



2022
US
INTERCHANGE
26-27 OCTOBER | AUSTIN



Processing real-world data for regulatory decisions:
minimizing data loss, maximizing information

Presented by Tasha Nagamine | Droice Labs



Meet the Speaker

Tasha Nagamine, MS

Title: Cofounder & CTO

Organization: Droice Labs

Tasha is an entrepreneur and seasoned technologist with 10+ years of experience in AI, research, and tech strategy. She brings deep expertise in RWD to build data-driven products that have processed over 100 million patient lives. Tasha received her BS in physics from Brown University and left a PhD in deep learning at Columbia University to start Droice.



Disclaimer and Disclosures

- *The views and opinions expressed in this presentation are those of the author(s) and do not necessarily reflect the official policy or position of CDISC.*
- *Tasha Nagamine is an employee of Droice Labs, a company that processes and prepares RWD for clinical and research applications.*

Studies used to demonstrate the safety and effectiveness of a drug should reflect the diversity of patients that the drug is intended for¹

Clinical trial populations

- Small N
- Homogeneous
- Low noise



Real-world populations

- Large N
- Heterogeneous
- High noise



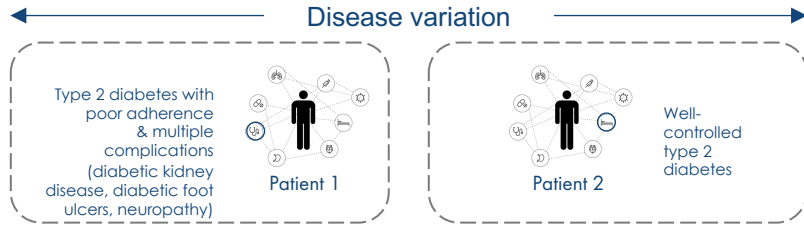
CHALLENGES WITH RWD

Because of the variation across patients, physicians, & sources...

...Diabetes will manifest differently in the data for different patients

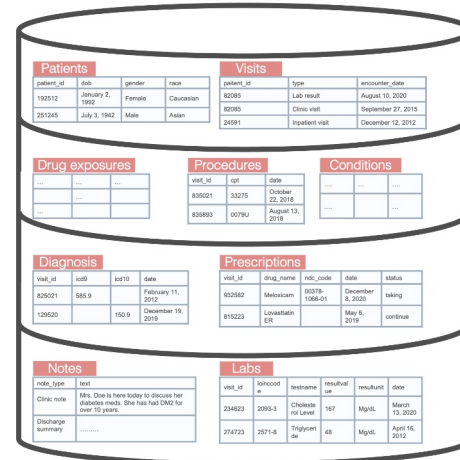
CHALLENGES WITH RWD

Because of the variation across patients, physicians, & sources...



...Diabetes will manifest differently in the data for different patients

Data source



Patients				Visits		
patient_id	dob	gender	race	patient_id	type	encounter_date
192512	January 2, 1992	Female	Caucasian	82085	Lab result	August 19, 2020
251245	July 3, 1942	Male	Asian	82095	Clinic visit	September 27, 2015
				24591	Inpatient visit	December 12, 2012

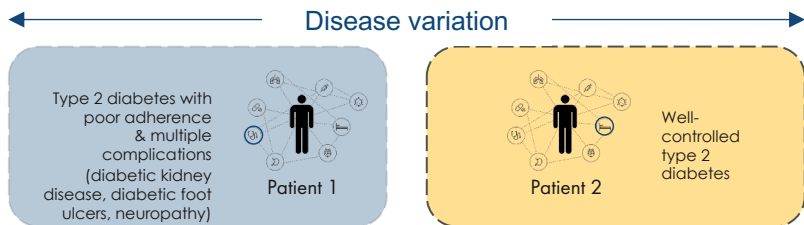
Drug exposures			Procedures		Conditions		
visit_id	cpt	date	visit_id	date	icd10	date	status
...	835021	33275	Cataract	22, 2018	...
...	83883	0079U		August 13, 2018	...

Diagnosis				Prescriptions				
visit_id	icd9	icd10	date	visit_id	drug_name	ndc_code	date	status
82021	885.9		February 11, 2012	82582	Meloxicam	00378-1066-01	December 8, 2020	taking
120520		150.9	December 19, 2019	815223	Losartatan ER		May 6, 2019	continus

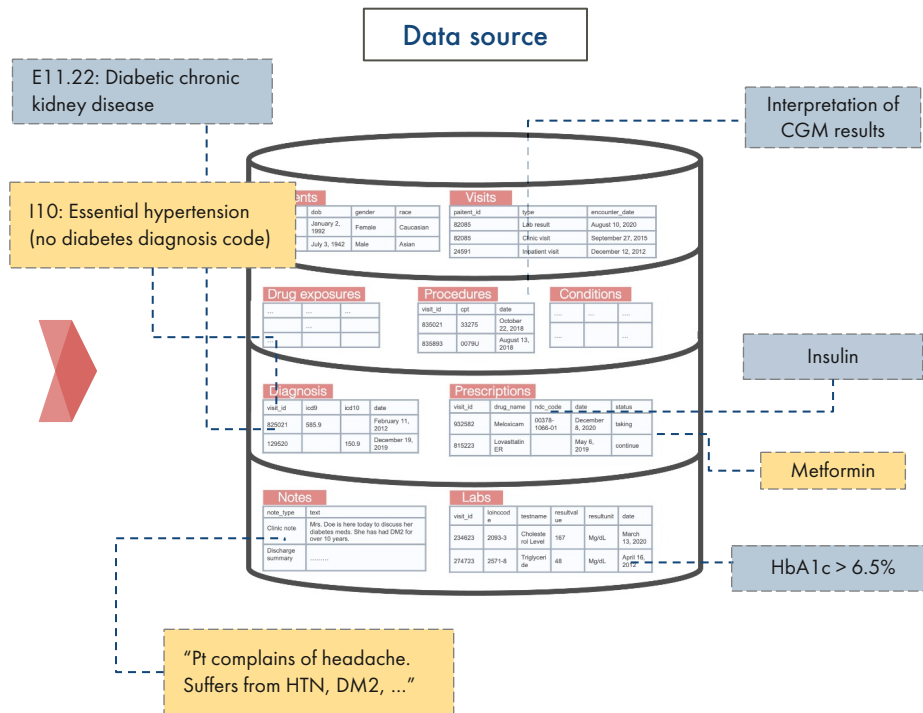
Notes		Labs					
note_type	text	visit_id	biocood	testname	resultval	resultunit	date
Clinic note	Mrs. Doe is here today to discuss her diabetes results. She has had DM2 for over 10 years.	224823	2093-3	Cholesterol Level	167	Mg/dL	March 13, 2020
Discharge summary	224723	2071-8	Triglyceride	48	Mg/dL	April 16, 2012

CHALLENGES WITH RWD

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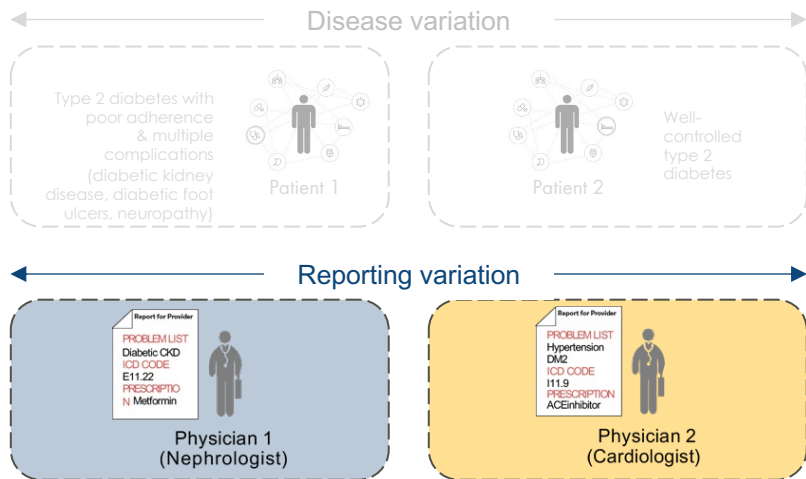


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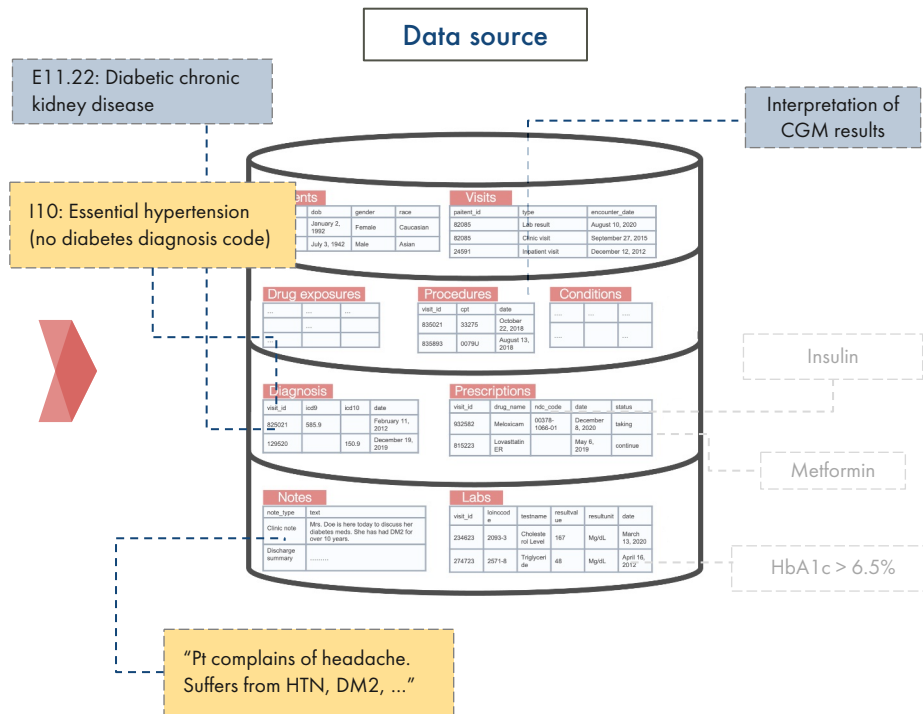


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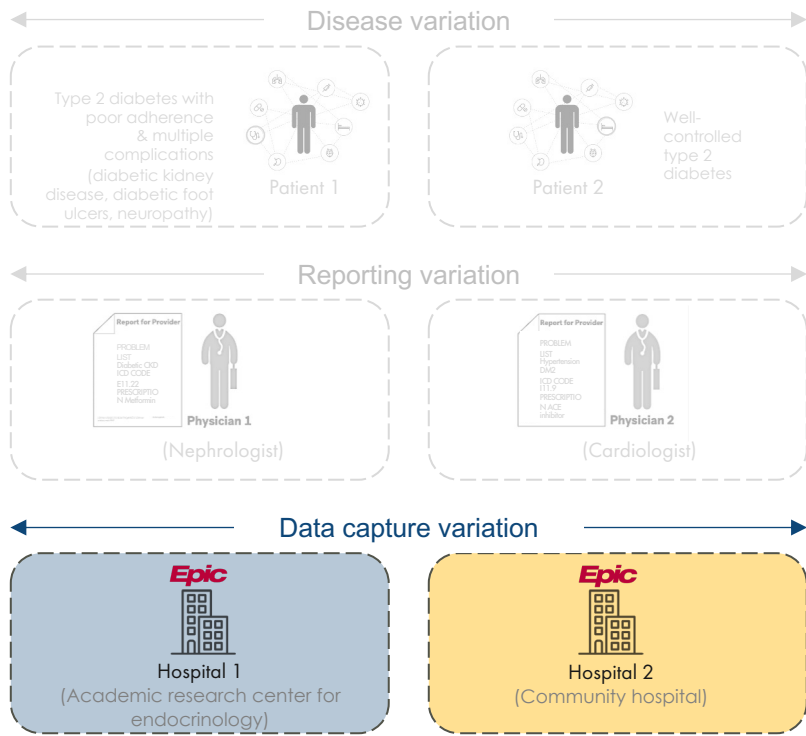


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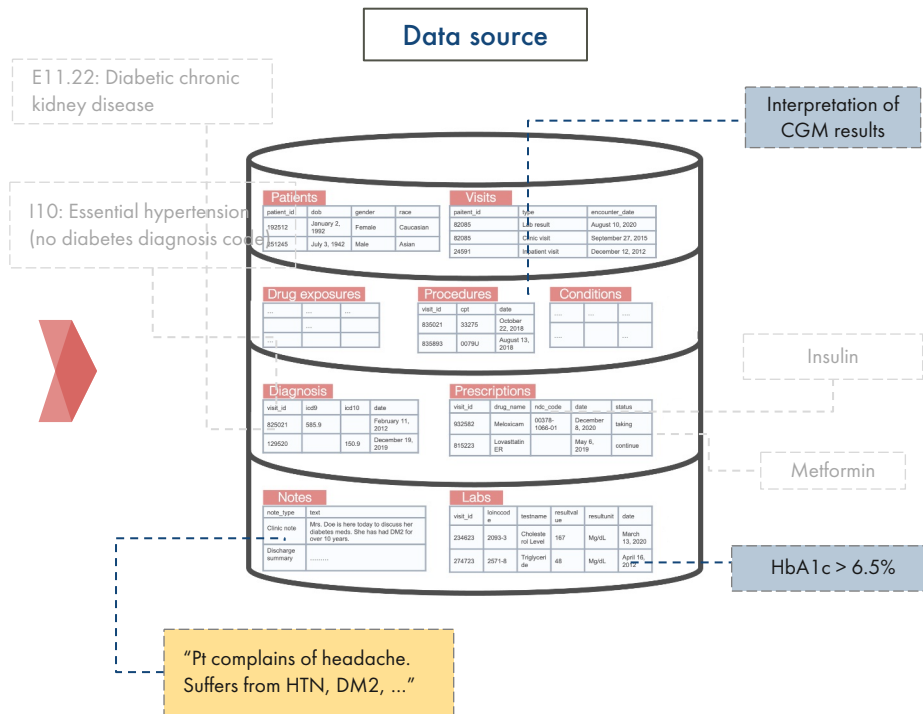


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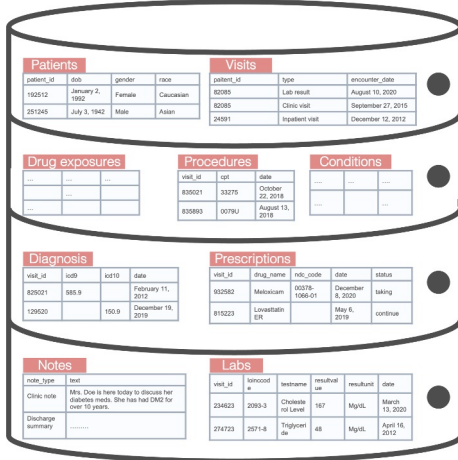


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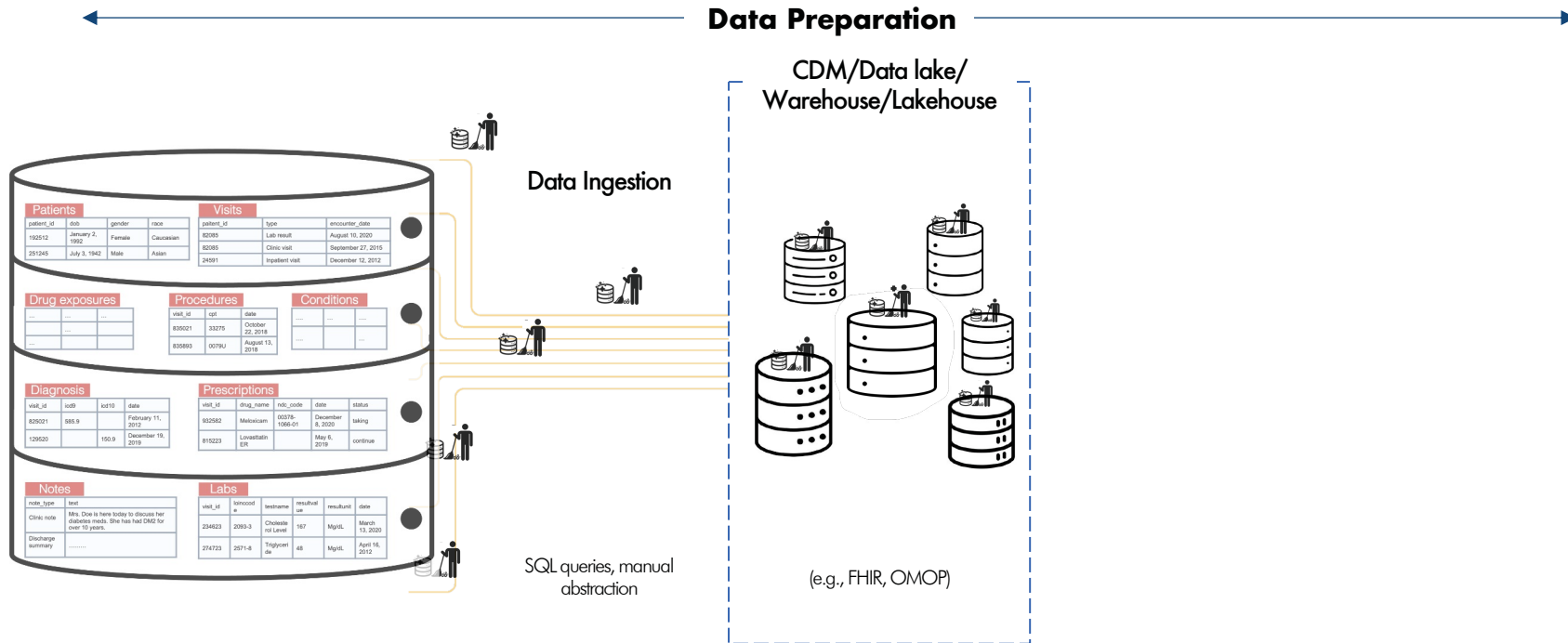


CURRENT STATE OF HEALTHCARE DATA: INFORMATION LOSS

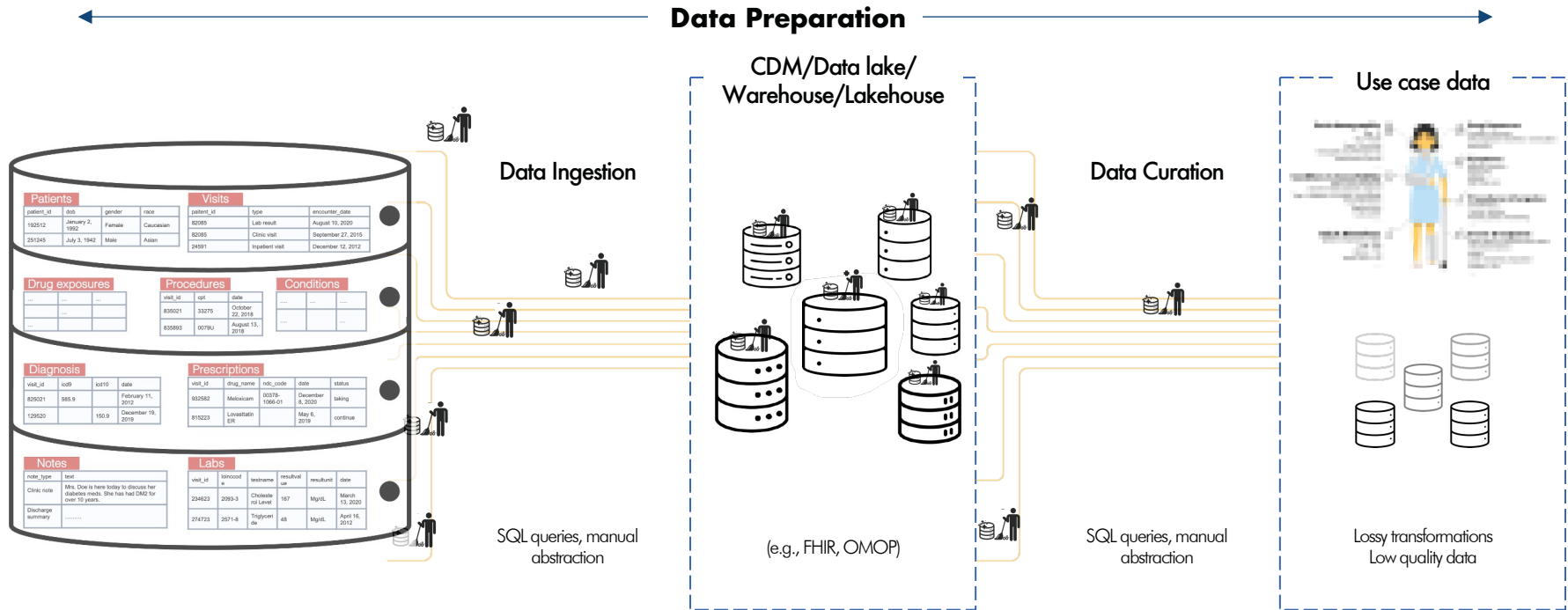
Data Preparation



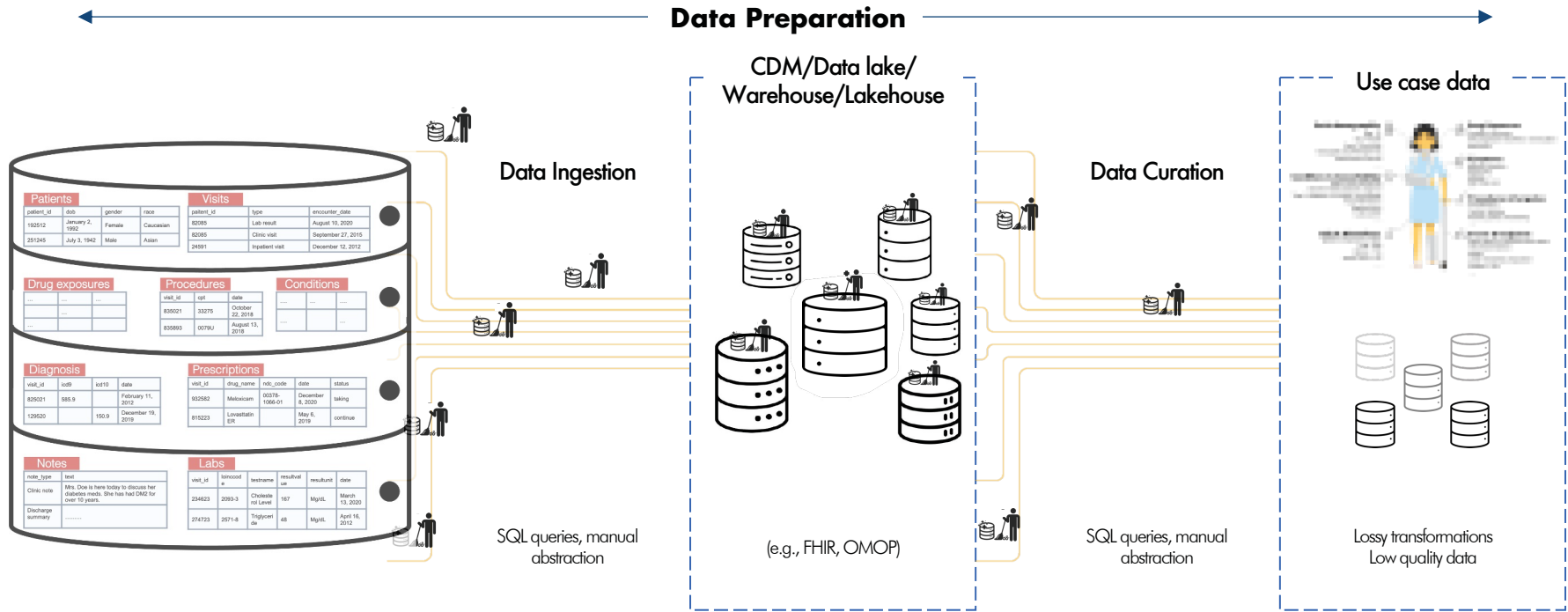
CURRENT STATE OF HEALTHCARE DATA: INFORMATION LOSS



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CURRENT STATE OF HEALTHCARE DATA: INFORMATION LOSS



Patients				Visits		
patient_id	sex	gender	race	patient_id	type	encounter_date
102512	1992	Female	Caucasian	82085	Lab result	August 10, 2020
291245	July 2, 1942	Male	Asian	82085	Clinic visit	September 27, 2015
				24591	Inpatient visit	December 12, 2012

Drug exposures			Procedures			Conditions		
...	visit_id	cpt	date
...	836621	34275	October 22, 2019
...	836893	9079U	August 13, 2018

Diagnosis			Prescriptions				
visit_id	icd9	icd10	date	visit_id	drug_name	rxc_code	status
829221	586.9		February 11, 2012	932582	Meloxicam	1027B	December 8, 2020
129620		150.9	December 19, 2019	819223	Losartan ER	1066.01	May 8, 2019
							continue

Notes		Labs					
note_type	text	visit_id	laboratory	testname	result/val	resultunit	date
Clinic note	Mrs. Dow is here today to discuss her cholesterol results. She has had DM2 for over 10 years.	234823	2093-3	Cholesterol total	167	Mg/dL	March 13, 2020
Discharge summary	274723	2071-4	Triglyceride	48	Mg/dL	April 16, 2012

✗ **Speed**
Slow & manual

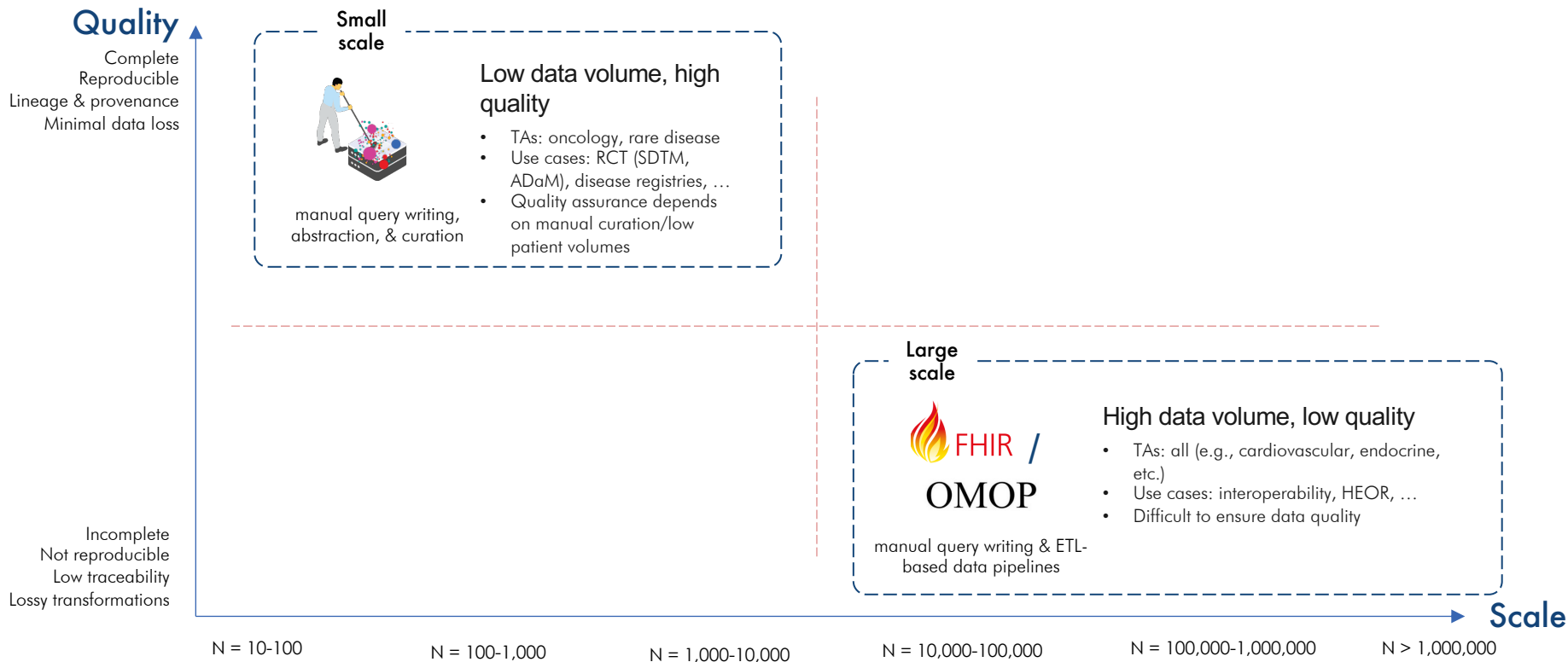
✗ **Reproducibility**
Difficult to port & reproduce

✗ **Traceability**
Lacks transparency

✗ **Quality**
Incomplete, lossy & error-prone

✗ **Cost**
Expensive & inefficient

TRADEOFF: SCALE VS. QUALITY



CHRONIC KIDNEY DISEASE

CKD is often under-coded or underreported, depending on practice variation/billing incentives in RWD.

CKD

RAW
DATA

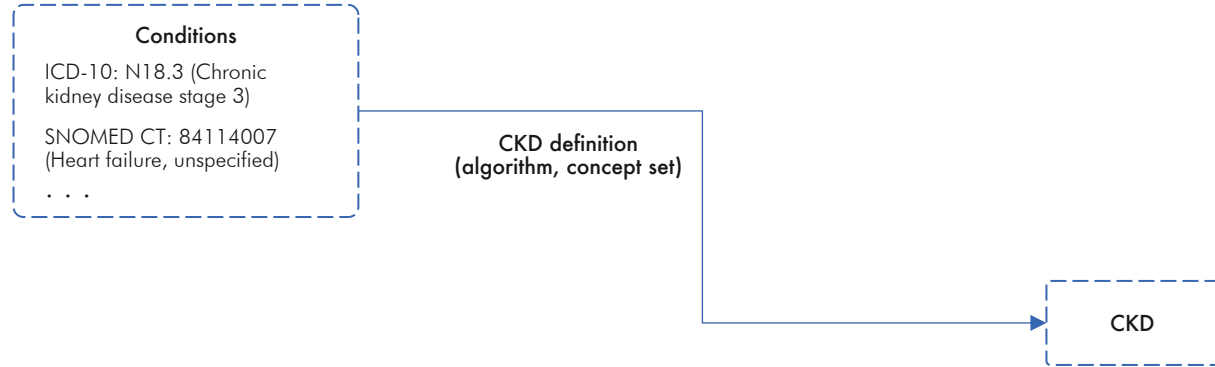
FHIR/OMOP
DATA

PHENOTYPED
DATA

ANALYSIS-READY
DATA

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DATA

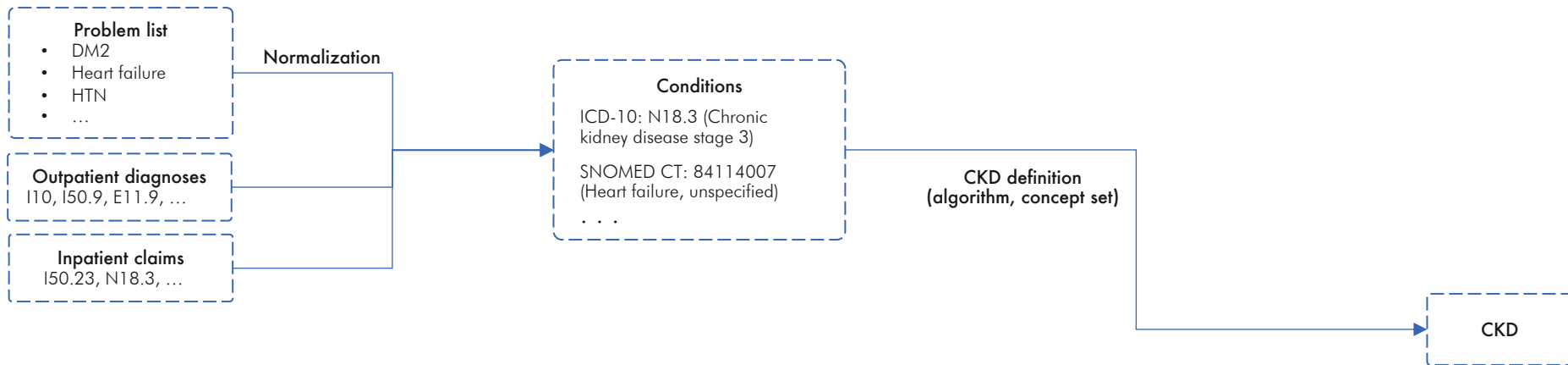
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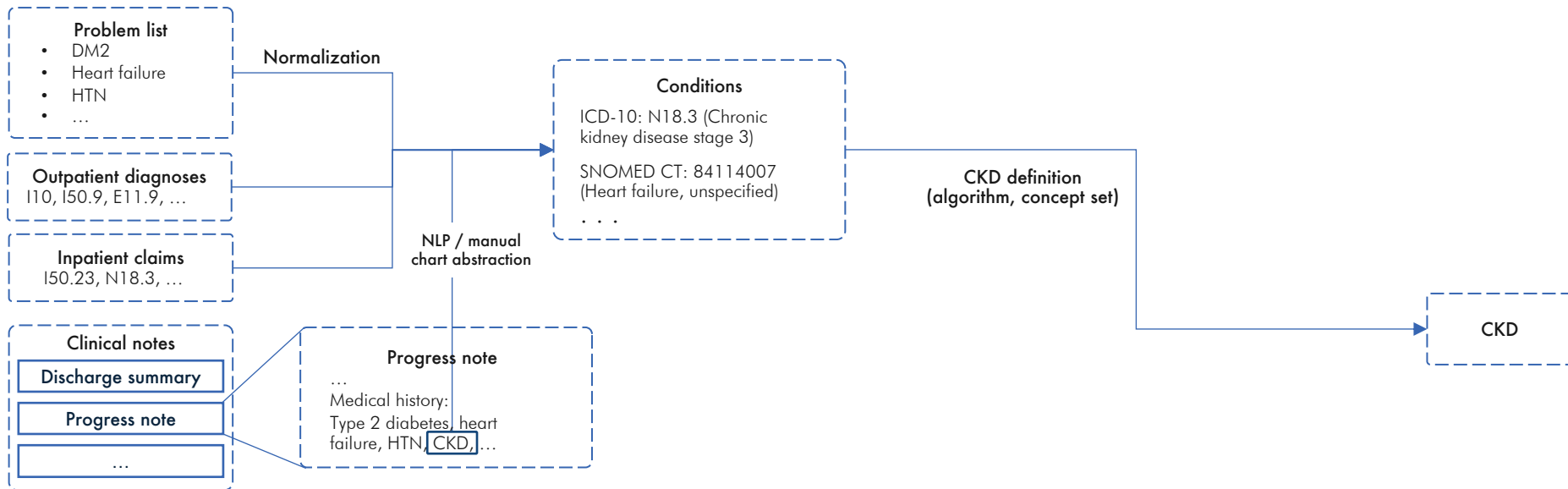
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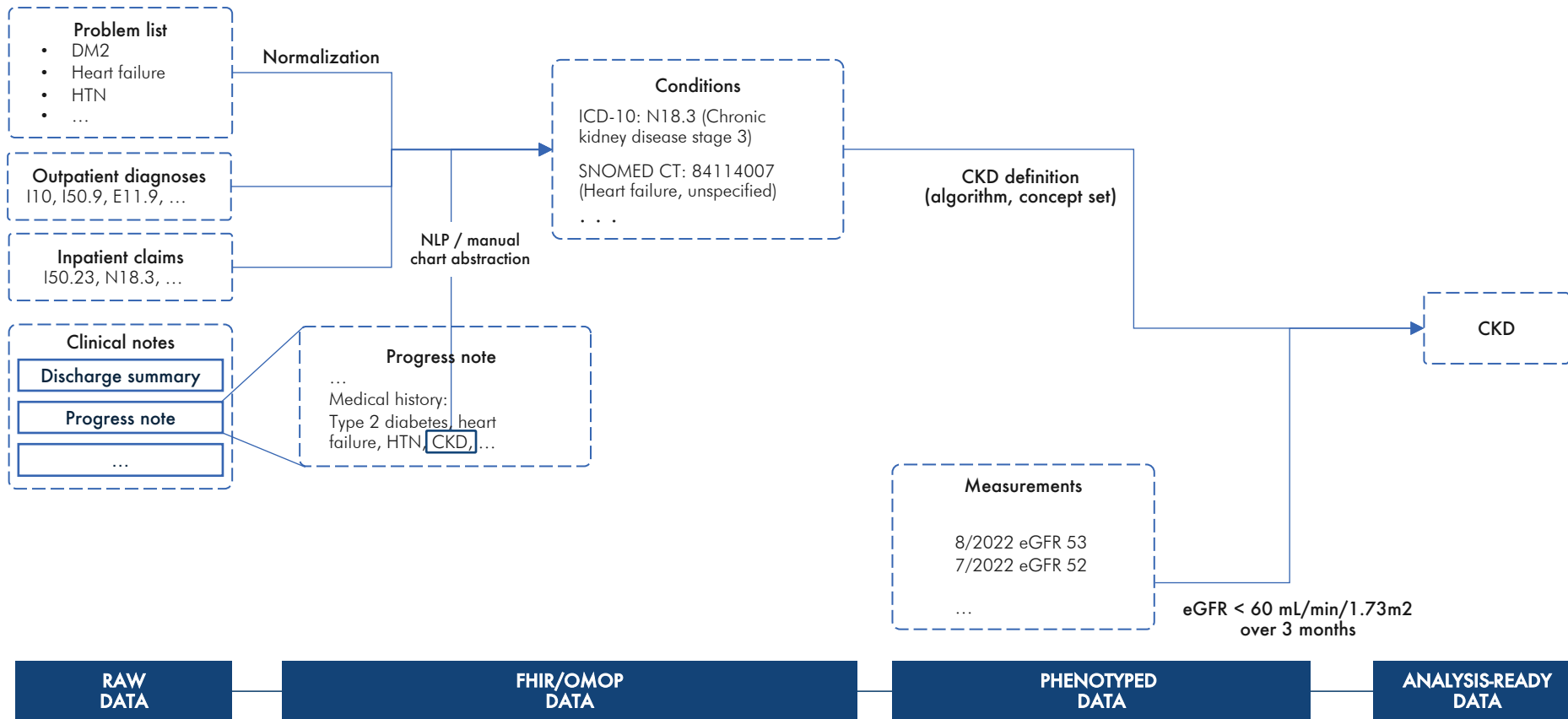
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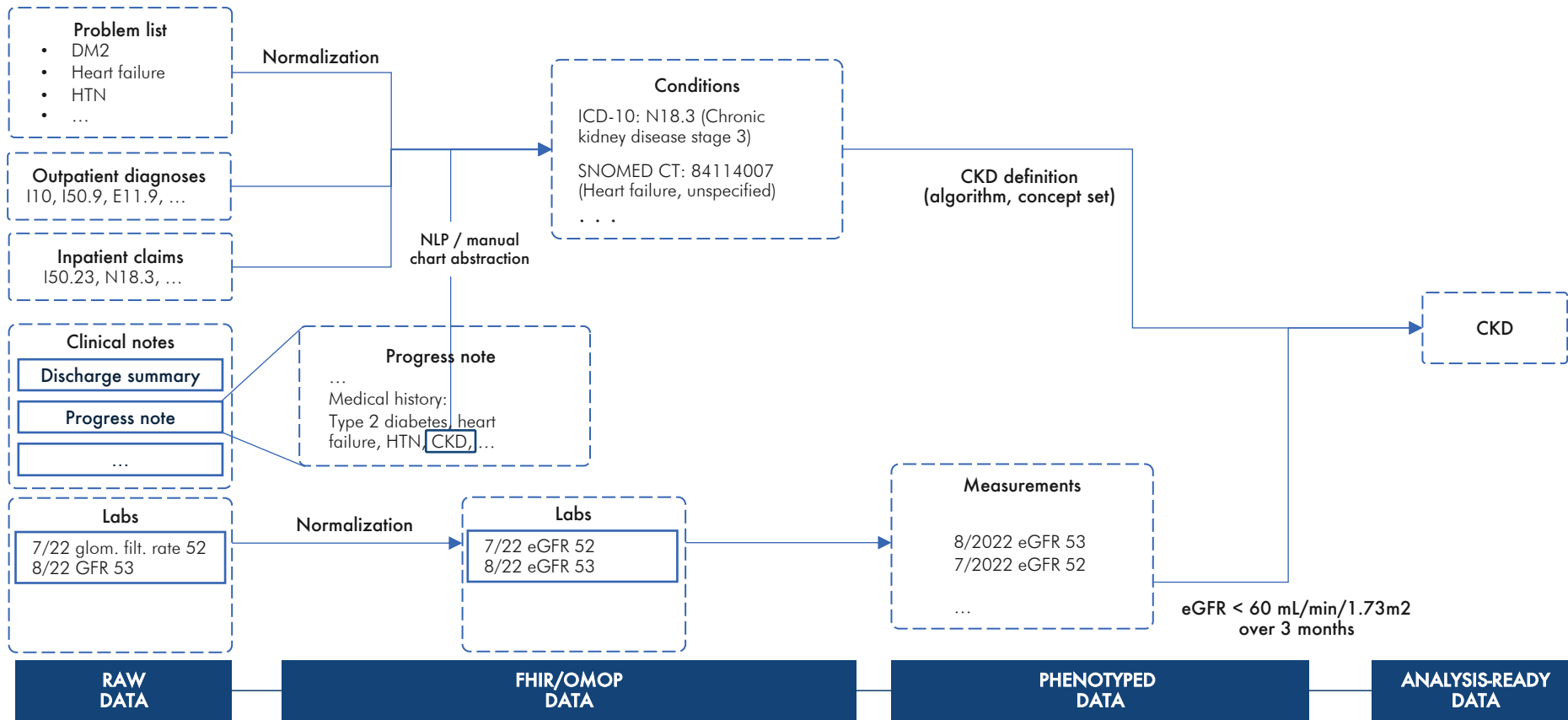
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DATA

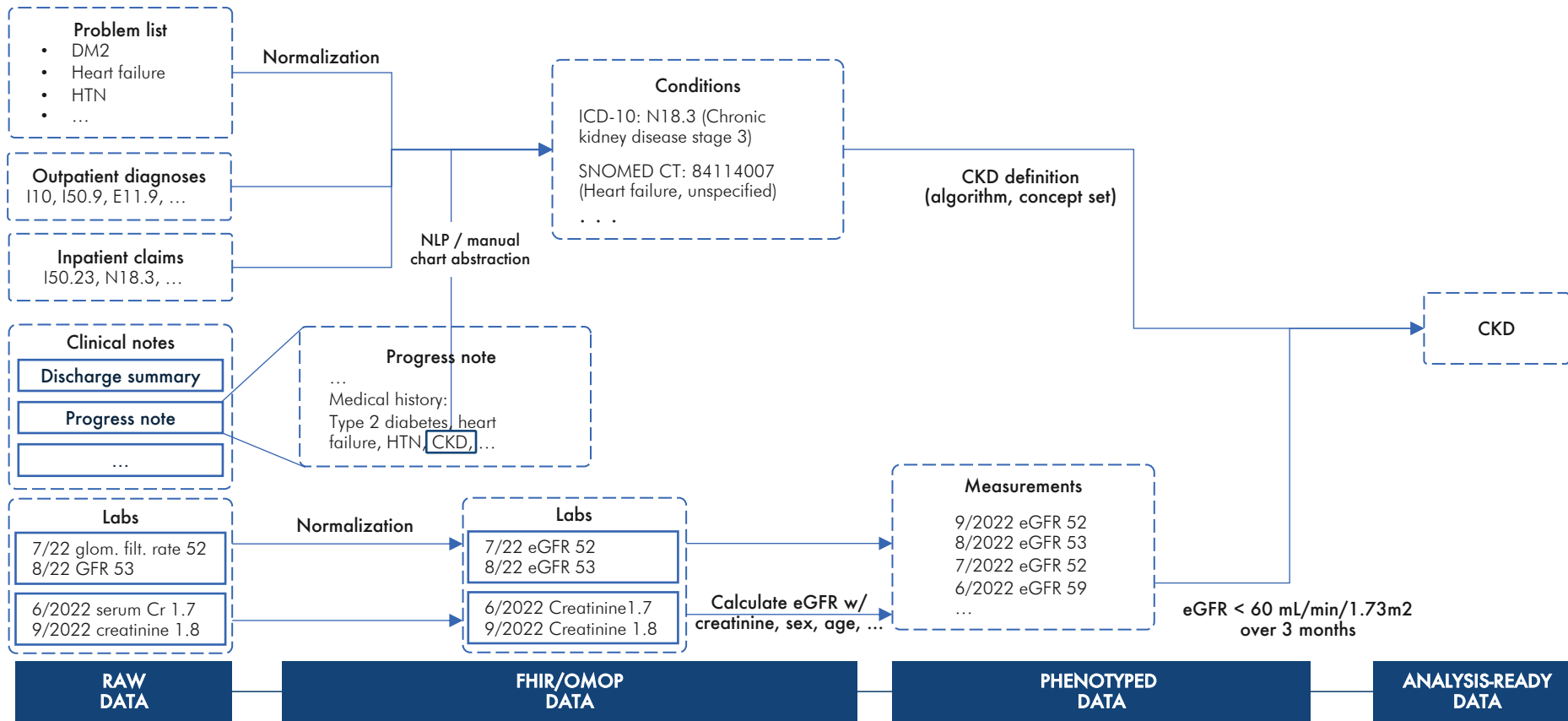
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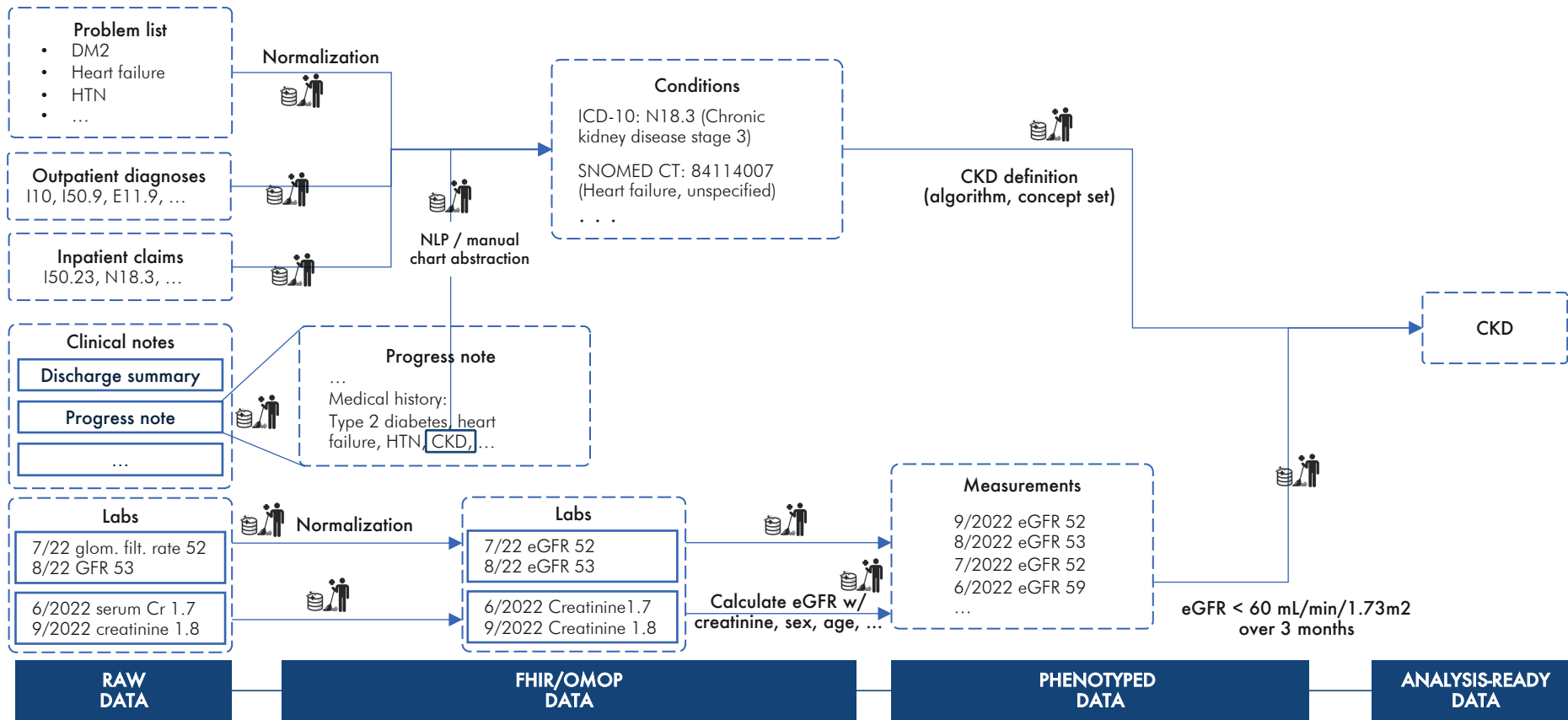
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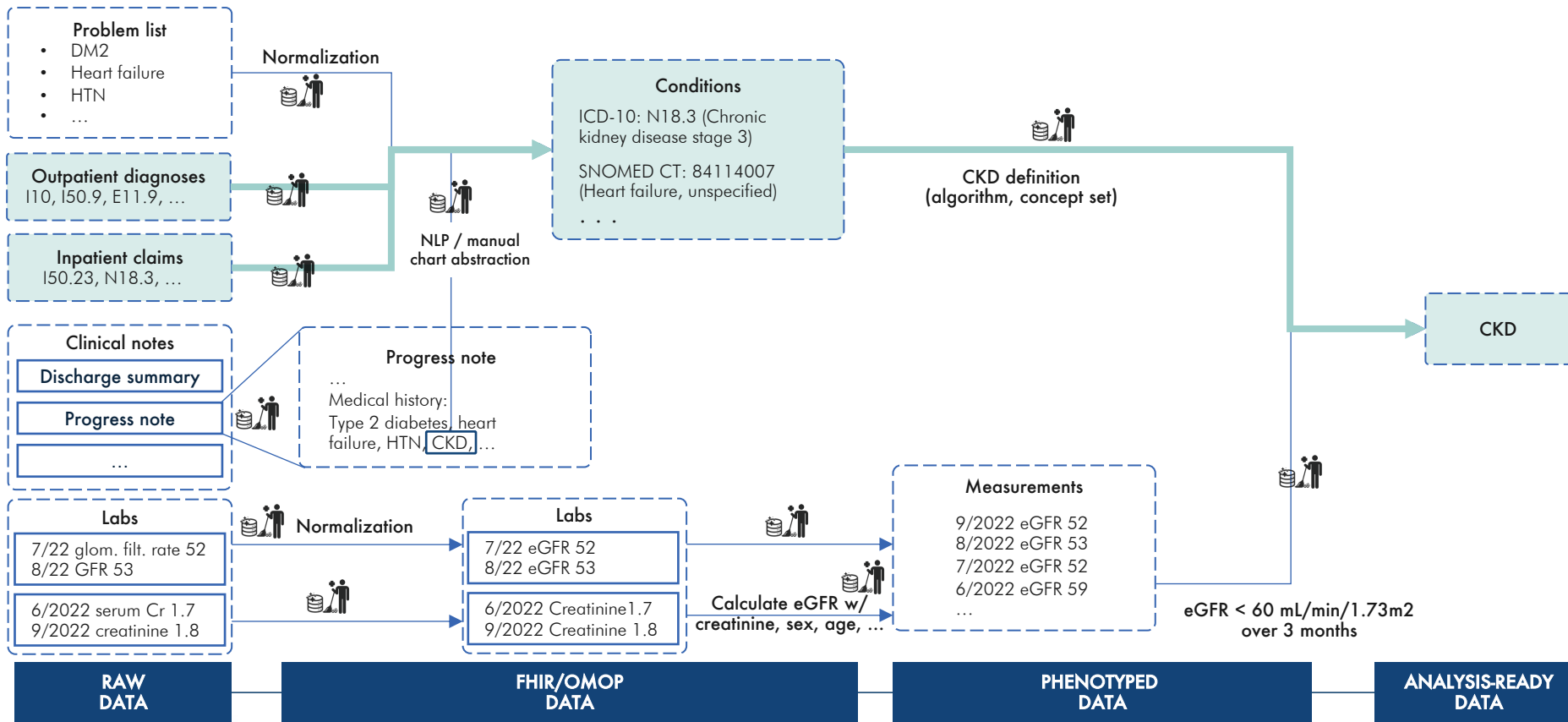
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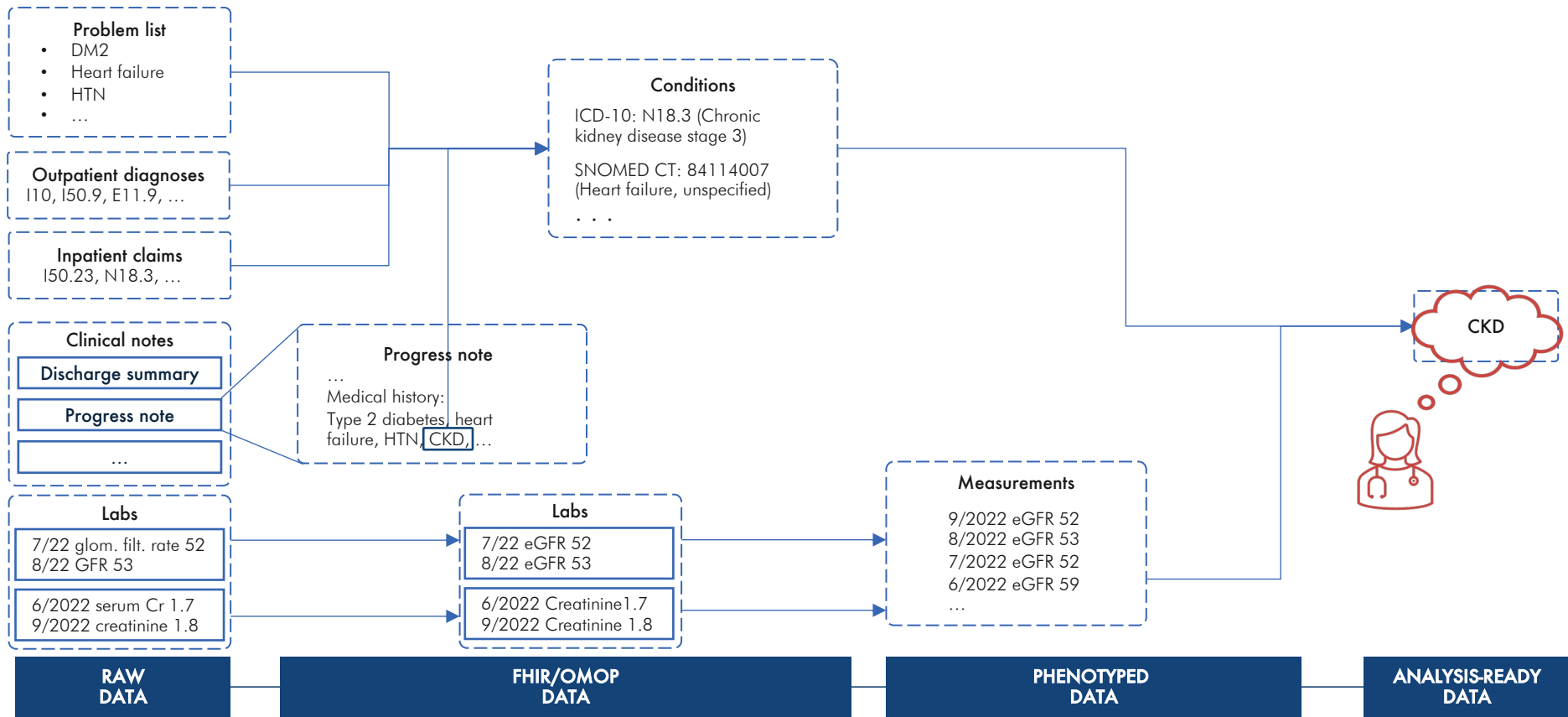


CHRONIC KIDNEY DISEASE

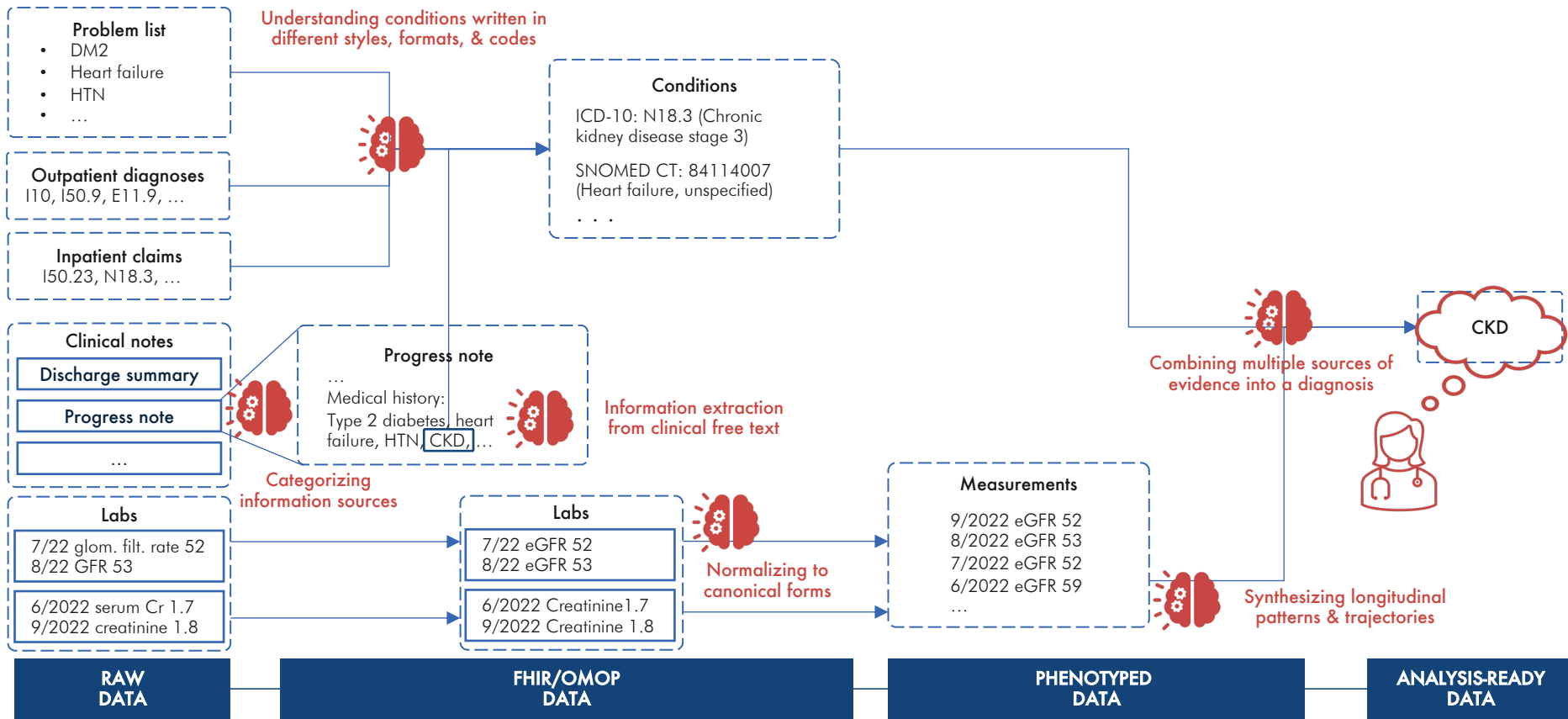
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AN INTELLIGENCE-BASED APPROACH

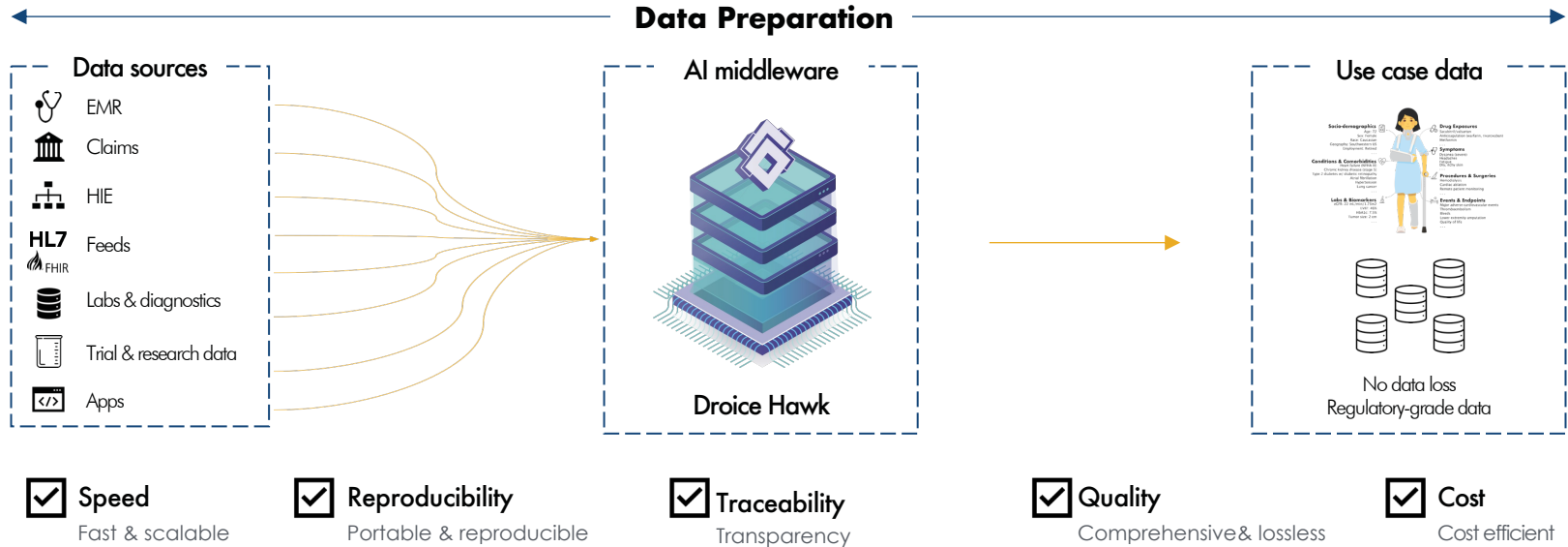


AN INTELLIGENCE-BASED APPROACH



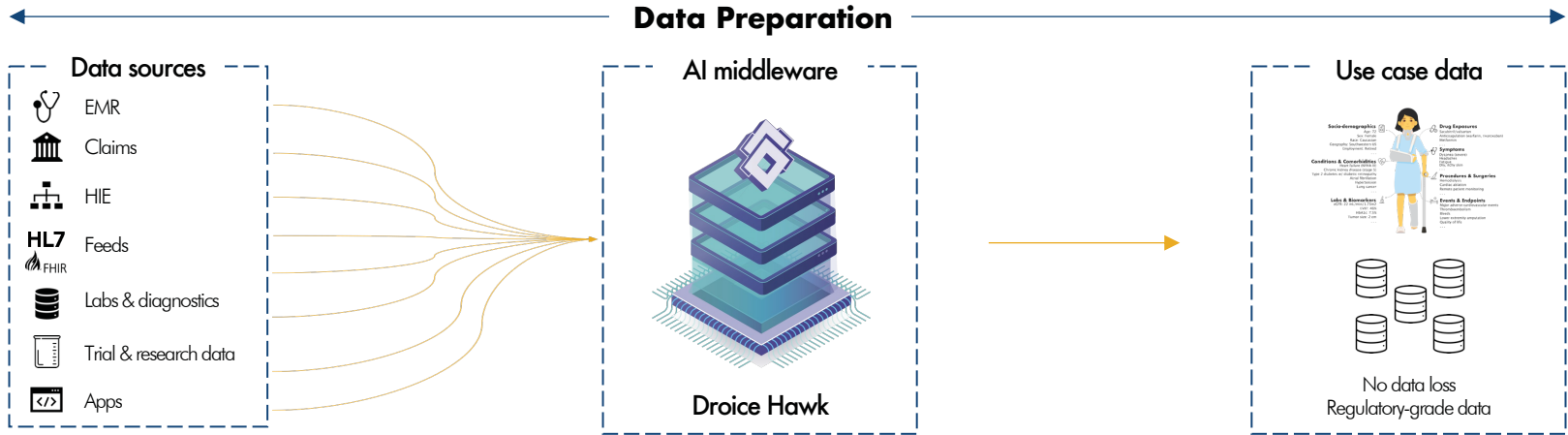
AI MIDDLEWARE APPROACH

Required for general purpose RWD (i.e., data with large N & high noise) to maximize information and minimize data loss.



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Required for general purpose RWD (i.e., data with large N & high noise) to maximize information and minimize data loss.



Speed
Fast & scalable

Reproducibility
Portable & reproducible

Traceability
Transparency

Quality
Comprehensive & lossless

Cost
Cost efficient

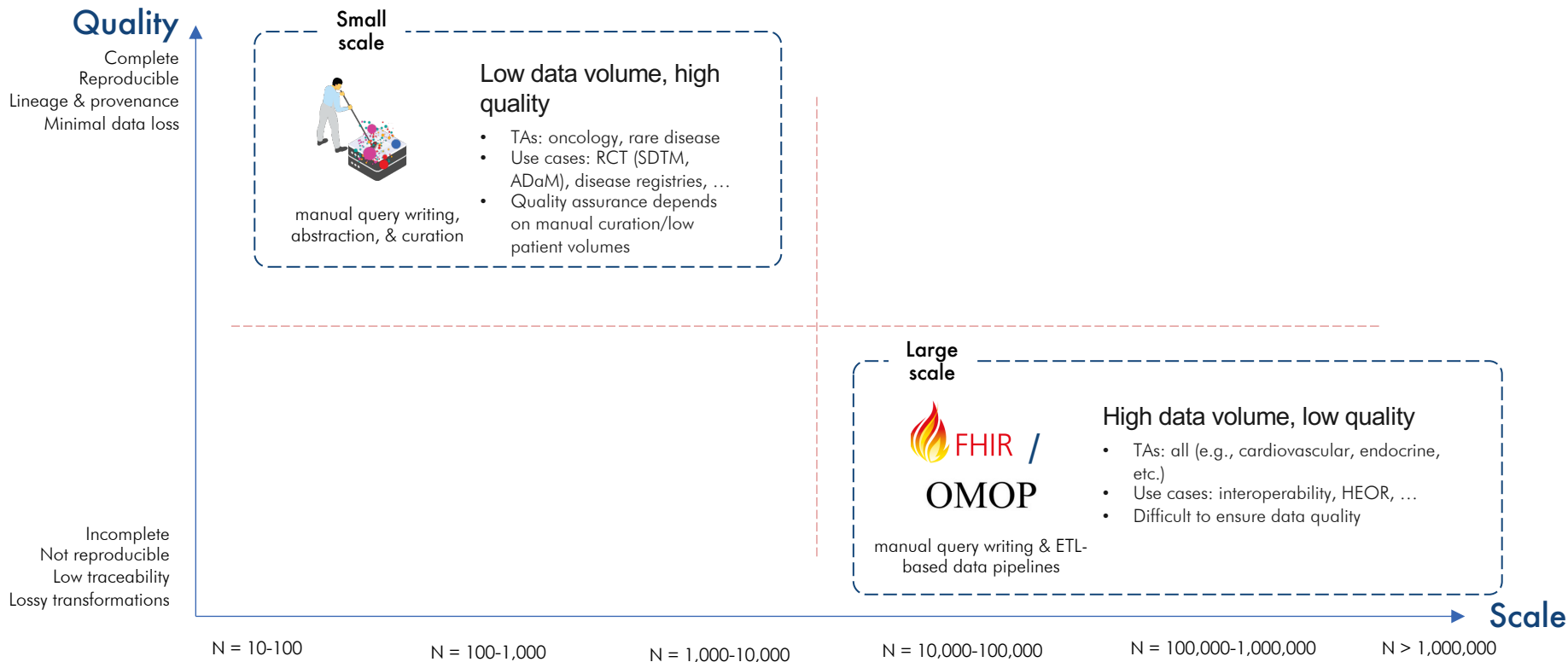
Characteristics of an AI middleware:

- Content vs. structure
- Scalability (N, variability)
- Maximizes information, minimizes data loss

Ingredients for the AI middleware:

- Software backbone supporting a cascade of AI algorithms & models
- Data (high noise, high variability)

TRADEOFF: SCALE VS. QUALITY




SOLUTION: MAXIMIZE INFORMATION USING AN AI MIDDLEWARE APPROACH

Quality

Trustable, reproducible, with lineage, complete; no information loss

Small scale




manual query writing, abstraction, & curation

Low data volume, high quality

- TAs: oncology, rare disease
- Use cases: RCT (SDTM, ADaM), disease registries, ...
- Quality assurance depends on manual curation/low patient volumes


General solution



High data volume, high quality

- TAs: all (e.g., cardiovascular, endocrine, etc.)
- Use cases: Research, regulatory R&D
- Quality assurance via AI middleware/software approach

Large scale



High data volume, low quality

- TAs: all (e.g., cardiovascular, endocrine, etc.)
- Use cases: interoperability, HEOR, ...
- Difficult to ensure data quality

manual query writing & ETL-based data pipelines

► **Scale**

Available at scale

WHY RWD? WHY NOW?

VALUE



Scientific value

Larger, more representative & diverse patient populations reflect disease in the real-world



Business value

RCT

- Trial design & feasibility
- External control arms
- Primary & secondary evidence for drug approvals

RWE

- Longitudinal outcomes studies
- Quantifying unmet needs
- Label expansion
- Disease registries
- Patient journeys
- ...



Regulatory push for the use of RWD

21st Century Cures Act (2016)



Longitudinal patient data availability

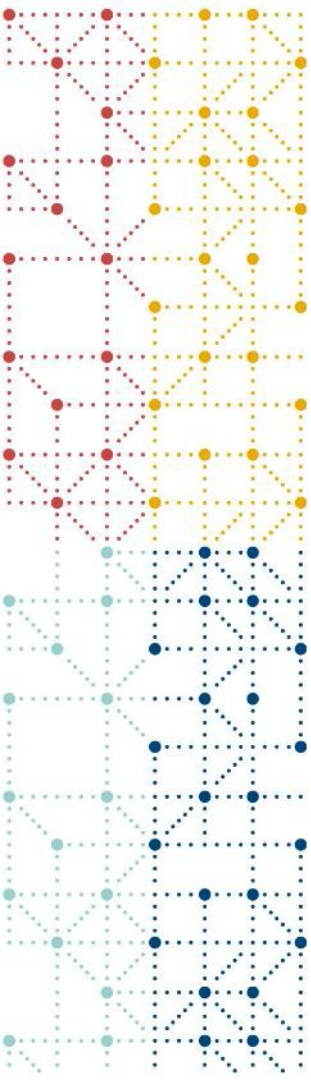
96% of US hospitals have adopted EHR



Increasing RWE adoption by the life sciences industry

46% CAGR of published RWE research over last 5 years

The time is right to use RWD.



Thank You!

cdisc