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Enhancing Programming Efficiency through AI-Enabled Clinical Data Standards

Paul Kirubakaran & Sivapreetha
Icon plc

phuse.global



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Abstract

The adoption of clinical data standards such as CDISC has long supported consistency and regulatory compliance in clinical trials. However, increasing data complexity and compressed timelines demand more efficient programming approaches. This paper explores how AI and ML can enhance standards driven programming workflows.

Use cases where AI assisted tools automate dataset mapping, metadata generation, and validation processes within SDTM and ADaM frameworks will be discussed. By leveraging standardized structures, these tools enable faster code generation, improved traceability, and reduced manual effort. The findings highlight that integrating AI with established data standards not only enhances productivity but also strengthens submission readiness.

AGENDA

Today's Overview

01 The Challenge

Data Complexity and Timeline Pressures

02 Standards as AI Foundation

CDISC Enabling Intelligent Automation

03 AI Use Cases

SDTM Mapping, ADaM Derivation and Validation

04 Tools and Technologies

Real World AI tools for Clinical Programming

05 Findings and Outcomes

Productivity Gains and Submission Readiness



AI Ecosystem

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1950s

Artificial Intelligence (AI)

Human intelligence exhibited by machines

1980s

Machine Learning (ML)

AI systems that learn from historical data

2010s

Deep Learning (DL)

Neural networks that mimic human brain function

2020s

Generative AI (Gen AI)

Foundation models that create original content

NLP

Natural Language Processing

Bridges classical methods and LLMs

LLMs

Large Language Models

Foundation models trained on vast text using transformer architecture



The Challenge

Why traditional approaches are no longer enough

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Data Complexity

Clinical studies today generate vastly more complex and voluminous data than in previous years

Timeline Pressure

Sponsors and CROs face increasingly compressed programming schedules driven by competitive and regulatory demands

Repetitive Workload

A significant share of programmer effort is consumed by repetitive tasks that offer little opportunity for expertise

Key Pain Points

- Manual SDTM mapping is time consuming, error prone and difficult to audit
- Metadata documentation consistently lags behind programming deadlines
- Validation cycles consume a disproportionate share of submission timelines
- Regulatory scrutiny demands tighter traceability with every new submission
- Inconsistent coding practices across teams increase review and QC burden

"The volume, variety, and velocity of clinical data has outpaced the traditional programmer's toolkit. AI is no longer optional"



CDISC Standards as AI Foundation

Structured standards create the perfect substrate for AI driven automation

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Raw Clinical Data

EDC, eCRF, Lab Systems, Wearables, Devices



SDTM Domains

Interventions, Events, Findings and other Domains



ADaM Datasets

ADSL, BDS, OCCDS and other Analysis Datasets



TLFs and Regulatory Submission

Tables, Listings, Figures and Submission ready Package

Why Standards Enable AI

- Consistent variable naming
- Controlled Terminologies
- Defined data relationships
- Predictable Structure
- Built in Validation rules



Use Case 1: AI Powered SDTM Dataset Mapping

Automating Raw to SDTM variable assignment using ML and NLP

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Before Manual Approach

- 1 Programmer reviews CRF page by page
- 2 Manually maps each variable to SDTM spec
- 3 Cross references CDASH to SDTM guide
- 4 Manually writes Mapping Specifications
- 5 QC Reviewer checks all mappings individually
- 6 Cycle repeats for every New study

After AI Assisted Approach

- 1 AI ingests aCRF and protocol documents
- 2 NLP suggests SDTM domain + variable matches
- 3 Programmer reviews and approves suggestions
- 4 Auto generates mapping specifications
- 5 AI validation flags discrepancies instantly
- 6 Reusable model improves with each study



From CRF to ADaM Dataset

Three connected AI assisted steps

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STEP 1 OF 3



Annotated CRF Generation

*NLP driven CDASH to SDTM field
classification on source CRF pages*





Annotated CRF Generation

NLP driven CDASH to SDTM field classification on source CRF documents

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Files Required



DM CRF pages



CDASH Implementation Guide v2.3



SDTM Implementation Guide v3.4



CDISC CT & Protocol

Form: Demographics
Generated On: 29 Jan 2021 16:18:59

Year of birth ①

Age Fixed Unit: Years ②

Sex ☐ Male ③
☐ Female

Is subject of child-bearing potential? ☐ Yes ④
☐ No

Ethnicity ☐ Hispanic or Latino ⑤
☐ Not Hispanic or Latino
☐ Not reported
☐ Unknown



Annotated CRF Generation

Generated Output

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Form: Demographics

Generated On: 29 Jan 2021 16:18:59

Year of birth

Age

Sex

Is subject of child-bearing potential?

Ethnicity

Fixed Unit: Years

Male ☐
Female ☐

Hispanic or Latino ☐
Not Hispanic or Latino ☐
Not reported ☐
Unknown ☐

SDTM Annotation

DM.BRTHDTC

DM.AGE
DM.AGEU

DM.SEX

RP.RPORRES

DM.ETHNIC

DEMOGRAPHY

Date of birth (DD/MM/YYYY)

Gender

Height (cm)

Weight (kg)

Smoker

Family history

.input-box.input-box.input-box / /

DM.BRTHDTC
ISO 8601: YYYY-MM-DD
Origin: CRF

DM.SEX
Code list: SEX
M=1 · F=2

VS.VSORRES / VS.VSSTRESN
VSTESTCD=HEIGHT · VSORRESU=cm
Origin: CRF

VS.VSORRES / VS.VSSTRESN
VSTESTCD=WEIGHT · VSORRESU=kg
Origin: CRF

SC.SCORRES
SCTESTCD=SMOKE
NY · Yes=Y · No=N

SC.SCORRES
SCTESTCD=FAMHIST
NY · Yes=Y · No=N



SDTM Specification Generation

LLM assisted domain mapping with controlled terminology resolution

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Files Required



Annotated CRF



SDTM IG v3.4 DM domain section



Protocol synopsis (treatment)



CDISC CT package

Form: Demographics Generated On: 29 Jan 2021 16:18:59	SDTM Annotation
Year of birth	1 DM.BRTHDTC
Age Fixed Unit: Years	2 DM.AGE DM.AGEU
Sex ☐ Male ☐ Female	3 DM.SEX
Is subject of child-bearing potential? ☐ Yes ☐ No	4 RP.RPORRES
Ethnicity ☐ Hispanic or Latino ☐ Not Hispanic or Latino ☐ Not reported ☐ Unknown	5 DM.ETHNIC



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[illegible]



Code Generation via AI Code Agent

Conversational code generation inside an IDE embedded AI assistant

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Requirements



ADaM Spec



Prompt



Sponsor specific macros or internal Utils existing macro

In adam_advs from safety data package, can you please mark MCRIT1FL eq "Y", if AVAL is greater than 90 for PARAMCD = "DIABP"

```
library(safetyData)

advs <- safetyData::adam_advs

if (!"MCRIT1FL" %in% names(advs)) {
  advs$MCRIT1FL <- NA_character_
}

advs$MCRIT1FL[advs$PARAMCD == "DIABP" & advs$AVAL > 90] <- "Y"
```



Code Generation via AI Code Agent

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Conversational code generation inside an IDE embedded AI assistant



Next Edit Suggestions

```
24  ASTDT <- case_when(  
25    is.na(year) ~ as.Date(NA),  
26    !has_month ~ make_date(year, 1, 1),  
27    has_month & !has_day & year < year(trtsdt) ~ make_date(year, month, 1),  
28    has_month & !has_day & year >= year(trtsdt) ~ make_date(year, month, 1)  
29  )  
30
```



- Fix
- Explain
- Modify
- Review

```
ASTDT <- case_when(  
  is.na(year) ~ as.Date(NA),  
  !has_month ~ make_date(year, 1, 1),  
  has_month & !has_day & year < year(trtsdt) ~ make_date(year, month, 1),  
  has_month & !has_day & year > year(trtsdt) ~ make_date(year, 1, 1),  
  has_month & !has_day & year == year(trtsdt) ~ make_date(year, month, 1),  
)
```

Rewrite

Modify

Review



Findings & Outcomes

What AI integration delivers across the clinical programming lifecycle

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SDTM Mapping Efficiency

Dramatically reduced manual effort in mapping raw data to CDISC SDTM standards

ADaM Dataset Delivery

Faster and more consistent delivery of ADaM datasets

First Pass Validation

Higher rate of validation runs passing on the first attempt

Submission Cycle Speed

Weeks recovered per submission cycle

Key Findings

- AI tools reduce manual effort without displacing programmer expertise or judgment
- Standardized prompt templates allow AI models to generalize reliably across therapeutic areas
- Traceability improves as AI auto documents all data transformations in real time
- Submission packages become more consistent and regulatory review ready
- QC effort shifts from finding errors to validating AI generated outputs
- Programmer capacity is freed up for complex programming and standards governance

Submission Readiness Impact

Traceability

Significantly Improved

Consistency

Markedly Higher

Error Rate

Substantially Reduced

Review Time

Notably Shorter



Challenges and Limitations

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01

Non-Standard Sponsor Fields

Custom CRF questions outside the CDASH IG vocabulary are not something the model can map confidently. These still require human judgment.

02

Unit and conversion fields

A measurement value and its units are often two separate fields. Agent annotates only value field and misses the unit field.

03

SAP Driven Derivation Logic (Fine tuning)

For partial dates or ongoing flags getting the LLM to the exact SAP intended logic usually takes a few iterative correction rounds not one prompt.

04

Cross domain relationships

The model maps individual domains reasonably well but does not reliably infer relationship between domains (RELREC)

05

Plausible but Incorrect Code

Generated SAS/R code often runs cleanly and looks right, but can contain subtle logic errors

06

Calibrating Trust

The real skill shift is knowing when to trust AI output. Over trusting and under using are both failure modes which we must learn.

Key Takeaways

- CDISC standards are the essential foundation for AI in clinical programming.
- AI can automate a major proportion of repetitive mapping and metadata tasks.
- Human oversight and regulatory validation remain non-negotiable.
- The clinical programmer's role is evolving and not disappearing.

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