

构建临床研究"虚拟数据工厂"

基于CDISC SDTM标准与AI驱动的自动化数据流水线

Building a "Dummy Data Factory" for Clinical Research
AI-Driven Automated Data Pipeline Based on CDISC SDTM Standards

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1

Background of Smart DDF

智能虚拟数据工厂背景

Understanding the foundation and purpose of DDF / 理解DDF的基础和目标

2

Key Considerations for DDF Design

DDF设计的关键考量

Design principles and data characteristics / 设计原则和数据特征

3

DDF Workflow & Online Quick Demo

DDF工作流与在线快速演示

Rapid walkthrough of DDF workflow and the interactive experience / 快速浏览DDF工作流和交互体验

4

Technology Stacks and Architectures

技术栈与架构

Technical implementation and system design / 技术实现和系统设计

5

Challenges and Limitations

挑战与限制

Technical challenges and current constraints / 技术挑战和当前限制

6

Q&A

问答环节

Questions and open discussion / 问题与开放讨论

Why DDF Matters in Accelerating Statistical Programming

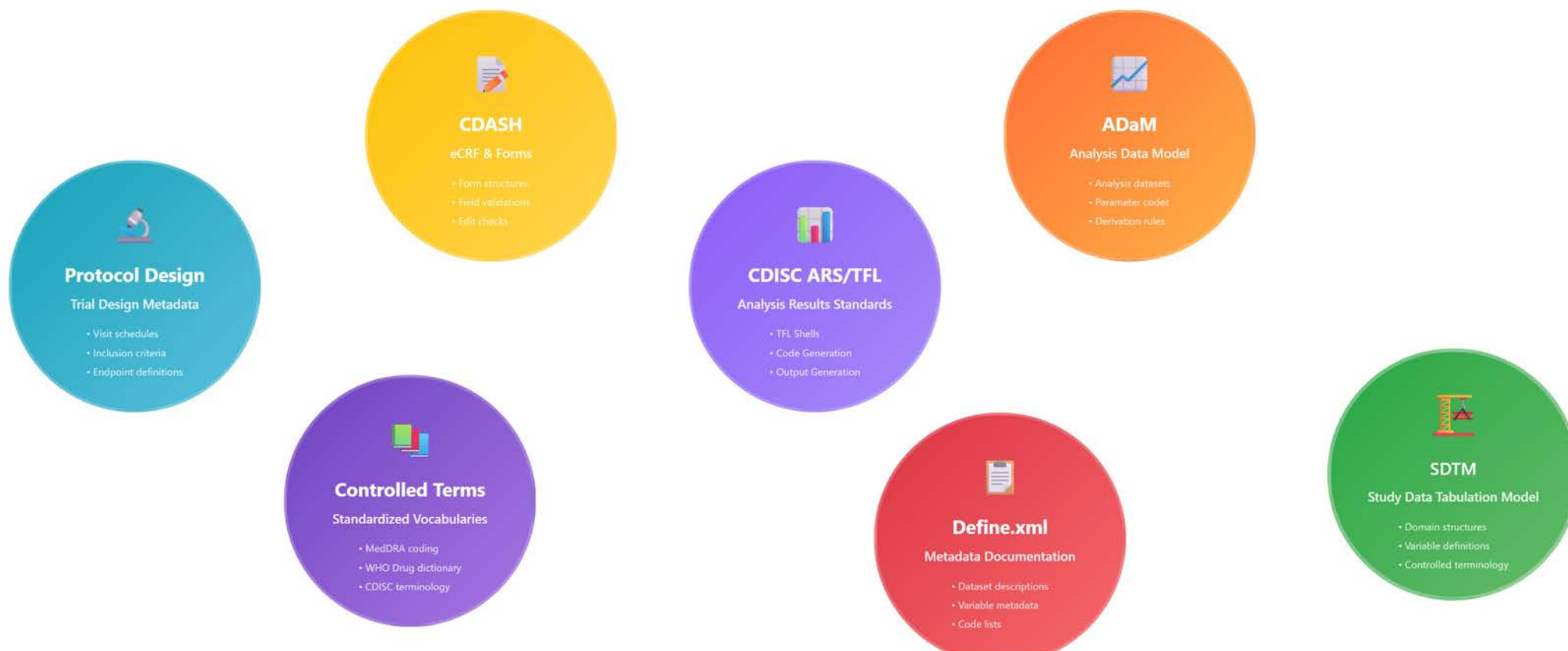
虚拟数据在临床数据运营中发挥着关键作用，包括数据库设置、数据管理和编程开发生命周期，特别是在以下情况下：

Dummy data plays a critical role in clinical data operations, including database setup, data management and programming development lifecycle, especially when:

- 为数据库设置、逻辑检查等提供稳健的用户验收测试（UAT）
Robust UAT for database setup, edit checks, etc.
- 真实研究数据不可用或需要等待具有有意义的代表性的数据截取
Real study data is not available or requires waiting for a data cut with meaningful representation.
- 真实研究数据无法覆盖所有场景，包括可能影响宏或自动化过程可靠性的罕见边缘情况
Real study data cannot cover all scenarios, including rare edge cases that may affect the reliability of macros or automated processes.
- 由于隐私、安全或合规性考虑，无法使用真实研究数据，需要匿名化或



Metadata in Clinical Trial Data Operations



为什么选择创建CDISC SDTM数据集？

Why Choose to Create CDISC SDTM Datasets?



Advantages of DDF Over Existing Solutions



现有解决方案

Existing Solutions



虚假数据生成

Fake Data Generation

不适临床试验场景，生成的数据没有意义

Does not adapt to clinical trial scenarios, generated data not meaningful



无逻辑与关联

No Logic & Relationships

不考虑变量和数据集之间的逻辑和关系

Does not consider the logics and relationships across variables and datasets



手动配置

Manual Configuration

不是元数据驱动的过程，难以配置特定场景的参数

Not a metadata driven process and hard to configure parameters for specific scenarios



学习曲线高

High Learning Curve

需要大量额外努力来生成真实的CDISC数据集，学习曲线高

Need lots of additional efforts to generate realistic CDISC datasets, high learning curve



集成有限

Limited Integration

没有内置API服务，难以集成到应用开发和测试流程中

Not a built-in API service and hard to integrate with application development and test process

VS



虚拟数据工厂

Dummy Data Factory



基于规则且可定制

Rule-Based & Customizable

基于规则的解决方案，高度支持用户定制，具有适当的参数设置

Rule-based solution and highly support user customization, with appropriate params setting



场景模拟

Scenario Simulation

支持多样化场景模拟，变量级别生成规则配置，符合CDISC和监管规则

Supports simulation of diversified scenarios, variable level generation rule configuration and in compliance with CDISC and regulatory rules



元数据驱动与API就绪

Metadata-Driven & API Ready

元数据驱动过程以及内置API服务，易于与自动化流程集成

Metadata driven process as well as built-in API services, easy to be implemented with automated processes



端到端解决方案

End-to-End Solution

可以创建高度关联且有意义的SDTM、ADaM、ARDs和TFLs，促进整个流程的开发和验证

Could create highly linked and meaningful SDTM, ADaM, ARDs and TFLs, to facilitate the whole process development and validation



生产就绪

Metadata-Driven Dummy Data Factory

A concrete example of how structured metadata enables intelligent dummy data generation

Variable	Label	Type	Length	Controlled Terms
STUDYID	Study Identifier	Char	12	e.g., "ABC-123-001"
DOMAIN	Domain Abbreviation	Char	2	"AE"
USUBJID	Unique Subject Identifier	Char	20	e.g., "ABC-123-001-001"
AESEQ	Sequence Number	Num	8	1, 2, 3...
AETERM	Reported Term for AE	Char	200	Free text (realistic symptoms)
AEDECOD	Dictionary-Derived Term	Char	200	MedDRA PT terms
AESEV	Severity/Intensity	Char	20	MILD, MODERATE, SEVERE
AESER	Serious Event	Char	1	Y, N
AESTDTC	Start Date/Time	Char	19	ISO 8601 format
AEENDTC	End Date/Time	Char	19	ISO 8601 format

SDTM AE Generation Algorithm Logic

```
2  # =====
6  ## 1. WEIGHTED_CHOICE_MEDICAL Algorithm
84
85  # Apply demographic adjustments
86  age = subject_demographics['age']
87  sex = subject_demographics['sex']
88  medical_history = subject_demographics.get('medical_history', [])
89
90  # Age-based adjustments
91  age_adjustments = {
92      'common_mild': {
93          'young': (18, 35, 1.2), # Higher rate of mild AEs in young adults
94          'middle': (36, 65, 1.0), # Baseline
95          'elderly': (66, 100, 0.8) # Lower rate of mild AEs, higher serious
96      },
97      'serious': {
98          'young': (18, 35, 0.3), # Much lower serious AE rate
99          'middle': (36, 65, 1.0), # Baseline
100         'elderly': (66, 100, 2.5) # Much higher serious AE rate
101     }
102 }
103
104 # Sex-based adjustments for specific AEs
```

元数据驱动的风险因素

MedDRA合规

CDISC SDTM标准

临床相似性

Metadata-Driven Dummy Data Factory Example

关键洞察：从多个域（DM、EX、MH）的元数据驱动智能、临床相似的数据生成，符合CDISC标准和MedDRA编码

Metadata Repository



Demographics (DM)

- Age: 68 years
- Sex: Male
- Race: Caucasian



Concomitant Medication (CM)

- Drug Class: Cardiovascular
- Duration: 180 days
- Dose: 50 mg QD



Medical History (MH)

- Hypertension
- Type 2 Diabetes

Metadata-Driven Algorithm

- Age 68 → 12.5x Serious AE Risk
- Male → 11.0x MI Risk
- CV Drug → 12.0x Hypertension
- Duration 180d → Chronic Events
- MedDRA Mapping Applied

Generated AE Data

SERIOUS AE

Cardiac Disorders

AETERM:	Myocardial Infarction
AESEV:	SEVERE
AESER:	Y (Hospitalization)
AESTDTC:	2024-03-15
AEDECOD:	Myocardial infarction
AEBODSYS:	Cardiac disorders
Duration:	21 days (90% resolution)

Centralized Metadata Repository View

← Freeze Active Retired EDC DRM SDTM AD SR + ≡ ≡ 🔍 🔄													
☐	#	Action	Status	Data State	Data Domain	1:1 Target Data Element	Keep for next stage	Key Element	Derivation Name	Contributing Elements	Contributing Parameters		
☐	3	🔍 🗑️ 🗑️ 🕒	A	EDC	DM	AGE	Y	Edit	N/A	? N/A	✓ N/A		
☐	4	🔍 🗑️ 🗑️ 🕒	A	DRM	DM	AGE	Y	Edit	COPY_ELEMENT	? EDC.DM.AGE	✓ N/A		
☒	5	🔍 🗑️ 🗑️ 🕒	A	SDTM	DM	AGE	Y	Edit	COPY_ELEMENT	? DRM.DM.AGE	✓ N/A		
☐	6	🔍 🗑️ 🗑️ 🕒	A	EDC	DM	AGEDY	Y	Edit	N/A	? N/A	✓ N/A		
☐	7	🔍 🗑️ 🗑️ 🕒	A	DRM	DM	AGEDY	Y	Edit	COPY_ELEMENT	? EDC.DM.AGEDY	✓ N/A		
☐	8	🔍 🗑️ 🗑️ 🕒	A	SDTM	DM	AGEDY	? Y	Edit	COPY_ELEMENT	? DRM.DM.AGEDY	✓ N/A		
☐	9	🔍 🗑️ 🗑️ 🕒	A	EDC	DM	AGEMN	Y	Edit	N/A	? N/A	✓ N/A		
☐	10	🔍 🗑️ 🗑️ 🕒	A	DRM	DM	AGEMN	Y	Edit	COPY_FLIP	? EDC.DM.AGEMN	✓ N/A		
☐	11	🔍 🗑️ 🗑️ 🕒	A	SDTM	DM	AGEMN	? Y	Edit	COPY_ELEMENT	? DRM.DM.AGEMN	✓ N/A		
☐	12	🔍 🗑️ 🗑️ 🕒	A	DRM	DM	AGEMNL	N	Edit	DECODE	? DRM.DM.AGEMN	✓ N/A		
☐	13	🔍 🗑️ 🗑️ 🕒	A	EDC	DM	AGEU	Y	Edit	N/A	? N/A	✓ N/A		
☐	14	🔍 🗑️ 🗑️ 🕒	A	DRM	DM	AGEU	Y	Edit	COPY_FLIP	? EDC.DM.AGEU	✓ N/A		
☐	15	🔍 🗑️ 🗑️ 🕒	A	SDTM	DM	AGEU	Y	Edit	COPY_ELEMENT	? DRM.DM.AGEU	✓ N/A		



CDISC SDTM/ADaM Compliant



Interactive Metadata Editor



Automated Validation



Documentation Generator

Data Characteristics Inputs for the DDF

虚拟数据工厂 / DUMMY DATA FACTORY

需要什么？

What needs to be prepared?

DDF接收精心准备的数据特征，以预填充研究终点指标/实验室检查等研究相关的参数的默认设置，确保生成的数据反映分布特征。

The DDF ingests prepared data characteristics to pre-populate default settings for endpoints, tests, and parameters of interest, ensuring generated data mirrors the distribution profile.



人群人口统计学

Population Demographics

关键队列的地区组合、年龄/性别分布、入组节奏和随机化比例。

Region mix, age/sex distributions, enrollment cadence, and randomization ratios for key cohorts.



研究终点指标/实验室检查库

Endpoint/Test Libraries

参数编码、结果单位、实验室面板、访视窗口和受控术语映射。

Parameter codes, result units, lab panels, visit windows, and controlled terminology mappings.



分布特征

Distribution Profiles

用作合成生成默认值的汇总统计或拟合分布（正态、对数正态、分类概率）。

Summary stats or fitted distributions (normal, log-normal, categorical odds) used as defaults for synthetic generation.



时间与场景规则

Temporal & Scenario Rules

访视频率、非计划访视逻辑、缺失模式、方案偏离和分支逻辑等。

Visit frequency, unscheduled logic, missingness patterns, protocol deviations, and branching triggers.

获取特征 / ACQUIRING THE CHARACTERISTICS

如何获取特征？

How do we acquire characteristics?

结合定量摘要和定性知识，模拟或仿真相关疾病治疗特征场景。

Combine quantitative summaries with qualitative knowledge to simulate or mimic the scenarios of the related disease treatment.



历史研究档案、CT.gov等

Historical Study Archives, CT.gov, etc.

- 从公开文献、数据库或自有研究中提取研究终点指标/实验室检查的统计摘要
Extract SDTM/ADaM summaries from locked studies
- 按治疗领域或研究药物类型进行版本控制，确保数据特征的准确性和一致性
Version control per therapeutic area or study drug type



申办方和治疗领域手册

Sponsor & TA Playbooks

- 导入申办方拥有的参考范围和分层研究终点指标/实验室检查
Import sponsor-owned reference ranges and tiered tests
- 自定义感兴趣研究终点指标/实验室检查值的可接受范围
Determine acceptable range for endpoints of interest



自动化分析服务

Automated Profiling Services

- 连接到MCP或元数据中心的API，使用LLMs辅助分析数据特征
APIs to MCP or metadata, with the usage of LLMs
- 机器学习辅助拟合分布默认值
ML-assisted fitting for distribution defaults
- 持续监控以刷新数据特征



SME和生物统计专家评审

SME & Biometric Peer Review

- 评审研究终点指标/实验室检查的统计摘要
Peer review of the data characteristics
- 确保数据特征的准确性和一致性
Ensure the accuracy and consistency of the data characteristics

Data Characteristics Examples

COMMON DEMOGRAPHICS 常见人口统计学

Population Baseline 人口基线



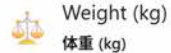
Age
年龄

Mean	54.3 years	SD	12.7
Min	21	Max	82
Median	53		



Sex
性别

Male	124 (53.7%)	Female	107 (46.3%)
Total	231		



Weight (kg)
体重 (kg)

LAB HEMATOLOGY TESTS 实验室血液学检测

Blood Test Parameters 血液检测参数



Hemoglobin
血红蛋白

HGB

Mean	14.2 g/dL	SD	1.6
Min	10.3	Max	18.1

Reference Range



White Blood Cells
白细胞

WBC

Mean	$7.2 \times 10^9/L$	SD	2.1
Min	3.5	Max	14.8

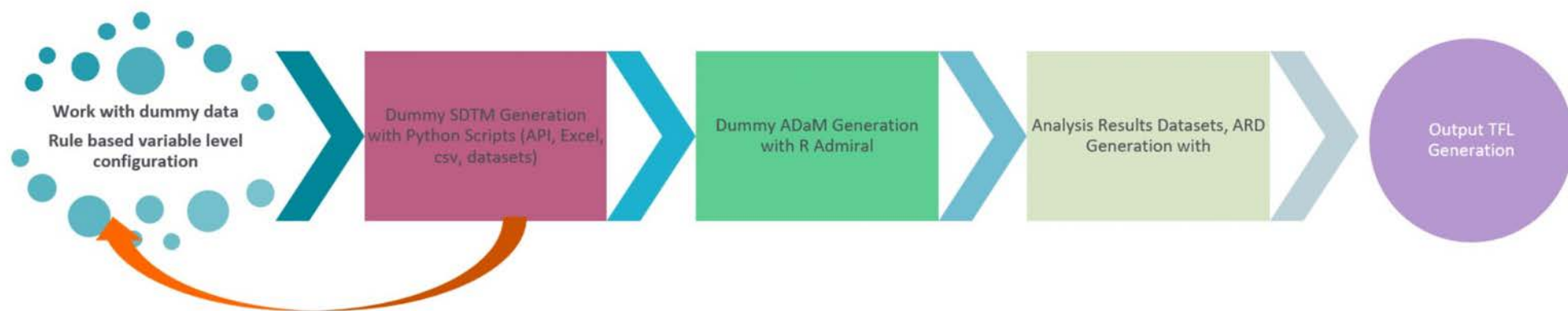
Reference Range



Platelets
血小板

PLT

DDF Implementation Process



Work with real study
data



元数据驱动 / Metadata-Driven

自动化工作流 / Automated Workflow

符合CDISC标准 / CDISC Compliant

端到端解决方案 / End-to-End Solution

虚拟数据工厂在线快速演示

SDTM 模拟数据生成器

v1.0

参数配置

中

研究编号 (Study ID)

CABC-202512A

SDTM Domain

DM - Demographics

受试者数量 (1-300)

10

数据语言

简体中文

随机种子 (可选, 重现生成数据)

输入随机种子

生成选定域数据

生成全部域数据

重置配置

数据结果

欢迎使用 CDISC SDTM 数据生成器

请在左侧选择参数，然后点击“生成数据”按钮开始生成虚拟的 CDISC SDTM数据集。支持多种域类型，可生成中英文数据，并提供完整的表格展示功能。

Adverse Events Dashboard

Interactive analysis dashboard with detailed subject information

受试者数量: 60

加载数据

Analysis Controls

×

☐ 仅 TEAE

分组:

亚组:

无

图型:

分组柱状图

统计口径:

按受试者数 (去重 USUBJID)

严重程度筛选:

全部

排序:

高到低

图表方向:

垂直

☒ 显示滑块

阈值线 (%):

☒ 5%

☐ 10%

☐ 自定义

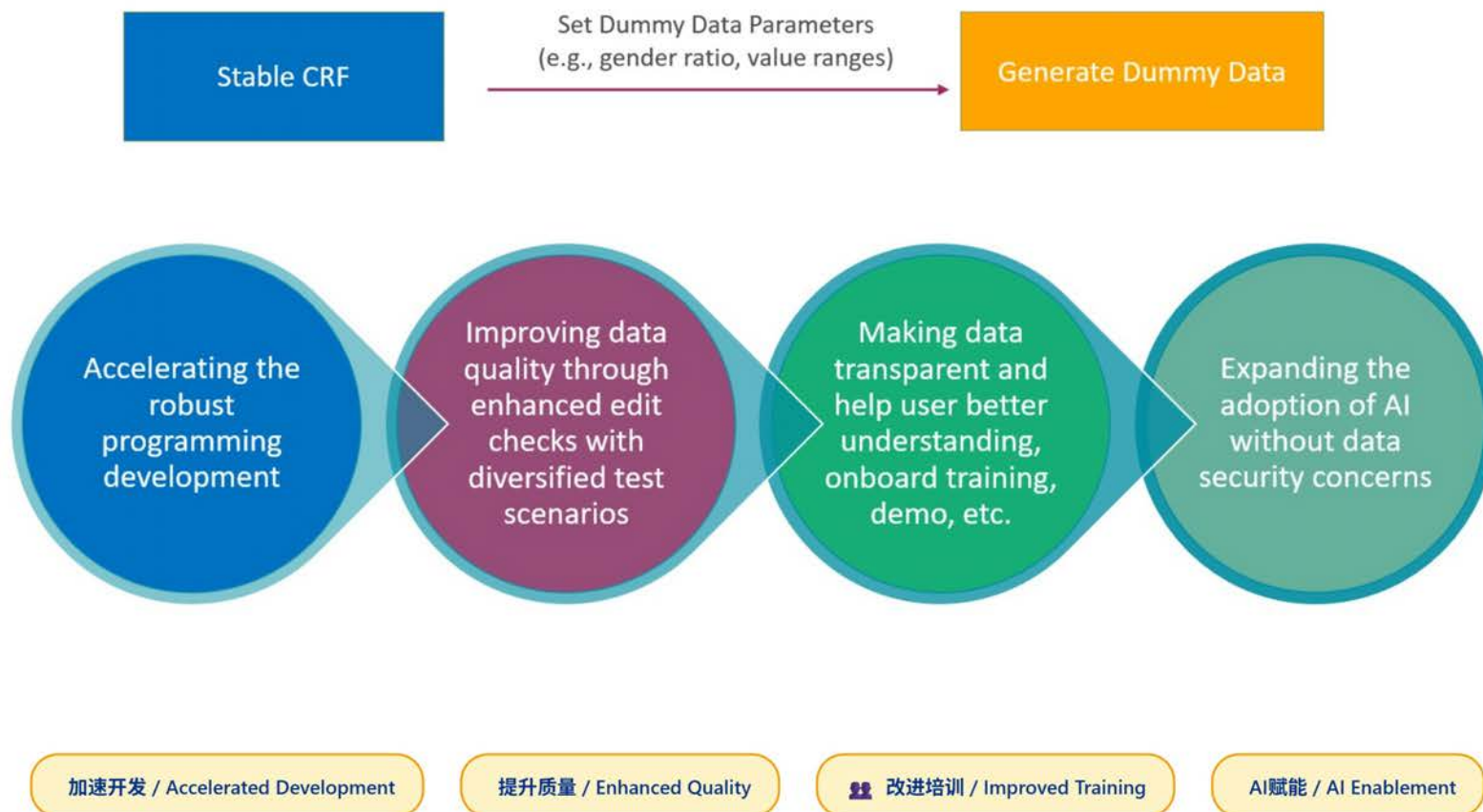
Adverse Event Frequencies by AEDECOD

下载图片

Number of Subjects

Threshold: 5%

DDF Expected Outcomes & Benefits



Key Technical Challenges & Solutions

1



SDTM Standard Compliance

SDTM标准符合性

Challenge / 挑战:

How to ensure generated data strictly adheres to SDTM standards, including data models, variable naming conventions, and coding rules?

如何确保生成的数据严格符合SDTM模型、变量命名、编码规则的精确映射?

Solutions / 解决方案

- ✓ Build comprehensive SDTM metadata repository with domain models, variable dictionaries, and controlled terminologies

建立完整的SDTM元数据库, 包含域模型、变量字典和受控术语

- ✓ Implement automated validation layer using CDISC standards and Pinnacle 21 validation rules

实现基于CDISC标准和Pinnacle 21验证规则的自动化校验层

- ✓ Create domain-specific generators with built-in SDTM constraints and business rules

创建内置SDTM约束和业务规则的特定域生成器

Technical Approaches / 技术方法:

Metadata-Driven

Rule-Based Validation

Template Mapping

CDISC CT Integration

2



Data Realism & Plausibility

数据真实性与合理性

Challenge / 挑战:

How to generate data that is not only structurally correct but also clinically realistic in terms of value ranges, distributions, and logical relationships?

如何让生成的数据不仅格式正确, 其内容 (数值范围、数据分布、逻辑关系) 也贴近真实临床场景?

Solutions / 解决方案

- ✓ Analyze real-world clinical trial data to extract statistical distributions and patterns

分析真实临床试验数据, 提取统计分布和模式特征

- ✓ Apply probabilistic models (Normal, Log-normal, Weibull) for continuous variables

对连续变量应用概率模型 (正态、对数正态、威布尔分布)

- ✓ Implement correlation matrices and copula functions for inter-variable dependencies

实现相关性矩阵和Copula函数处理变量间依赖关系

- ✓ Define clinical business rules and reference ranges based on therapeutic area expertise

基于治疗领域专业知识定义临床业务规则和参考范围

Technical Approaches / 技术方法:

Distribution Fitting

Correlation Analysis

Clinical Rules Engine

Statistical Sampling

3



Complex Logical Relationships

复杂逻辑关联

Challenge / 挑战:

How to efficiently handle complex constraints and maintain consistency across different data domains and within domain variables?

如何高效处理不同数据域之间、同一域内不同变量之间的复杂约束与一致性?

Solutions / 解决方案

- ✓ Design hierarchical data generation pipeline: DM → SV → domain-specific data

设计分层数据生成管道: DM → SV → 特定域数据

- ✓ Implement dependency graph to manage inter-domain relationships via USUBJID, VISIT, dates

实现依赖图管理域间关系 (通过USUBJID、VISIT、日期关联)

- ✓ Create constraint validation engine for temporal logic, reference ranges, and derived variables

创建约束验证引擎处理时间逻辑、参考范围和派生变量

- ✓ Apply transaction-based approach to ensure atomicity and rollback on constraint violations

应用事务性方法确保原子性, 约束违反时回滚

Technical Approaches / 技术方法:

Graph-Based Dependencies

Constraint Solver

Temporal Logic Engine

Transaction Management

Technology Stack Overview



前端框架

Frontend Framework

Vue 3.x + Ant Design 响应式设计

⚡ Vue 3.x + Ant Design Responsive Design
Composition API

TypeScript

📘 类型安全 / Type Safety



样式与动画

Styling & Animation

CSS3

🎨 动画与网格 / Animations & Grid

Canvas API

🌟 动态效果 / Dynamic Effects



后端技术

Backend Technology

LLM + Python + R + MySQL/MariaDB

🔄 关系型数据库 / Relational Database

Redis

🔴 内存缓存 / In-Memory Cache



构建工具

Build Tools

Vite

⚡ 快速构建工具 / Fast Build Tool

Node.js

💚 运行时环境 / Runtime Environment

Summary

1



加速临床编程

Accelerates Clinical Programming

智能虚拟数据生成显著加快临床编程流程

Smart dummy data generation speeds up clinical programming processes significantly

2



提升数据与代码质量

Improves Data & Code Quality

使用智能虚拟数据有助于通过全面测试提高
代码质量

Using smart dummy data helps enhance code quality through comprehensive testing

3



扩展场景覆盖

Expands Scenario Coverage

它能够实现更广泛的场景覆盖，确保更可靠的
临床研究工作流

It enables broader scenario coverage, ensuring more reliable clinical research workflows

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Design

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Questions & Answers

问题与解答

Thank you for your attention!

感谢您的关注!

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