

A Holistic Framework for Supporting Evidence-Based Institutional Research Data Management

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In Collaboration With

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Main Challenges for Institutional RDM

- Increasing Quantity and Variety of Digital Research Data,
- Evolving Users Requirements,
- Increased Federal Requirements,
- Multi-Perspectives of Data Management and Stewardship,
- Multi-Dimensions of Data and Information Quality.

Increased Federal Requirements → Quality Attributes

■ US Public Laws

- Information Quality Act (106-554 2000),
- DATA Act (113-101 2014),
- OPEN Government Data Act (115-435 2019, Title II).

■ US Federal Policies

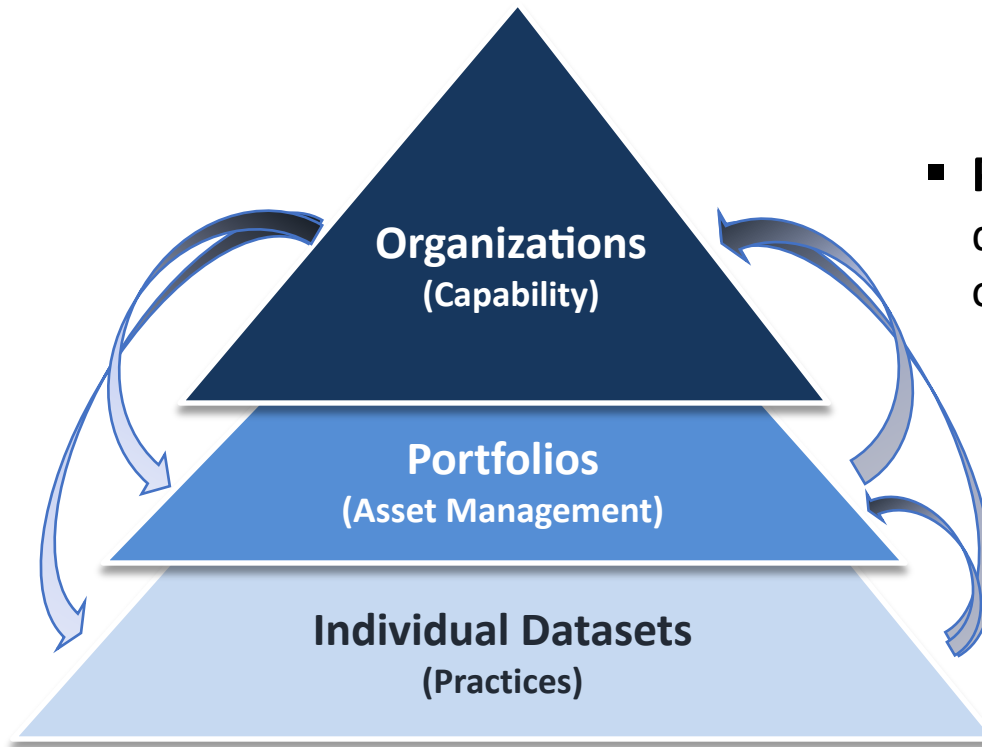
- Information Quality Act Guidelines (OMB 2002), revised in 2019,
- Open Data Policy – Managing Information as an Asset (OMB 2013),
- Increasing access (OSTP 2013)

Important Quality Attributes for U.S. Federally Funded Digital Research Data Include:

- Accuracy, Integrity, Utility, Transparency, Traceability, Preservability, Accessibility, Interoperability, Usability.

➤ **Compliance reporting with support evidences**

Multi-Perspectives of Institutional RDM



- **Process** (过程)
driven by achievement
of a desired outcome
- **Procedure** (流程)
driven by completion
of the task
- **Practices** (实践)
actual use of something

Data Production: Processes ensure a data product is produced in a **right way** while practices ensure the produced product is a **right one**.

There Are Many Data Quality Attributes!

Wang and Strong 1996, *J. Management Info. Sys.*

Many are overlapping

- Accuracy
- Correctness
- Free from bias
- Validated
- ...

Data quality is not just about accuracy any more!



Multi-Dimensions of Data and Information Quality



Quality Attributes

- accuracy, objectivity, believability, reputation,
- relevance, timeliness, completeness, value-added, appropriate amount of data,
- ease of understanding, concise representation and representational consistency, interpretability,
- accessibility, access security.

Dimensions

- **Intrinsic**
- **Contextual**
- **Representational**
- **Accessibility**

(Wang and Strong 1996, *J. Management Info. Sys.*)

Multi-Dimensions of Data and Information Quality

Perspective

Based on open data and data sharing principles

(**Wilkinson et al.** 2016, *Scientific Data*)

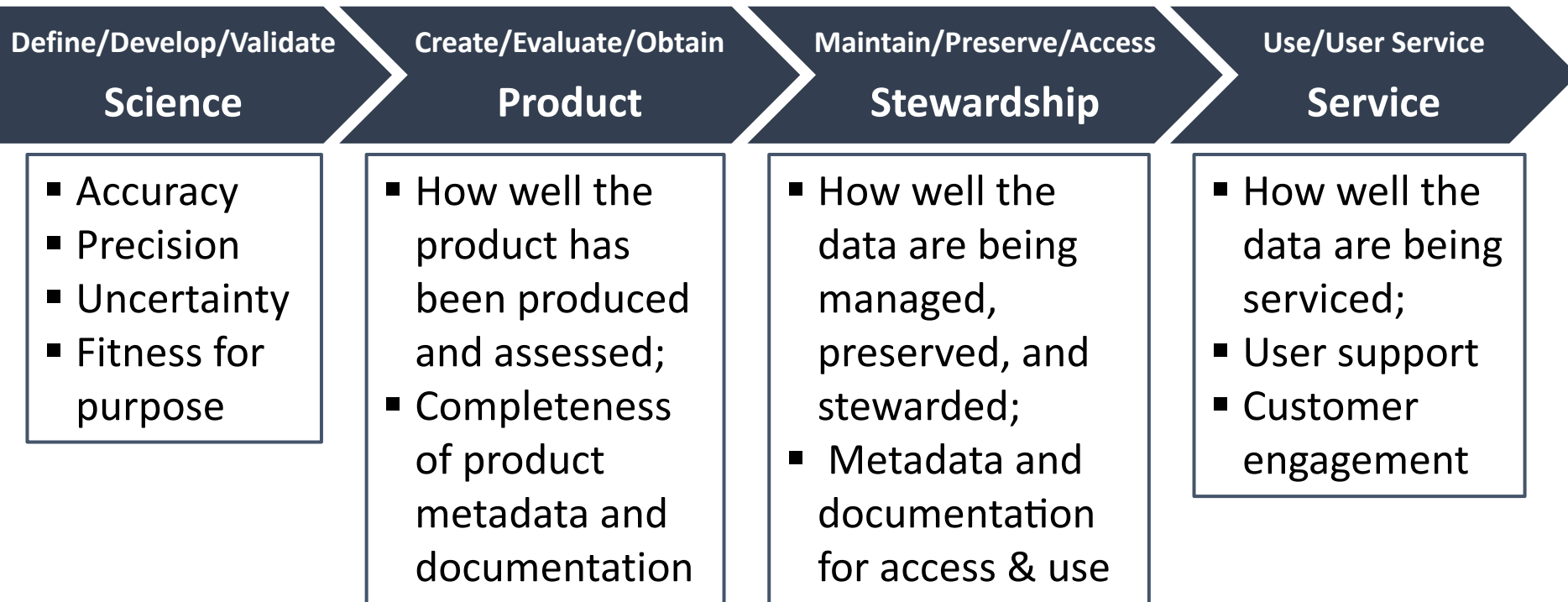


Quality Attributes

- **Findability,**
- **Accessibility,**
- **Interoperability,**
- **Reusability.**

Multi-Dimensions of Data and Information Quality

Stages of Data Product Lifecycle



(Ramapriyan et al. 2017, *D-Lib Magazine*)

Needs to be Holistic and Integrated

Institutional Research Data Management

- A lot of Moving Parts, many may have already been in place;
- Cross-Department;
- Cross-Discipline.

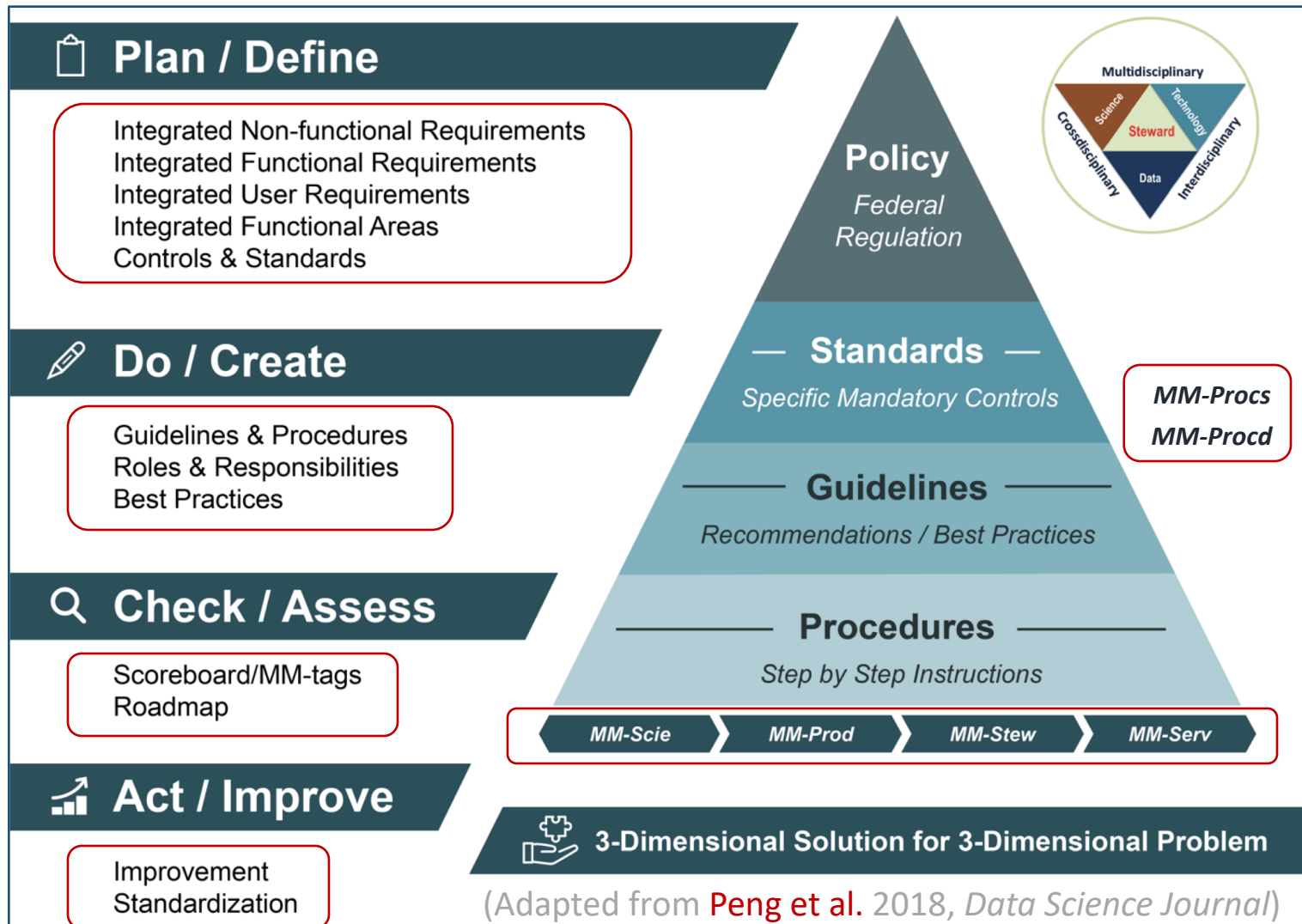
Institutions need to demonstrate the compliance by reporting with support evidences!

But How? Where to Start?

Needs to have a Holistic and Integrated Approach:

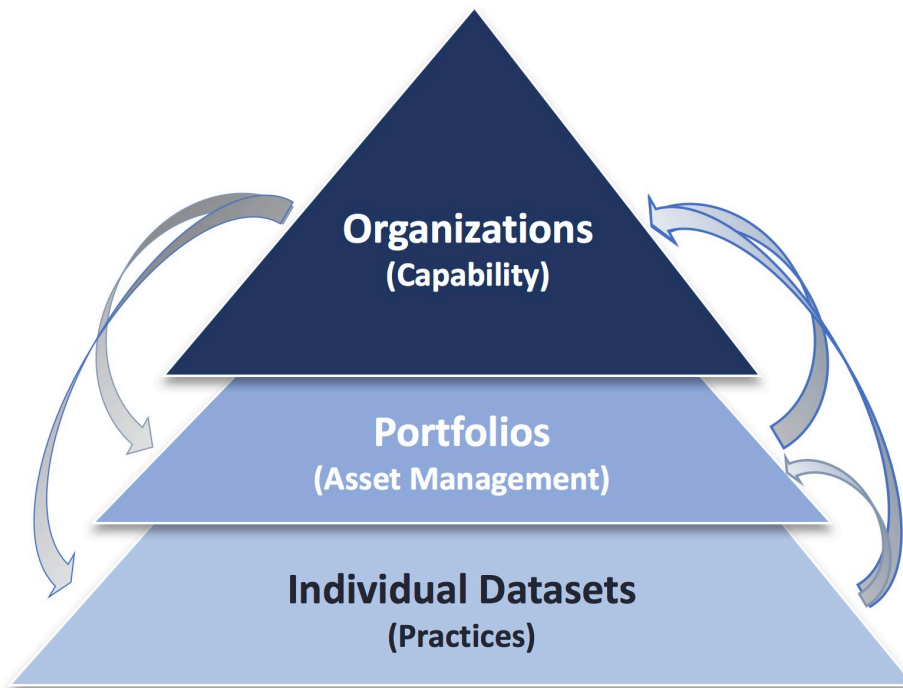
- To be utilized without much upfront cost,
- Enterprise-wide,
- Evidence-based,
- Support continuous improvement.

High-Level, Holistic Framework For Institutional RDM



Examples of Maturity Assessment Models

Tiers of Maturity Assessment within Context of Scientific Data Stewardship

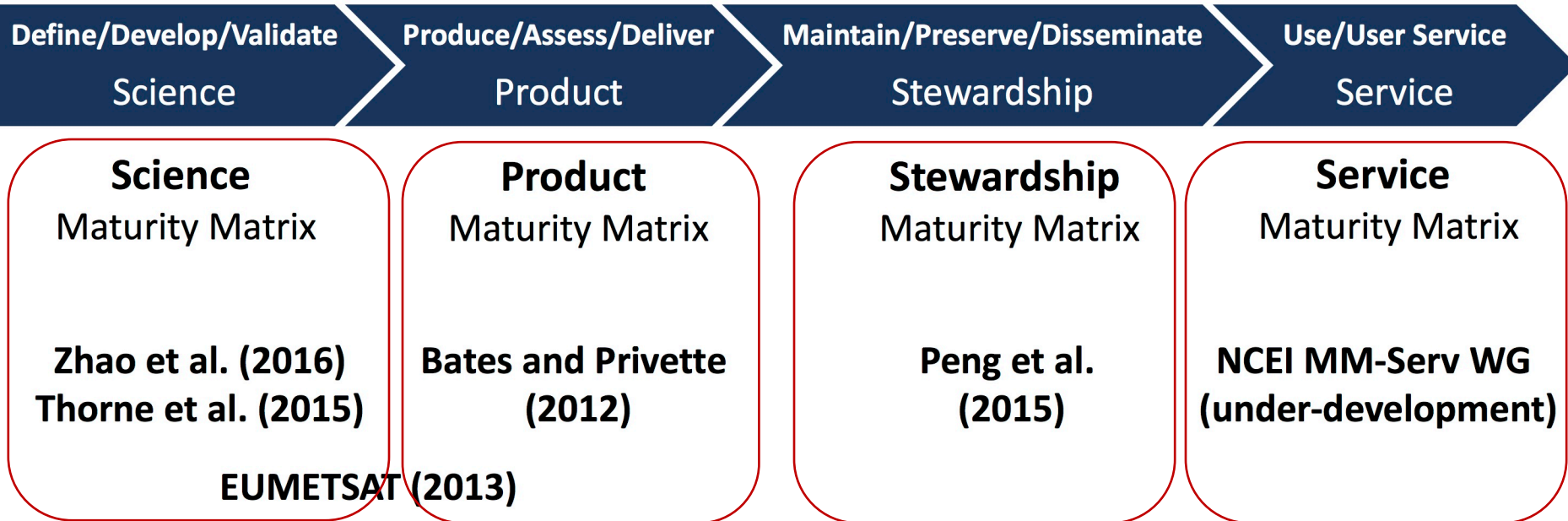


(Peng 2018, *Data Science Journal*)

- **Repository Processes Maturity**
e.g., CMMI Data Management Maturity Model (CMMI 2014)
- **Repository Procedures Maturity**
e.g., ISO Repository Trustworthiness Certification (ISO 16363 2012)
- **Asset Management Maturity**
e.g., NGDA Lifecycle Maturity Assessment Model (FGDC 2015)
- **Stewardship Practices Maturity**
e.g., NCEI/CICS-NC Data Stewardship Maturity Matrix (Peng et al. 2015)

Examples of Dataset Maturity Assessment Models

Data Product Lifecycle-Stage-Based Maturity Assessment Models



(Peng 2018, *Data Science Journal*)

- WMO Stewardship Maturity Matrix for Climate Data,
- CEOS Data Management and Stewardship Maturity Matrix.

Examples of Dataset Maturity Assessment Models

Data Product Lifecycle-Stage-Based Maturity Assessment Models

Define/Develop/Validate
Science

Produce/Assess/Deliver
Product

Maintain/Preserve/Disseminate
Stewardship

Use/User Service
Service

Science

Maturity Matrix

Zhao et al. (2016)
Thorne et al. (2015)

EUMETSAT (2013)

Product

Maturity Matrix

Bates and Privette
(2012)

Stewardship

Maturity Matrix

Peng et al.
(2015)

Service

Maturity Matrix

NCEI MM-Serv WG
(under-development)

*Scientifically
sound and utilized*

*Fully documented
and transparent*

*Well-preserved
and integrated*

*Readily obtainable
and usable*

Possible to Assess the Maturity of Individual Datasets?

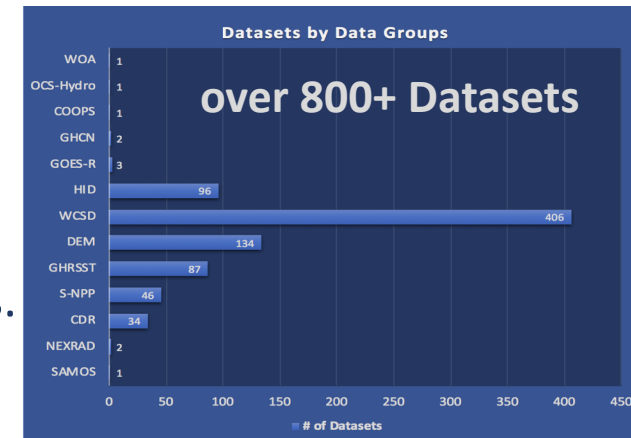
(NOAA *OneStop* Application of a Data Stewardship Maturity Matrix)

What Is the DSMM?

- **A Unified Framework** for measuring stewardship practices applied to individual data products,
- **Developed Jointly** by domain Subject Matter Experts (i.e., data management, science, and technology),
- **Leveraged** institutional knowledge and community best practices and standards,
- Used and reused by various data management and stewardship organizations,
- Used to curate structured, rich, machine and human readable quality information metadata and documents.

(Peng et al. 2019, *Data Science Journal*; ncics.org/dsмм)

Maturity Scale	Level 1 - Ad Hoc	Level 2 - Minimal	Level 3 - Intermediate	Level 4 - Advanced	Level 5 - Optimal
Key Component	Not Managed	Managed Limited	Managed Defined, Partially Implemented	Managed Well-Defined, Fully Implemented	Level 4 + Measured, Controlled, Audit
Preservability	The state of dataset being preservable				
Accessibility	The state of dataset being publicly searchable and accessible				
Usability	The state of data product being easy to understand and use				
Production Sustainability	The state of data production being sustainable and extendable				
Data Quality Assurance	The state of data product quality being assured/screened				
Data Quality Control /Monitoring	The state of data product quality being controlled and monitored				
Data Quality Assessment	The state of data product quality being assessed				
Transparency /Traceability	The state of data product being transparent, trackable, and traceable				
Data Integrity	The state of data integrity being verifiable				



Key Takeaways

Institutional Research Data Management:

- is a multi-perspective and multi-dimensional problem,
- requires an integrated data-centric framework.

Our framework

- follows the Plan-Do-Check-Act (PDCA) cycle,
- provides a tool to address RDM activities as a consistent, integrated, dataset-centric system,
- includes the application of maturity assessment models,
- supports informed decision-making process.

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Questions?

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