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# Best practices to mobilize salmon data: a practical guide for salmon biologists assuming responsibility for data stewardship

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### Abstract

Salmon research, management and conservation generates increasingly vast and diverse data crucial for effective decision making for resource management. Yet, these resources remain largely fragmented across jurisdictions, disciplines and outdated infrastructures, limiting their use in responsive fisheries management. Biologists are increasingly assuming the responsibilities of data stewards to address these challenges, yet often lack clear guidance or institutional support to do so. We provide practical guidance for those transitioning into these essential stewardship roles, outlining actionable best practices specific to the salmon research and management domain, and argue that effective salmon management hinges upon formally establishing data stewardship as a dedicated, institutionally supported professional role. We outline key best practices —including both socio-cultural and technical solutions that collectively ensure salmon data meet FAIR (Findable, Accessible, Interoperable, Reusable) principles and respect Indigenous Data Sovereignty. Through an illustrative case study involving sockeye salmon productivity analyses across Pacific Coast jurisdictions, we highlight how clearly defined stewardship practices can enhance data reproducibility, integration, and management efficacy. With a foundation of shared best practices, salmon data stewards will enable faster, more transparent decisions that draw from broader, cross-jurisdictional datasets, and support development of tools that leverage recent advances in artificial intelligence—ultimately strengthening the management and conservation of salmon populations.

## INTRODUCTION

Salmon biologists generate vast amounts of data on abundance, health, and environmental conditions, yet these data remain fragmented, inconsistently measured, and often incomplete across time, space, and life history stages—limiting their value for robust research, hypothesis evaluation, and management decision-making [Marmorek et al. (2011);Inman et al. (2021);(**diack2024?**);]. Salmon traverse multiple ecological regions and jurisdictional boundaries, resulting in data collections managed by diverse agencies and institutions, often in isolation. This fragmented data landscape undermines timely, integrated analyses necessary for effective management and conservation decisions. Additionally, the lack of institutional support and dedicated roles for data management frequently relegates critical data stewardship tasks to an ad hoc status—something performed off the side of a biologist’s desk. Institutional neglect of formal data stewardship has become a bottleneck in adaptive salmon management and conservation efforts.

The growing complexity of fisheries management, combined with escalating environmental uncertainties due to climate change, demands rapid, integrated, and robust data analyses (Bull et al. 2022). Yet salmon biologists transitioning into data stewardship roles typically receive insufficient guidance or institutional support. We argue that fisheries management agencies must formally acknowledge and fund dedicated data stewardship roles to effectively mobilize and leverage salmon data. Without this institutional commitment, data remain inaccessible and fragmented, severely constraining the responsiveness and adaptability of management actions. To address these critical shortcomings, we outline practical steps that biologists, agencies and organizations can adopt.

## THE PROBLEM

Effective integration and mobilization of salmon data mirrors the complexity of salmon biology itself: these fish traverse freshwater, estuarine, and marine ecosystems, crossing provincial, state, tribal, federal, and international management boundaries (Groot and Margolis 1991). While localized successes in data coordination exist—particularly within regional fisheries management offices and treaty commissions—salmon data integrated across agencies for each phase of the salmon life cycle is rare and prohibitively expensive for all but the most pressing challenges. Most salmon datasets remain confined within institutional silos, often undocumented, stored in outdated systems, or formatted according to internal standards that are incompatible with broader integration efforts. As a result, long-term datasets critical to stock assessment and environmental monitoring frequently become inaccessible, poorly understood, or effectively lost once original data holders retire or move on.

This fragmentation is compounded by the number of disciplines and organizations involved. Geneticists, oceanographers, freshwater ecologists, stock assessment biologists, and fisheries managers all contribute data using their own field-specific conventions and workflows. Meanwhile, data is distributed across federal, state, provincial, tribal, and academic institutions—each with its own mandates, technologies, and metadata requirements. Many salmon data-holding organizations rely on aging infrastructure or opaque, undocumented standards that lag behind modern open-science practices. This tangle of disciplinary and institutional fragmentation slows integration, hinders reproducibility, and delays analyses that could otherwise inform time-sensitive management decisions. Modernizing these systems will require coordinated investment, grounded in shared international data standards and stewardship practices that accommodate the full disciplinary and geographic diversity of salmon science.

The consequences of inaction are already visible. When critical datasets are hard to find, access, or interpret, biologists and analysts lose valuable time trying to reconstruct or harmonize them. This reduces transparency, increases the risk of errors, and delays urgent conservation or management responses. Without clear accountability for data stewardship, the system continues to rely on improvised, inconsistent, and ultimately unsustainable practices.

## THE NEED FOR COORDINATED ACTION

For fisheries managers, modernizing data systems and workflows is essential to improve the quality, speed, and interoperability of operational data assets. These systems must support an increasingly complex decision-making landscape that now depends on integrating broader types and sources of data, often in real time. At the same time, researchers face pressure to generate insights on future salmon abundance, the impacts of changing environmental conditions, and the effectiveness of restoration strategies across all salmon life stages. Yet the current scattered and siloed data landscape remains unfit for purpose—both for science and for management.

Despite operating under different mandates, both researchers and managers struggle to align their data with community-agreed principles such as FAIR (Findable, Accessible, Interoperable, and Reusable) (Wilkinson et al. 2016) and Indigenous Data Sovereignty frameworks like the CARE principles (Collective Authority, Responsibility, and Ethics) (Carroll, Rodriguez-Lonebear, and Martinez 2019; Jennings et al. 2023). Adhering to CARE data management principles is all the more important when it comes to salmon related data given the socio-cultural importance of salmon to the Indigenous communities of the Northern Pacific and Trans-Atlantic (Ween and Colombi 2013; Earth Economics 2021). Large volumes of data collected through long-term monitoring programs hold tremendous value, especially for secondary users—but are often inaccessible due to a lack of time, resources, and incentives for data producers to publish them (LINDENMAYER et al. 2012). Without clear support and guidance, well-intentioned practitioners are left with ad hoc approaches that limit reuse and interoperability. This gap can only be bridged by equipping both data producers and stewards with tools, support, and institutional backing to publish interoperable, machine-readable metadata and datasets in alignment with shared principles.

A coordinated approach to stewarding salmon data should follow established open science standards and adhere explicitly to FAIR principles, tailored specifically for salmon research and management (Johnson and Stap 2024). Achieving meaningful interoperability demands both breadth and depth. **Broad interoperability** integrates diverse scientific domains, systems, and formats, requiring structured, machine-readable data and metadata published openly for maximum discoverability. **Deep interoperability** demands precise definitions of salmon-specific terms and methods, ensuring data remains meaningful and usable across contexts. Salmon data stewards can improve conservation outcomes for salmon by coordinating across boundaries to develop a shared foundation of data stewardship practices.

## DEFINING DATA STEWARDSHIP IN SALMON MANAGEMENT

Data stewardship encompasses the coordinated practices, roles, and responsibilities necessary to effectively manage, share, and reuse data throughout its lifecycle. Within fisheries science, stewardship involves ensuring data quality, compliance with agreed-upon standards, and the establishment of clear governance to guide data collection, documentation, integration, and preservation. However, salmon data stewardship goes beyond mere technical data management; it involves actively facilitating collaboration, communication, and consensus-building among data producers and users across multiple institutions and jurisdictions.

Specifically, effective salmon data stewards perform several critical functions:

* **Technical oversight**: Ensuring metadata completeness, adherence to standardized terminologies and vocabularies, and robust quality assurance protocols.
* **Social and organizational facilitation**: Leading stakeholder engagement, capacity-building activities, and negotiation of data access and sharing agreements, including addressing Indigenous Peoples’ rights and interests in data governance.
* **Institutional advocacy**: Championing the institutional recognition of data stewardship roles, promoting sustained investment and dedicated resources for data management infrastructure and practices.

A user-centered design approach to salmon data stewardship is critical and focuses on creating tools that align with biologists’ needs. Data stewards play a critical role as business analysts, bridging the gap between biologists and IT by translating data needs into application or data system features. When data management is separated from biologists, accountability weakens, and quality issues go unnoticed. While IT expertise is essential for infrastructure and security, effective data system design requires IT to act as an enabler, rather than gatekeeper, provisioning self-serve data infrastructure. The Data Steward, serving as a translator between IT and biologists, enables biologists to engage independently with data systems, fostering ownership and accountability and ultimately improving data quality for research and management.

Dedicated stewardship roles empower salmon biologists to bridge disciplinary divides and jurisdictional barriers, transforming fragmented datasets into cohesive, interoperable resources. By proactively defining, implementing, and maintaining data standards and workflows, salmon data stewards create conditions for timely, accurate, and reproducible analyses. Such stewardship positions salmon biologists to better inform adaptive management decisions, ultimately strengthening salmon conservation and resilience.

## CASE STUDY — UPDATING PACIFIC WIDE SOCKEYE PRODUCTIVITY: WHAT AGENCIES COULD DO NOW

This case study revisits a pacific coast wide sockeye productivity dataset assembled from diverse agency sources by academic researchers (Peterman and Dorner 2012). We reflect not on the significant work the research team accomplished, but rather on the preventable institutional and technical barriers that impeded their work—and continue to burden data updates and reuse efforts today. Their study examined productivity trends across 64 sockeye salmon stocks spanning Washington, British Columbia (B.C.), and Alaska. However, attempting to replicate or build upon this analysis today is an arduous, time-consuming, and error-prone endeavour due to fragmented data sources, inconsistent formats, and lack of standardized practices among the key institutions involved: the Washington Department of Fish and Wildlife (WDFW), Fisheries and Oceans Canada (DFO), and the Alaska Department of Fish and Game (ADF&G).

Each section below highlights a key challenge faced by the team and proposes practical steps based on our best practices that data-holding agencies could do to enable easier integration, validation, and updating of salmon datasets across jurisdictions and decades. This case study illustrates how implementing the foundational concepts and practical recommendations outlined in this paper can transform data stewardship practices within these organizations. By doing so, they can significantly enhance data accessibility, quality, and interoperability—ultimately enabling more efficient and accurate analyses that support salmon conservation and management.

### Challenge 1: Interpreting the Data — What do these numbers actually mean?

Peterman’s team frequently worked with datasets that lacked basic contextual information. Fields such as “year,” “return,” or “age class” were often undefined or inconsistently used. For example, some datasets recorded returns by calendar year while others used brood year, and few included metadata to clarify the distinction. In many cases, the team had to reconstruct metadata by back-checking against reports or simulating assumptions (e.g., about age structure) to interpret the data correctly.

**Remedies:**

* **Best Practice 4. Use Shared Data Models, Vocabularies and Metadata to Enable Integration.** To prevent this kind of ambiguity, agencies can now adopt internationally recognized metadata schemas such as ISO 19115 or Ecological Metadata Language, data models (Darwin Core Data Package) to model age and age type data concepts, and use controlled vocabularies to restrict the permissible values in the age field to calendar year, brood year, or otherwise.
* **Best Practice 3: Make Data, People, Projects, and Outputs Discoverable, Linked and Citable with Persistent Identifiers (PIDs).** Assigning PIDs such as digital object identifiers (DOIs) to protocols, methods, and people (via ORCIDs) and linking them together using data stores and catalogues links data to its provenance and ensures that methods, context, and interpretation decisions are traceable.

### Challenge 2: Accessing and Using the Data — Where is it stored, and how do I get it?

The Peterman dataset was compiled from multiple files scattered across email inboxes, regional offices, and gray literature. Data were stored in inconsistent formats, lacked clear versioning, and were difficult to discover outside of specific research networks. Even today, no API or structured access mechanism exists to update or query the data programmatically. As a result, researchers hoping to build on the dataset may have to start from scratch.

**Remedies:**

* **Best Practice 5: Store Data in Ways That Others Can Easily Access and Use**  
  Agencies can use open-access data repositories or their own institutional data repositories or catalogues that make data discoverable using PIDs and provide programmatic access to data possible using Application Programming Interfaces.
* **Best Practice 2: Reuse Proven Infrastructure to Save Time and Increase Interoperability**  
  Rather than developing bespoke data catalogues or repositories, agencies should adopt existing catalogues used beyond their own institution such as the Ocean Biodiversity Information System, Zenodo, or the Knowledge Network for Biocomplexity). These are proven platforms with a broad user base that support persistent storage, discoverability, and interoperability.

### Challenge 3: Sustaining the Dataset — Who is responsible, and why should I contribute?

Once Peterman and his team completed their analysis, no formal plan existed for sustaining or updating the dataset. Responsibility for ongoing maintenance fell informally to former students and collaborators. Despite its national and international relevance, the dataset was never adopted by an agency as a living product. Moreover, the original data contributors often lacked incentives, support, or recognition for their efforts—conditions that persist in many data environments today.

**Remedies:**

* **Best Practice 1: Make Data Governance Explicit to Support Trust and Reuse**  
  Agencies should define roles, responsibilities, and decision-making processes through formal governance mechanisms such as data product charters.  
  *Practical application:* Use a DACI or RACI framework to assign maintenance responsibility and ensure continuity across staff turnover and institutional change.
* **Best Practice 6: Incentivize and Track Data Sharing and Reuse**  
  Visibility, credit, and metrics are critical for motivating data sharing. Agencies can embed citation guidance in metadata and track dataset reuse through COUNTER-compliant dashboards or DataCite APIs.
* **Best Practice 7: Build Community Through Co-Development and Mutual Benefit**  
   Effective data stewardship requires collaboration between biologists, Indigenous communities, managers, and data professionals. Participatory design ensures that systems and standards meet user needs and are adopted over time.  
  *Practical application:* Facilitate cross-jurisdictional working groups to co-develop data standards and align on shared outcomes for priority datasets.

While the analytical contribution of the Peterman productivity dataset remains significant, the barriers encountered in compiling, interpreting, and maintaining the data are instructive. These challenges are not unique to Peterman’s team—they reflect systemic gaps in data governance, documentation, infrastructure, and incentives. By adopting the seven best practices outlined above, agencies and researchers can transform legacy datasets into living resources, enabling reproducibility, easing collaboration, and accelerating insight across the salmon research and management community.

# Table 1. Best Practices for Salmon Data Stewardship

| **Best Practice** | **Summary** | **Practical Applications** |
| --- | --- | --- |
| 1. Make Data Governance Explicit to Support Trust and Reuse | Establishing clear governance structures ensures quality, accountability, and compliance with FAIR and CARE principles. It enables trust and long-term stewardship across multi-organizational projects. | - Document roles and responsibilities using a Data Product Governance Charter and structured frameworks (e.g., DACI or RACI). - Integrate CARE principles to respect Indigenous data rights. - Form a governance or oversight committee to review data structures, timelines, and agreements. |
| 2. Reuse Proven Infrastructure to Save Time and Increase Interoperability | Leveraging existing platforms and technologies reduces costs and improves long-term interoperability and sustainability. | - Use domain-specific repositories like OBIS or GBIF. - Publish and archive data with KNB or Zenodo. |
| 3. Make Data, People, Projects, and Outputs Discoverable, Linked and Citable with PIDs | Persistent identifiers (PIDs) connect data with researchers, institutions, and outputs—supporting data citation, reuse, and automated attribution. | - Encourage use of ORCID iDs for researchers. - Use ROR IDs for institutions. - Assign DOIs via DataCite for data packages. - Embed DOIs in dashboards and metadata. |
| 4. Use Shared Data Models, Vocabularies and Metadata to Enable Integration | Common vocabularies, metadata standards, and ontologies support integration across systems and preserve semantic meaning. | - Adopt ISO 19115, EML, or DataCite metadata standards. - Model datasets using the Darwin Core Data Package. - Use controlled vocabularies or ontologies with PIDs. |
| 5. Store Data in Ways That Others Can Easily Access and Use | Structured and accessible data formats ensure usability, reduce wrangling, and support integration with analytical tools and applications. | - Provide APIs using FastAPI, Flask, or Django REST. - Archive in trusted repositories (e.g., GBIF, FRDR, USGS). - Use GitHub-Zenodo for DOI assignment and preservation. |
| 6. Incentivize and Track Data Sharing and Reuse | Recognizing data contributors and tracking reuse promotes a culture of sharing and supports professional recognition. | - License data with CC-BY 4.0. - Include citation text and visible credit fields. - Use COUNTER metrics and DataCite APIs to monitor reuse. - Encourage dataset citation in references. |
| 7. Build Community Through Co-Development and Mutual Benefit | Engaging users early ensures tools and standards meet real-world needs and enhances long-term stewardship. | - Participate in RDA Salmon Interest Group. - Facilitate workshops for metadata and vocabulary alignment. - Support community-engaged research with tangible benefits. |

### CONCLUSION

We envision a future where salmon data are not locked in filing cabinets, buried in PDFs, or hidden in siloed spreadsheets, but instead flow seamlessly through a well-stewarded digital ecosystem. In this future, field biologists, Indigenous guardians, modelers, and policymakers interact with a living knowledge system—one that is transparent, discoverable, interoperable, and constantly evolving. Metadata standards, controlled vocabularies, and shared governance frameworks are not afterthoughts but integral to the culture of data collection and use. Scientists receive credit for publishing high-quality data, and users trust the provenance and structure of the datasets they rely on to make critical management decisions.

The process of aggregating and understanding salmon data has been fraught with challenges, from the complex life histories of the species, changing habitat conditions, and human effects to the jurisdictional and institutional silos that obstruct coordination. Salmon traverse political and ecosystem boundaries, yet our data systems often do not. The need of the hour is a strategy that is simple, flexible, and coordinated—one that embraces the FAIR principles while integrating the CARE principles to honor the sovereignty and knowledge systems of Indigenous communities.

In the face of accelerating environmental change and rapid technological innovation, a transformative opportunity exists: to harness fragmented and heterogeneous datasets and translate them into standardized, interoperable data products. These products—rooted in community-endorsed standards and supported by persistent infrastructure—will allow researchers and resource managers to adopt data-intensive analytical approaches, automate updates to population indicators, and integrate diverse datasets into real-time decision-support tools. This marks a critical step toward transitioning salmon science into the “Fourth Paradigm” of discovery(Hey 2012): one driven by data-intensive, cross-disciplinary synthesis.

### Competing interests

A competing interests statement is required for all papers accepted by and published in *Scientific Data*. If there is no conflict of interest, a statement declaring this must still be included in the manuscript.

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