

Structuring Data Sovereignty and Governance in Data Ecosystems - *A Literature Review and Model Proposal*

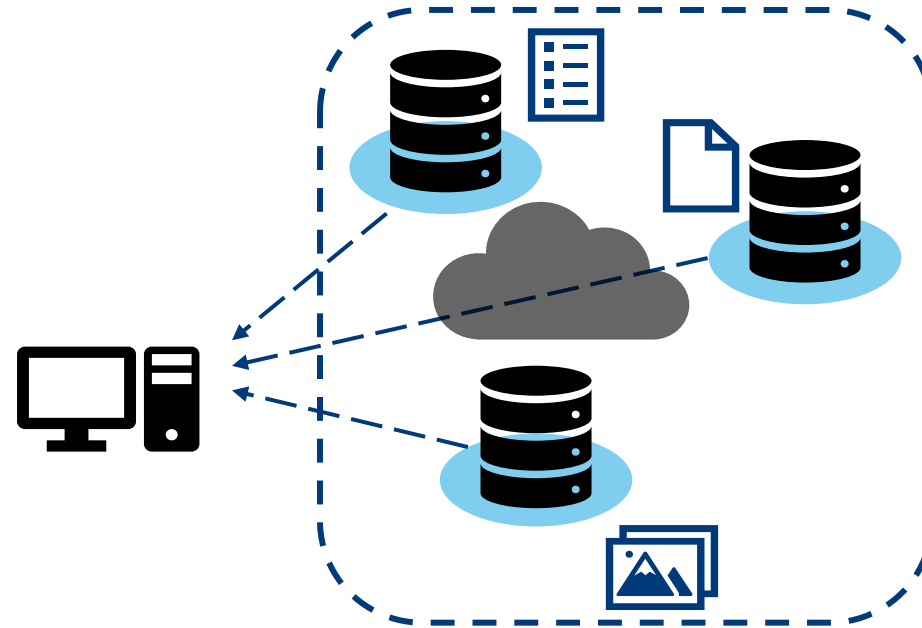
Michael Pleger, Torben Röhrs, Felix Schmidt and Ina Schiering

Motivation Context

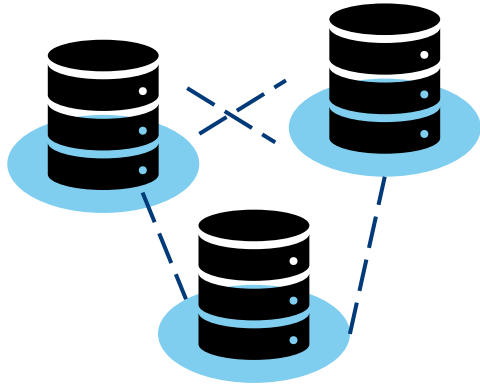
Data Ecosystems rely on shared infrastructure as their foundation for data spaces, but face structural challenges that limit their potential

Benefits

- Cross-institutional data sharing & reuse
- Decentralized storage and access
- Enable industrial collaborations
- Support public-sector digital infrastructure



What are the facing Challenges for Data Ecosystems?



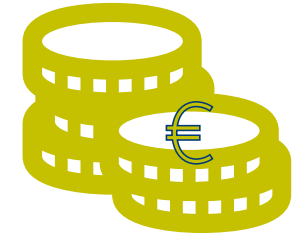
Fragmentation:
Data silos make collaboration and integration of data (sets) difficult



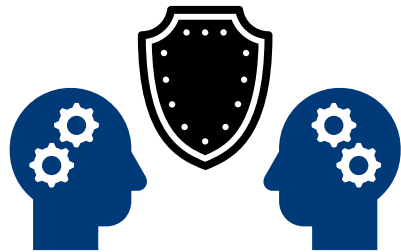
Interoperability:
Different formats & standards cannot be linked



Legal issues:
compliance, copyrights, terms of use



Economic value:
Data is kept exclusive



Lack of trust between stakeholders, fear of data misuse

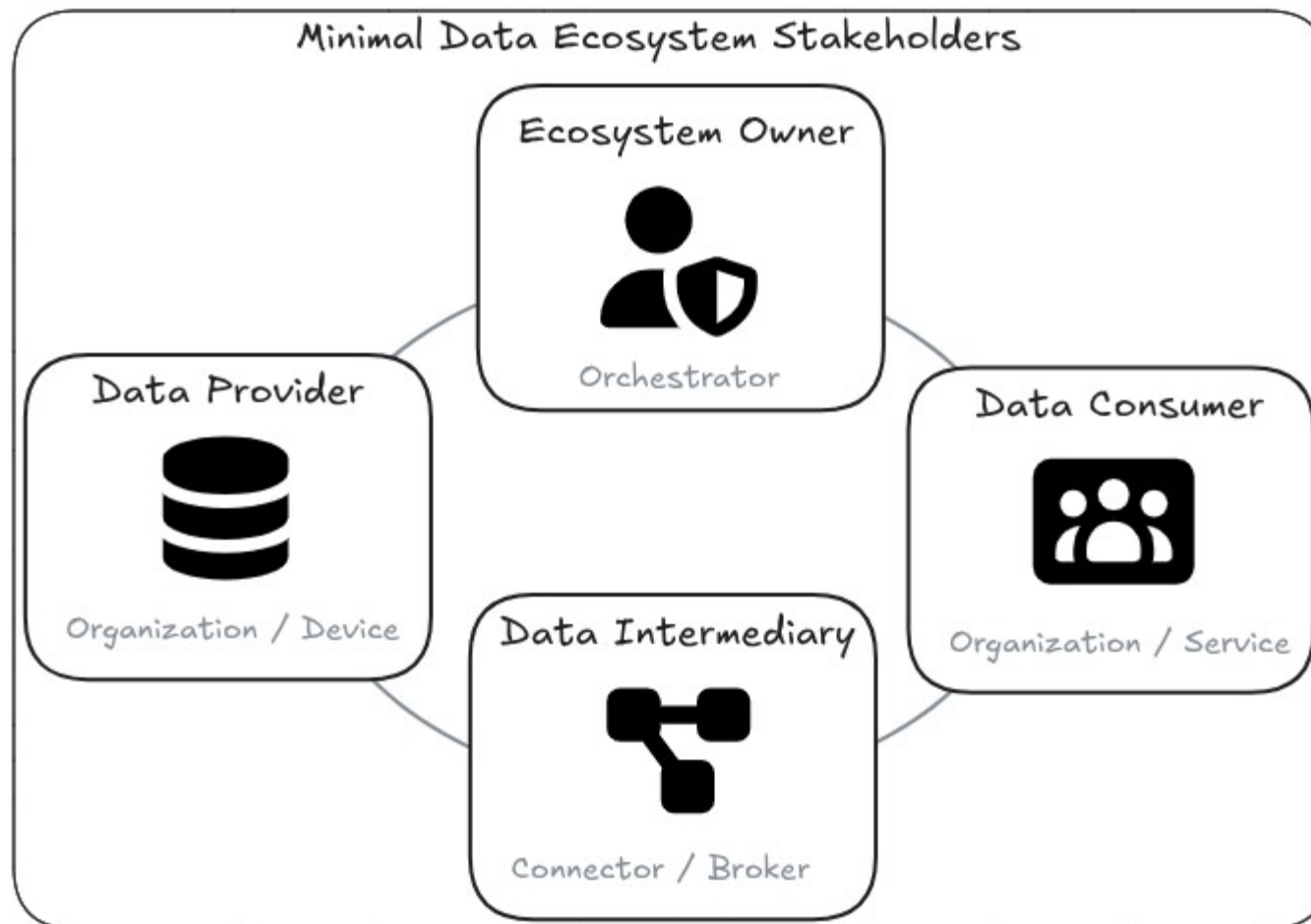


Complexity:
Collecting data is easy but Data governance/management requires significant effort (strategy)



Technical challenges:
security, infrastructure, scalability

Who are the **Stakeholders** in a Data Ecosystem?



What are the key factors?



How are responsibilities **distributed**?



How can data usage be **governed**?



How can stakeholders **retain control** in shared infrastructures?

What are the goals of **Data Governance**?

” *Data governance is a system of rules, roles, processes and standards that ensures data is accurate, secure, accessible and used appropriately throughout its lifecycle.*



Ensuring high quality data to be: accurate, complete, relevant, up-to-date



Transparency & Trust: Traceability of data usage, building stakeholder confidence, accountability



Compliance: Meeting legal and regulatory requirements (e.g. GDPR, industry standards)

Example of Data Governance in Forestry

“The Landesforsten deploy bioacoustic sensors across state forests to monitor forest biodiversity.”

Data Ownership	Privacy & Compliance	Access Control	Purpose Limitation
<ul style="list-style-type: none">• all audio recordings,• all derived species detections and• all biodiversity indicators <p>are owned by the state and managed under public-sector data rules</p>	<ul style="list-style-type: none">• automatic voice filtering before storage• deletion of raw audio after a short retention period• GDPR-compliant processing on EU-based servers	<ul style="list-style-type: none">• Full access Internal biodiversity and GIS teams• Limited access Researchers (species-level data only)• Public access Aggregated indicators (e.g. forest bird index), no raw audio	<ul style="list-style-type: none">• biodiversity monitoring• species trend analysis• reporting to environmental authorities

What is Data Sovereignty?

- Data sovereignty refers to the control, access and usage of data by individuals, organizations or states
- Key legislative frameworks include:
 - EU Data Governance Act
 - Data Act
 - GDPR
- It is a **collective term** summarizing all frameworks, processes, and policies governing how data is managed and utilized within an organization



- *“ Data sovereignty ensures that data remains subject to the laws and governance structures within the nation, region or organization where it is collected ”*

- Essential for responsible data management, compliance, and trust in digital ecosystems

- Deciding who gets to:



access



modify



transfer



process

Example of **Data Sovereignty** in Forestry

“A private forest owner in allows a service provider to run LiDAR scans and AI-based stress detection over their forest.”

Without Data Sovereignty

- The provider could store the data indefinitely
- Sell aggregated forest health data to insurers or timber buyers
- Use the data to train commercial AI models
- Share data with third parties without explicit consent

With Data Sovereignty

- The owner defines a contract stating:
 - data may only be used for the specific monitoring purpose
 - no resale or secondary use
 - no training of external AI models
 - deletion after a defined period
- The owner retains full rights to the raw and processed data
- The provider acts only as a technical processor

How was the structured literature reviewed?

Search strategy

- Tag based search
- Source: *Web of Science, IEEE Xplore, Springer*
 - Year: 2020+

Selection

- Limited on meta studies (surveys & literature reviews)
 - Ordered by citations

Screening

- Filtering through manual abstract & full paper screening
- Extension through snowballing

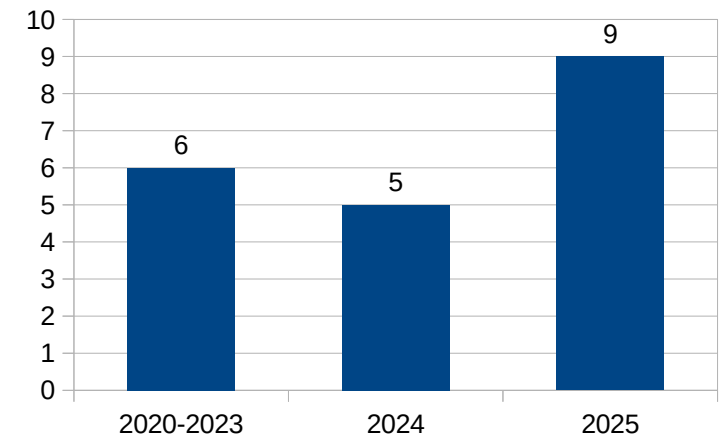
Definition alignment

- Addresses multiple stakeholders
- Data through federated / shared infrastructure

Analysis

- Power asymmetries
- Federated identity management
 - Usage control
 - Trust mechanisms

of Literature found ordered by year



Findings - Platforms

Three platforms appear repeatedly for **federated sovereignty-preserving** data sharing

GAIA-X

- European federated secure data infrastructure initiative
- Provides governance mechanisms and interoperability standards
- Enables sovereignty enforcement through policy-based approaches

IDS (International Data Spaces)

- Reference architecture for sovereignty-preserving data exchange
- Defines usage control frameworks, data connectors and certified components
- Key challenge: post-transfer usage control remains technically unresolved

CEDS (Common European Data Spaces)

- EU policy framework for domain-specific data spaces (health, energy, mobility...)
- Promotes interoperability through shared standards and legal frameworks

Findings - Governance

Trust is still governed more by **legal agreements** than by verifiable technical guarantees

- Many frameworks remain conceptual - insufficient validation in real-world ecosystems
- Ambiguous responsibilities and conflicting incentives
- Misalignment between organizational and ecosystem-level objectives
- **Power asymmetries**
 - dominant organizations may impose rules disadvantaging smaller stakeholders
- Post-transfer usage control are technically unresolved
 - rely on contractual mechanisms

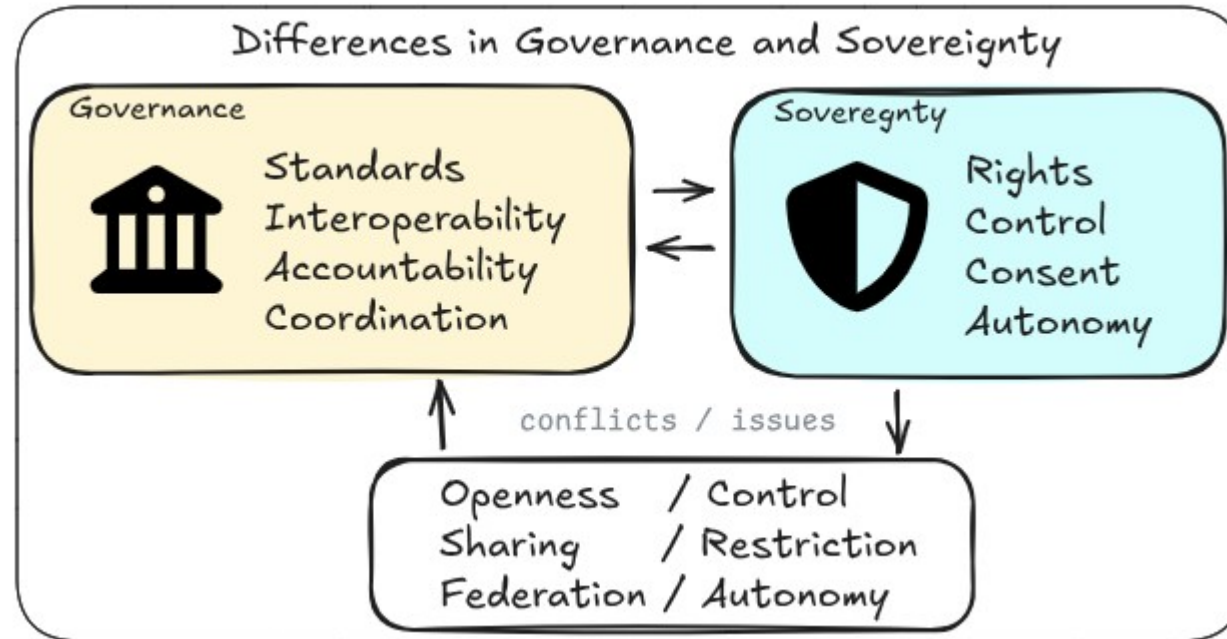
Findings - Sovereignty

Mechanisms for **enforcing sovereignty** across different stages of data access and use are listed

- Access Control Models
 - Role-based access control: permissions based on assigned roles
 - Attribute-based: fine-grained access by data and user attributes
 - Policy-based: rule-driven enforcement across organizational boundaries
- Usage Control
 - Regulates processing
 - Still a **open challenge** in production environments
- Monitoring & Contractual
 - Origin tracking: traceability of data sources
 - Consent management: explicit usage permissions per stakeholder
 - Contractual agreements: define rights, obligations and responsibilities

Differences in Governance and Sovereignty

Governance and Sovereignty provide complementary guidelines for data ecosystems but conflict with each other in fundamental ways



Layered Conceptual Model

Combination of organizational, technical and social factors

Governance Layer

- Organizational & procedural baseline
- Generates transparent, reproducible processes & task clarity for all stakeholders

Sovereignty Layer

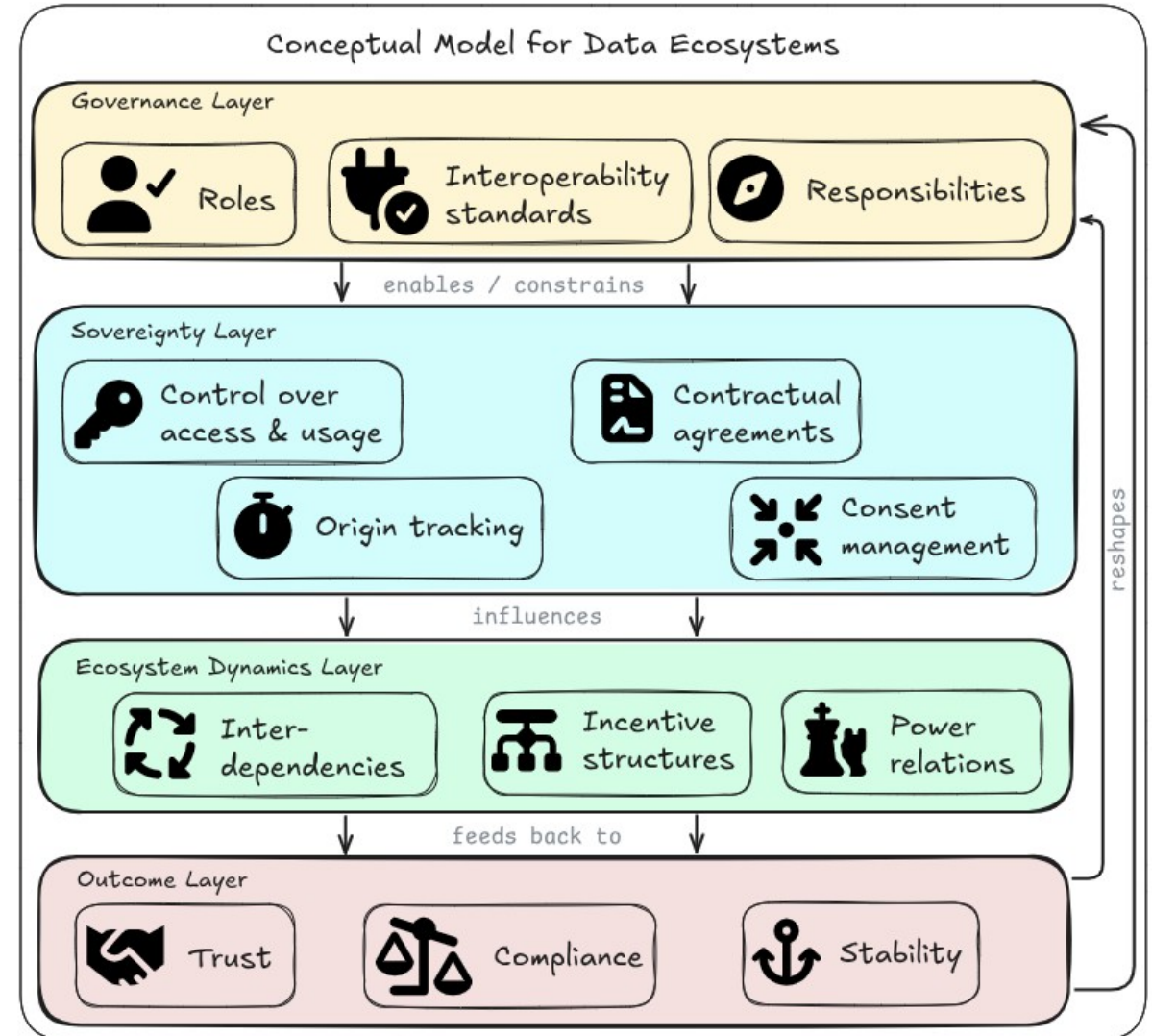
- Social mechanisms for data control
- Ensures data usage aligns with rights of data-providing stakeholders

Ecosystem Dynamics Layer

- Interpretation & application of previous layers via technical implementations

Outcome Layer

- Representation of the system effects



Problem recap



How are responsibilities **distributed**?



How can stakeholders **retain control** in shared infrastructures?



How can data usage be **governed**?

Contact:

M. Sc. Michael Pleger
mic.pleger@ostfalia.de



<https://www.ostfalia.de/hochschule/fakultaeten/fakultaet-informatik/fakultaetsteam/m-sc-michael-pleger>

