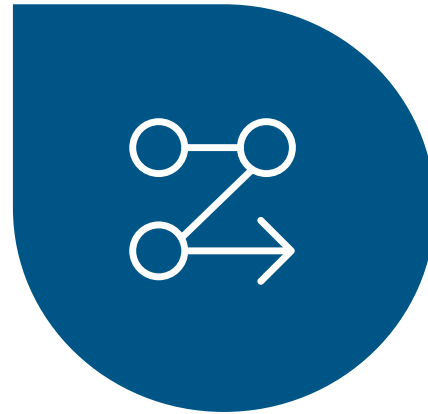
Necessary when multiple users are making changes to your system



Allows easy recovery from mistakes or accidents



Enables branching and versioning for development, QA and production



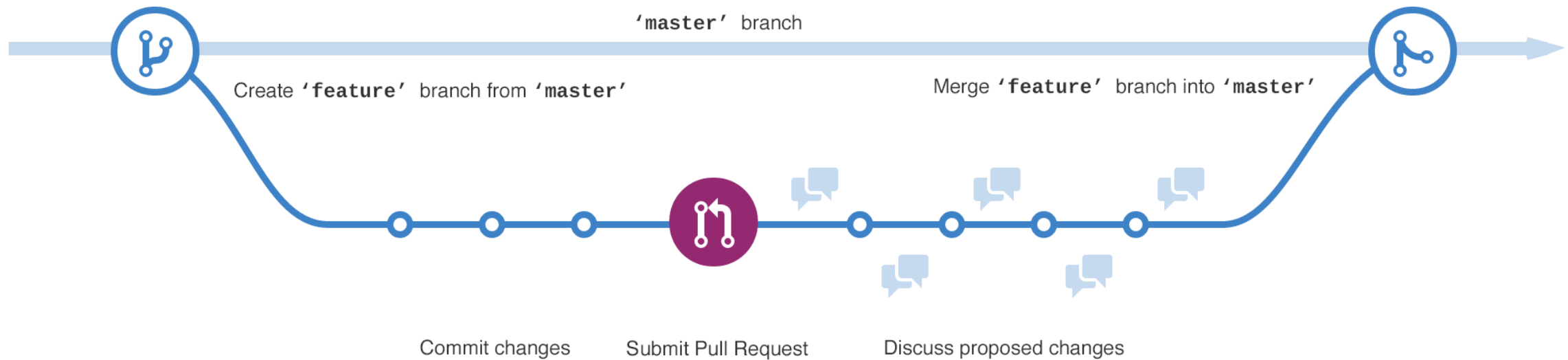


Version control – How

Create branch for bug fixing or new feature development

Merge branch to master when it's ready

Examples of version control include **Subversion (SVN), Github, GitLab, Bitbucket**






Version control – GitHub

- Via web browser

➤ <https://github.com/>

GitHub, Inc. [US] | <https://github.com/OHDSI/ETL-Synthea>

Branch: master ▾ New pull request Find File Clone or download ▾

 fdefalco Update synthea_ddl.sql ... Latest commit 4812a5f 5 days ago

Design	Updated logic for CDM v6.0	2 months ago
ETL/SQL	Update synthea_ddl.sql	5 days ago
R	updated truncate functions to use DatabaseConnector since object_id i...	2 months ago
assets/js	Added file to enable searching	6 months ago
docs	Updated logic for CDM v6.0	2 months ago
extras	Merge pull request #4 from OHDSI/master	2 months ago
inst	added filter on source_vocab_id to match target_vocab_id	last month
man	Renamed LoadCDMTTables to LoadEventTables	2 months ago



OHDSI Technical Resources



OHDSI Site



OHDSI

OBSERVATIONAL HEALTH DATA SCIENCES AND INFORMATICS

[Who We Are](#) ▾ [OHDSI Updates & News](#) ▾ [Standards](#) [Software Tools](#) [OHDSI Studies](#) ▾ [Book of OHDSI](#) ▾ [Resources](#) ▾ [New To OHDSI?](#) ▾

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Welcome to OHDSI!

The Observational Health Data Sciences and Informatics (or OHDSI, pronounced "Odyssey") program is a multi-stakeholder, interdisciplinary collaborative to bring out the value of health data through large-scale analytics. All our solutions are open-source.

2021 OHDSI Symposium

Registration is now open for the 2021 OHDSI Global Symposium, which will take place Sept. 12-15. We are excited to bring together our global community and highlight the incredible work being done towards improving health around the world. This virtual event is free and open to everybody. #JoinTheJourney



Wiki Site

- Helpful documentation and videos
- Notes for meetings and working groups
- Information about studies

The screenshot shows the OHDSI Wiki Site homepage. At the top left is the OHDSI logo. To its right is the text "Observational Health Data Sciences and Informatics". In the top right corner, there is a search bar, a "Log In" link, and links for "Recent Changes", "Media Manager", and "Sitemap". Below the header, a breadcrumb trail reads "Trace: • welcome". On the left side, there is a navigation menu with links for "Documentation", "Video tutorials", "Development", "Research Studies", "Projects & Workgroups", "Meetings & Events", and "Other Resources". Under "Other Resources", there is a list of links: "Community Forums", "2018 Data Network", "OHDSI Directory", "Funding Opportunities", "Conferences", "OHDSI Library", "Mailing Lists", "Realtime Chat (IRC)", and "Community Publications". The main content area features a large "Welcome to OHDSI" section with the OHDSI logo and a paragraph: "OHDSI is a multi-stakeholder, interdisciplinary collaborative that is striving to bring out the value of observational health data through large-scale analytics. The OHDSI Research Network spans over 600 million patients. We hope you'll Join the OHDSI Journey." Below this paragraph is a link to "Find out more at www.ohdsi.org". At the bottom, there are three rounded rectangular boxes: "Learn" (Learn how to implement the OMOP CDM and use OHDSI's analytics tools to get more out of your data.), "Contribute" (Contribute to OHDSI open-source software development and methodology research.), and "Collaborate" (Ask questions of the OHDSI community, join the community calls and the research network.).

Observational Health Data Sciences and Informatics

Search

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Trace: • welcome

Documentation

Video tutorials

Development

Research Studies

Projects & Workgroups

Meetings & Events

Other Resources

- Community Forums
- 2018 Data Network
- OHDSI Directory
- Funding Opportunities
- Conferences
- OHDSI Library
- Mailing Lists
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- Community Publications

Welcome to OHDSI

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Find out more at www.ohdsi.org

Learn

Learn how to implement the **OMOP CDM** and use OHDSI's **analytics tools** to get more out of your data.

Contribute

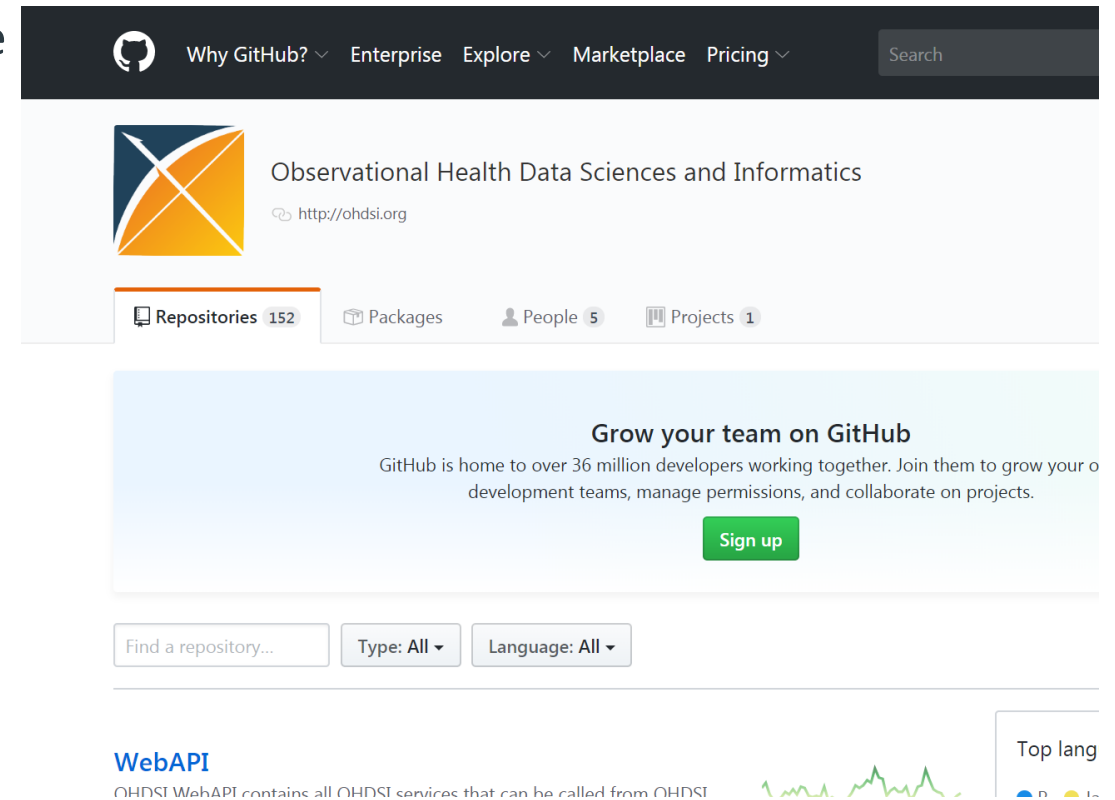
Contribute to OHDSI open-source **software development** and **methodology research**.

Collaborate

Ask questions of the **OHDSI community**, join the **community calls** and the **research network**.



- Contains code for standard DDL scripts for OMOP database
 - github.com/OHDSI/CommonDataModel
- Wiki site specific to OMOP CDM
 - <https://ohdsi.github.io/CommonDataModel/>
- Contains all code for available tools such as
 - White Rabbit/Rabbit in a Hat
 - github.com/OHDSI/WhiteRabbit
 - Usagi
 - github.com/OHDSI/Usagi
 - Atlas
 - github.com/OHDSI/Atlas
 - Achilles
 - github.com/OHDSI/Achilles



The screenshot shows the GitHub profile page for "Observational Health Data Sciences and Informatics". The header includes navigation links: "Why GitHub?", "Enterprise", "Explore", "Marketplace", and "Pricing", along with a search bar. The profile section features the OHDSI logo, the organization name, and the website "http://ohdsi.org". Below this, statistics are shown: 152 Repositories, Packages, 5 People, and 1 Project. A prominent blue banner encourages users to "Grow your team on GitHub" with a "Sign up" button. At the bottom, there is a section for "WebAPI" with a description and a line graph showing repository activity over time.

Why GitHub? Enterprise Explore Marketplace Pricing Search

Observational Health Data Sciences and Informatics
http://ohdsi.org

Repositories 152 Packages People 5 Projects 1

Grow your team on GitHub
GitHub is home to over 36 million developers working together. Join them to grow your organization, manage development teams, manage permissions, and collaborate on projects.
[Sign up](#)

Find a repository... Type: All Language: All


WebAPI
OHDSI/WebAPI contains all OHDSI services that can be called from OHDSI

Top lang



Forums

- Discusses issues and concerns
- Can find answer to questions not in documents
- Helpful to find similar concerns and issues.
- Very active community







Sign UpLog In

SearchMenu

Observational Health Data Sciences and Informatics (OHDSI, pronounced "Odyssey") is an international community of stakeholders committed to bringing out the value of health data through large-scale analytics. If you are a new member-- Welcome! Tell us a bit about yourself on the General forum and let us know how we can help. Learn more at www.ohdsi.org

all categories ▾all tags ▾CategoriesLatest

Category	Topics	Latest
General For general discussion about the OHDSI community and how to get involved.	9 / month	 Welcome to OHDSI 1 Nov '14
Implementers For discussion about how to implement the CDM and OHDSI analytics framework in your local environment.	10 / month	 Requirements Development for the OHDSI Gold Standard Phenotype Library 45 1h ■ Researchers
Developers This forum is for discussion around open-source development of OHDSI applications and other tools that leverage the OMOP CDM.	4 / month	 Small potential ICD10 concept_id 35207155 mapping issue 2 1h ■ Vocabulary Users
Researchers	6 / month	 Mapping labs to LOINC codes where method matters 4 1h



Lunch Break – 1 hour





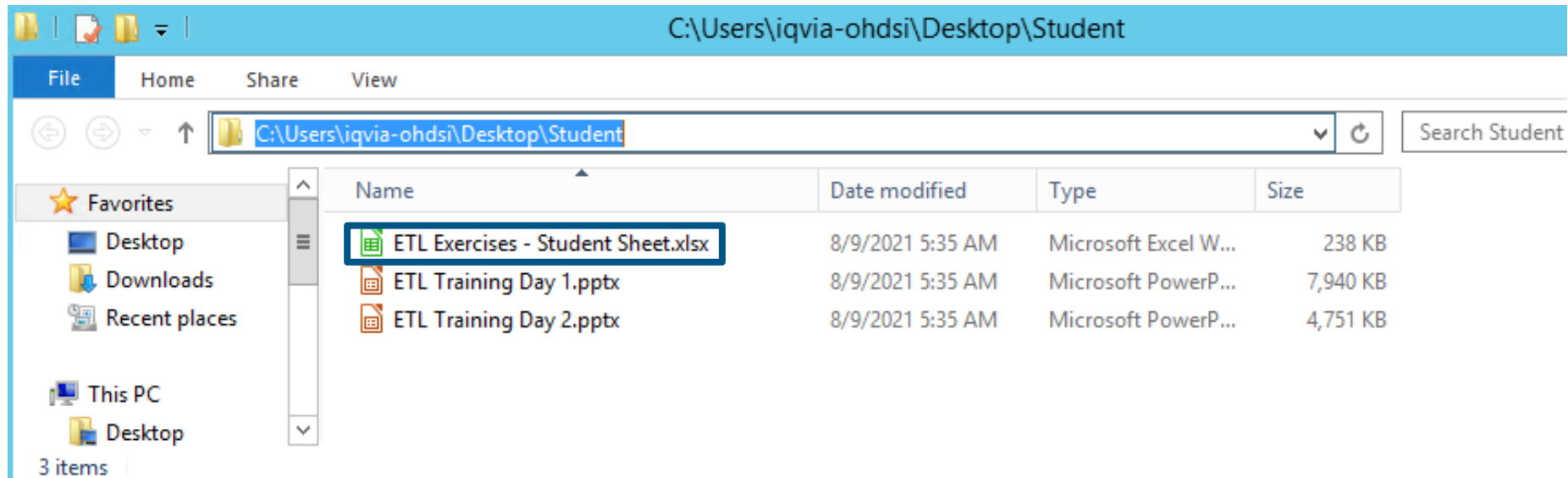
OMOP ETL Development – Exercise





Exercise

- On the Box, go to folder 'C:\Users\iqvia-ohdsi\Desktop\Student'
- Open file 'ETL Exercises - Student Sheet'
- Do exercise in **Day2 ETL Development_1000** tab: take the native data and map to CDM tables
- If time is available, can also do exercises in **Day2 ETL Development_1005** tab and **Day2 ETL Development_1010** tab





**Break
– 15min**





Data Quality Checks



Data quality checks

Data Quality Dashboard

Free tool developed by OHDSI with over 3,000 quality checks. Designed with FDA and EMA in mind

Data quality checks

Achilles

Pre-generated high-level analytics available in a user-friendly webpage



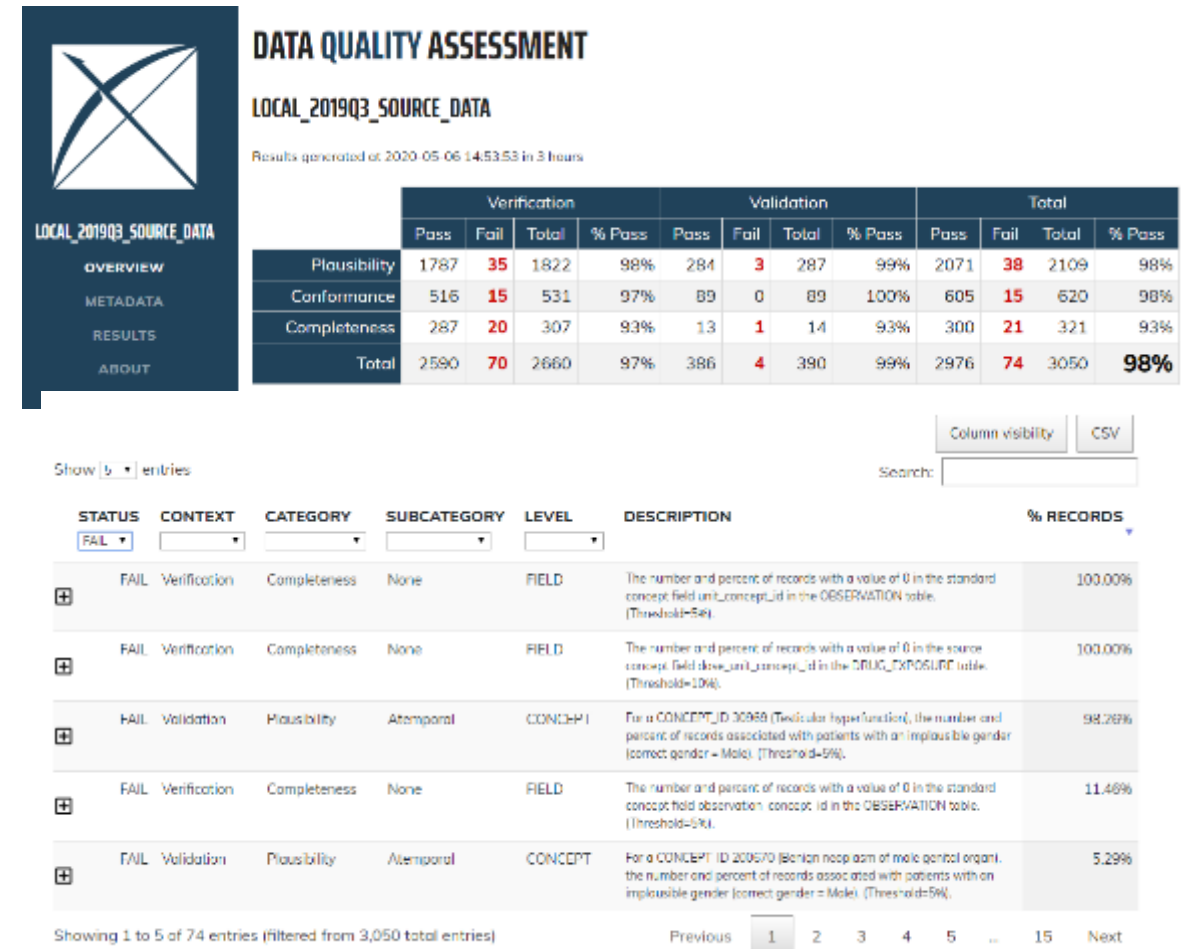
Data Quality Dashboard (DQD)



Description

- Developed in 2019 by OHDSI
 - > IQVIA part of core development team
- Follows the Kahn Framework
 - > <https://www.ncbi.nlm.nih.gov/pmc/articles/PMC5051581/>
- 3000+ checks on plausibility, conformance, completeness
- Executed with each data refresh

Deliverable





Data Quality Dashboard (DQD)



- Runs a prespecified set of data quality checks and thresholds on the CDM



DATA QUALITY ASSESSMENT

SYNTHETIC HEALTH DATABASE

Results generated at 2019-08-22 14:15:06 in 29 mins

	Verification				Validation				Total			
	Pass	Fail	Total	% Pass	Pass	Fail	Total	% Pass	Pass	Fail	Total	% Pass
Plausibility	159	21	180	88%	283	0	283	100%	442	21	463	95%
Conformance	637	34	671	95%	104	0	104	100%	741	34	775	96%
Completeness	369	17	386	96%	5	10	15	33%	374	27	401	93%
Total	1165	72	1237	94%	392	10	402	98%	1557	82	1639	95%



Data Quality Dashboard (DQD)



- DQD Example Rules

Fraction violated rows	Check description	Threshold	Status
0.34	A yes or no value indicating if the provider_id in the VISIT_OCCURRENCE is the expected data type based on the specification.	0.05	FAIL
0.99	The number and percent of distinct source values in the measurement_source_value field of the MEASUREMENT table mapped to 0.	0.30	FAIL
0.09	The number and percent of records that have a value in the drug_concept_id field in the DRUG_ERA table that do not conform to the ingredient class.	0.10	PASS
0.02	The number and percent of records with a value in the verbatim_end_date field of the DRUG_EXPOSURE that occurs prior to the date in the DRUG_EXPOSURE_START_DATE field of the DRUG_EXPOSURE table.	0.05	PASS
0.00	The number and percent of records that have a duplicate value in the procedure_occurrence_id field of the PROCEDURE_OCCURRENCE.	0.00	PASS



DQD – Issues in our data?



- Did DQD notice anything?

SYNTHEA

Results generated at 2019-09-10 01:19:09 in 4 mins

Show 5 entries

Column visibility CSV

Search: condition_concept

	STATUS	CONTEXT	CATEGORY	SUBCATEGORY	LEVEL	DESCRIPTION	% RECORDS
	FAIL	Verification	Completeness	None	FIELD	The number and percent of records with a value of 0 in the standard concept field condition_concept_id in the CONDITION_OCCURRENCE table. (Threshold=5%).	60.86%
	PASS	Validation	Conformance	Relational	FIELD	The number and percent of records with a NULL value in the condition_concept_id of the CONDITION_OCCURRENCE that is considered not nullable. (Threshold=0%).	0%
	PASS	Validation	Conformance	Relational	FIELD	The number and percent of records with a NULL value in the condition_concept_id of the CONDITION_ERA that is considered not nullable. (Threshold=0%).	0%
	PASS	Verification	Conformance	Value	FIELD	A yes or no value indicating if the condition_concept_id in the CONDITION_OCCURRENCE is the expected data type based on the specification. (Threshold=0%).	0%

Showing 1 to 5 of 14 entries (filtered from 3,351 total entries)

Previous 1 2 3 Next



DQD – Maybe we have a bug?



- In the CONDITION_OCCURRENCE, 61% rows are mapped to 0

condition_occurrence_id bigint	person_id bigint	condition_concept_id integer	condition_source_value character varying (250)
1	1	28060	J02.0
2	2	260139	J20
3	2	0	Stroke
4	2	0	Z68.3
5	2	0	Viral sinusitis (disorder)
6	2	0	History of cardiac arrest (sit...
7	2	0	Miscarriage in first trimester
8	2	321042	I46
9	3	313217	I48.91
10	3	432867	E78.4
11	3	40479594	M97.2
12	3	0	Viral sinusitis (disorder)
13	3	0	Acute viral pharyngitis (diso...
14	3	0	Neoplasm of prostate

DQD – Vocabulary to fix the problem

```
2  
3 select * from cdm_synthea_v2.source_to_concept_map
```

Data Output Explain Messages Query History

	source_code character varying (255)	source_concept_id integer	source_vocabulary_id character varying (20)	source_code_description character varying (255)	target_concept_id integer	target_vocabulary_id character varying (20)	v
1	Acute viral pharyngitis (diso...	0	Synthea_conditions	Acute viral pharyngitis (diso...	4112343	SNOMED	1
2	canagliflozin 100 MG Oral T...	0	Synthea_drugs	canagliflozin 100 MG Oral T...	43526467	RxNorm	2
3	Fracture of vertebral colum...	0	Synthea_conditions	Fracture of vertebral colum...	4048695	SNOMED	1
4	Rupture of appendix	0	Synthea_conditions	Rupture of appendix	4166224	SNOMED	1
5	Closed fracture of hip	0	Synthea_conditions	Closed fracture of hip	4230399	SNOMED	1
6	Small cell carcinoma of lung...	0	Synthea_conditions	Small cell carcinoma of lung...	4110591	SNOMED	1
7	Facial laceration	0	Synthea_conditions	Facial laceration	4156265	SNOMED	1
8	Third degree burn	0	Synthea_conditions	Third degree burn	4299128	SNOMED	1
9	Lasix 40mg	0	Synthea_drugs	Lasix 40mg	957138	RxNorm	1
10	Pyelonephritis	0	Synthea_conditions	Pyelonephritis	198199	SNOMED	1
11	Diabetic retinopathy associ...	0	Synthea_conditions	Diabetic retinopathy associ...	4226121	SNOMED	1
12	Major depression disorder	0	Synthea_conditions	Major depression disorder	4152280	SNOMED	1
13	Stroke	0	Synthea_conditions	Stroke	381316	SNOMED	1
14	Hydrochlorothiazide 6.25 MG	0	Synthea_drugs	Hydrochlorothiazide 6.25 MG	19081456	RxNorm	1
15	Protracted diarrhea	0	Synthea_conditions	Protracted diarrhea	4341247	SNOMED	1
16	Suspected lung cancer (situ...	0	Synthea_conditions	Suspected lung cancer (situ...	4038238	SNOMED	1



DQD – Re-run the DQD



SYNTHIA

OVERVIEW

METADATA

RESULTS

ABOUT

SYNTHIA

Results generated at 2019-09-10 12:57:12 in 5 mins

Show entries

Column visibility

CSV

Search: ×

	STATUS	CONTEXT	CATEGORY	SUBCATEGORY	LEVEL	DESCRIPTION	% RECORDS
	<input type="text" value=""/>	<input type="text" value=""/>	<input type="text" value=""/>	<input type="text" value=""/>	<input type="text" value=""/>		
<input type="checkbox"/>	FAIL	Verification	Completeness	None	FIELD	The number and percent of records with a value of 0 in the standard concept field condition_concept_id in the CONDITION_OCCURRENCE table. (Threshold=5%).	14.03%
<input type="checkbox"/>	FAIL	Verification	Completeness	None	FIELD	The number and percent of records with a value of 0 in the standard concept field condition_concept_id in the CONDITION_ERA table. (Threshold=0%).	14.02%
<input type="checkbox"/>	PASS	Validation	Conformance	Relational	FIELD	The number and percent of records with a NULL value in the condition_concept_id of the CONDITION_OCCURRENCE that is considered not nullable. (Threshold=0%).	0%
<input type="checkbox"/>	PASS	Validation	Conformance	Relational	FIELD	The number and percent of records with a NULL value in the condition_concept_id of the CONDITION_ERA that is considered not nullable. (Threshold=0%).	0%
<input type="checkbox"/>	PASS	Verification	Conformance	Value	FIELD	A yes or no value indicating if the condition_concept_id in the CONDITION_OCCURRENCE is the expected data type based on the specification. (Threshold=0%).	0%

Showing 1 to 5 of 14 entries (filtered from 3,351 total entries)

Previous

1

2

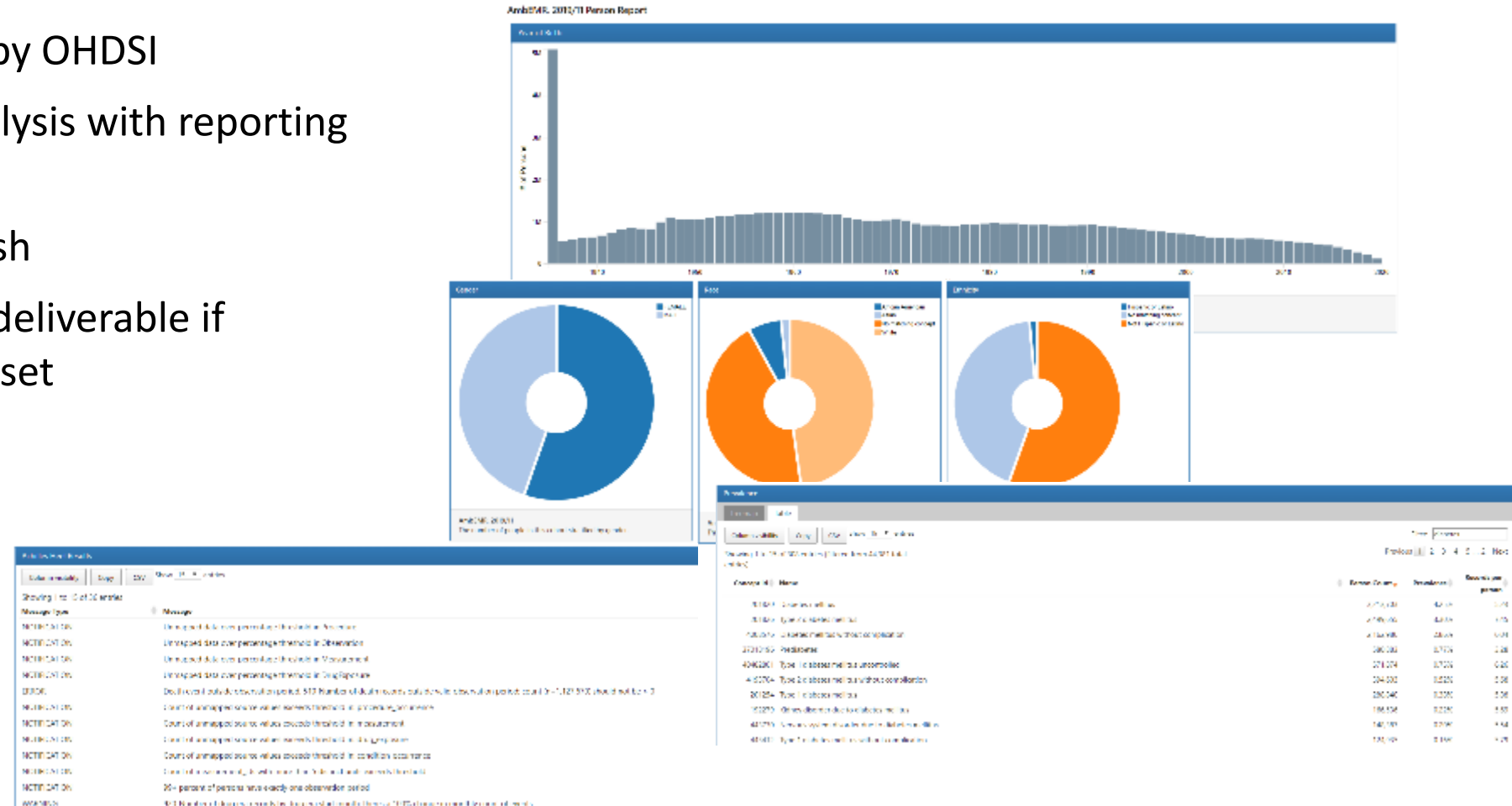
3

Next



- Created and maintained by OHDSI
- Descriptive statistical analysis with reporting and data quality checks
- Executed with each refresh
- Sent to clients as part of deliverable if purchased OMOP data asset

AmbiPAC 2013/14 Person Report





Achilles

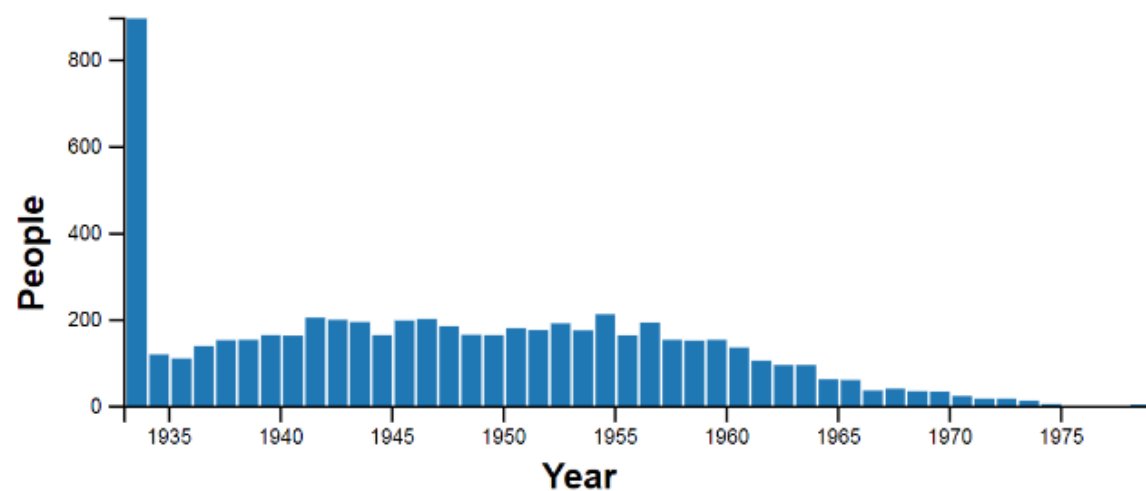
Intersystems v5 July 2018

Person

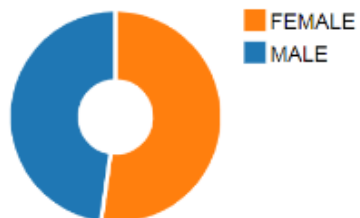
Person Summary

Source name: 0
Number of persons: 6.2k

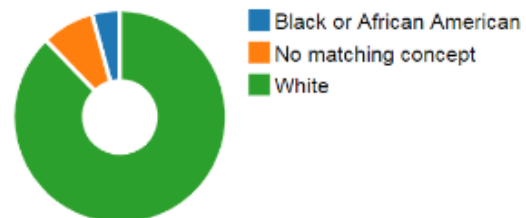
Year of Birth



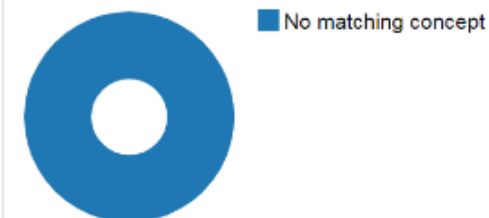
Population by Gender



Population by Race



Population by Ethnicity

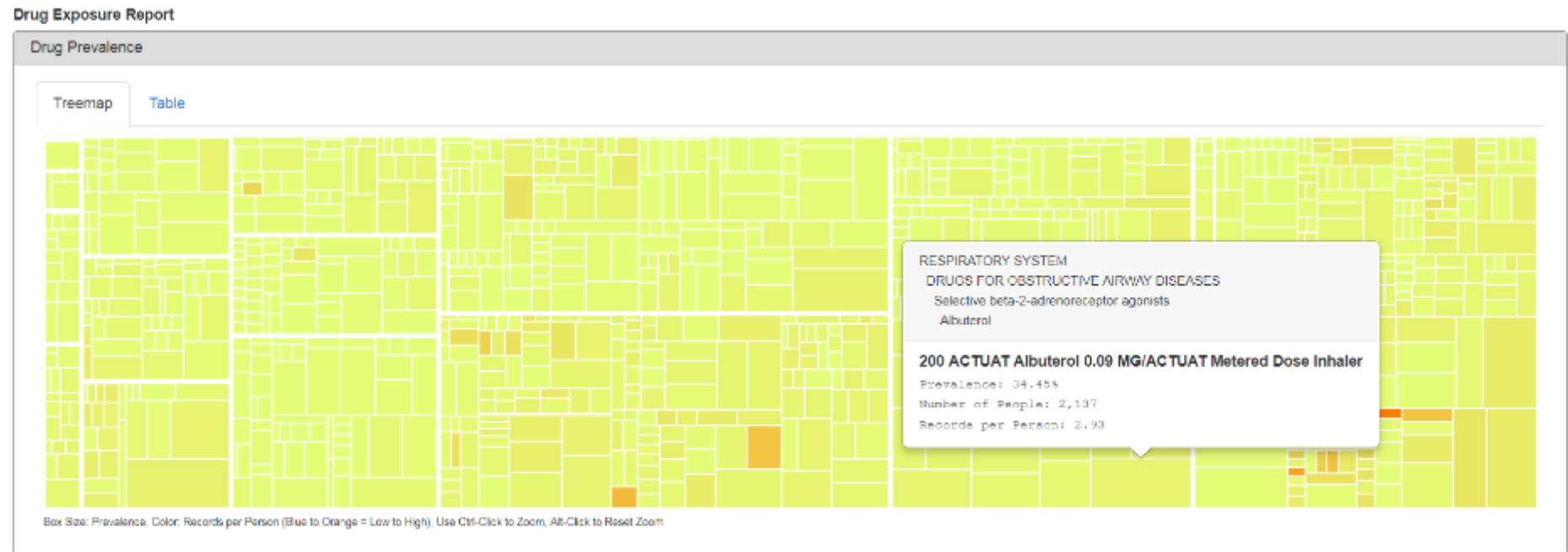




Achilles — Reports by Domain



- Heat map report



- Tabular Report

ATC 1	ATC 5	RxNorm	Person Count	Prevalence	Records per Person
SYSTEMIC HORMONAL PREPARATIONS, EXCL. SEX HORMONES AND INSULINS	Glucocorticoids	Prednisone 20 MG Oral Tablet	2,141	34.51%	3.33
RESPIRATORY SYSTEM	Selective beta-2-adrenoreceptor agonists	200 ACTUAT Albuterol 0.09 MG/ACTUAT Metered Dose Inhaler	2,137	34.45%	2.93
NERVOUS SYSTEM	Natural opium alkaloids	Acetaminophen 325 MG / Oxycodone Hydrochloride 5 MG Oral Tablet [Percocet]	2,108	33.98%	4.44
NERVOUS SYSTEM	Anilides	Acetaminophen 325 MG / Oxycodone Hydrochloride 5 MG Oral Tablet [Percocet]	2,108	33.98%	4.44
RESPIRATORY SYSTEM	Selective beta-2-adrenoreceptor agonists	200 ACTUAT Albuterol 0.09 MG/ACTUAT Metered Dose Inhaler [ProAir]	1,774	28.59%	3.71



Achilles – Achilles Heel Report

Data Quality Messages

Message Type	▲ Message
ERROR	101-Number of persons by age, with age at first observation period; should not have age < 0, (n=50,649)
ERROR	103 - Distribution of age at first observation period (count = 1); min value should not be negative
ERROR	114-Number of persons with observation period before year-of-birth; count (n=50,652) should not be > 0
ERROR	206 - Distribution of age by visit_concept_id (count = 6); min value should not be negative
ERROR	208-Number of visit records outside valid observation period; count (n=196,713,802) should not be > 0
ERROR	209-Number of visit records with end date < start date; count (n=79,919) should not be > 0
ERROR	406 - Distribution of age by condition_concept_id (count = 11,509); min value should not be negative
ERROR	411-Number of condition occurrence records with end date < start date; count (n=83,730) should not be > 0
ERROR	510-Number of death records outside valid observation period; count (n=122) should not be > 0
ERROR	600-Number of persons with at least one procedure occurrence, by procedure_concept_id; 531 concepts in data are not in correct vocabulary
ERROR	606 - Distribution of age by procedure_concept_id (count = 6,005); min value should not be negative
ERROR	706 - Distribution of age by drug_concept_id (count = 6,096); min value should not be negative
ERROR	711-Number of drug exposure records with end date < start date; count (n=862) should not be > 0
ERROR	715 - Distribution of days_supply by drug_concept_id (count = 6,050); min value should not be negative
ERROR	717 - Distribution of quantity by drug_concept_id (count = 3,762); min value should not be negative



80/20 Rule

Conclusions

Raw data can be accurately transformed into the OMOP CDM with acceptable information loss across domains. CDM structure was adequate and vocabulary mappings were assessed to be high quality.

Lessons Learned

ETL helps standardize source data to research quality. The goal is to accurately transform the data into CDM format and standardized terms with acceptable information loss, and high-frequency source codes are mapped.



*Cited from "Fidelity assessment of a clinical practice research datalink conversion to the OMOP CDM model"



Data Quality Checks – Exercise



Thank You!