Darwin Core Data Package (DwC-DP) Implementation Experience and Feature Report

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> **NOTE:** Because the introduction of this document provides the rationale for a vocabulary enhancement to Darwin Core and describes how its necessary features were determined, it serves as the Feature Report required by Section 4.2.1 of the TDWG Vocabulary Maintenance Specification as well as the Implementation Experience Report as required by Section 4.2.2 of the TDWG Vocabulary Maintenance Specification for that enhancement.

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Introduction & background

The Darwin Core Data Package (DwC-DP) originated from an effort led by the Global Biodiversity Information Facility (GBIF) to enhance its scientific relevance by expanding its underlying data model. The effort to develop an improved data model involved exploring a series of data use cases, including biological survey and monitoring data, eDNA and metabarcoding data, camera trap data, data associated with tissue samples, specimen data with media, citizen science data from iNaturalist, automatic moth trap data, and organismal interactions data. The first product of that endeavor was a conceptual "Unified Model", which simultaneously accommodated a wide variety of documented use cases for diversification (Figure 1).
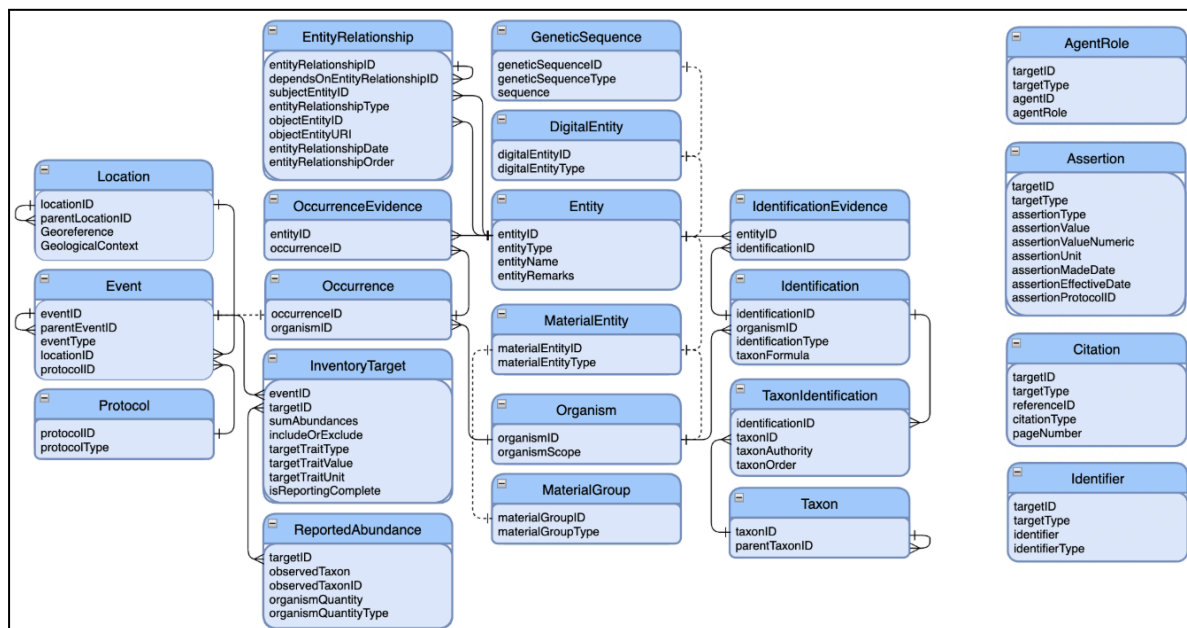

Figure 1. Schematic of the Unified Model (not implemented) as an entity relationship diagram. Boxes indicate entities (tables, classes). The connectors signify the nature of relationships between the boxes they connect. Inside the boxes are a selection of properties (fields) that demonstrate how those connections might be implemented.

The Unified Model was presented to the community in a series of webinars and other presentations between 2021 and 2023 and tested by mapping datasets through some targeted community efforts. While sufficiently flexible to capture each of the data types evaluated, the general consensus of the broader biological data publishing community was that the model was prohibitively complex. The community provided clear feedback that any new data publishing model should:

- be detailed enough to capture complex event-based data structures to effectively support nested survey designs and data types from across biological domains,
- be accessible to the data publishing community in that the complexity is great enough to capture as many data types as possible, but maintain a level of familiarity and consistency with the existing data publishing model, Darwin Core Archive (DwC-A),
- overcome the limitations of DwC-A, specifically the "star schema",
- minimise the number of different data publishing models,

- capture thorough dataset metadata, including project-level and data provenance information,
- ensure that published data meet FAIR standards, and
- support relatively smooth translation of existing published datasets implementing DwC-A to the new data model.

In light of this feedback, the Darwin Core Conceptual Model (Figure 2) emerged as a practical, "just enough" simplification of the Unified Model.
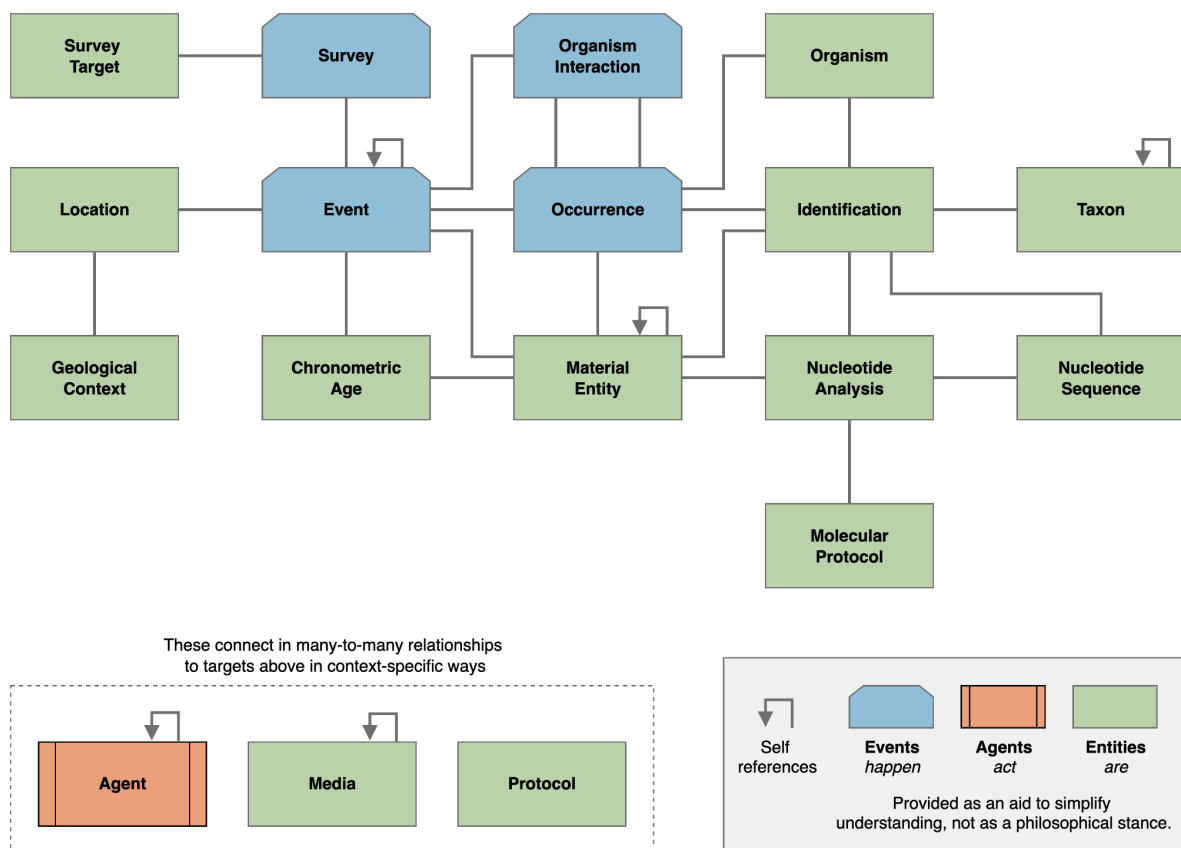
Figure 2. Schematic overview of the Darwin Core Conceptual Model. Boxes represent classes and lines represent relationships between classes.

The addition of the Darwin Core Conceptual Model, together with the Darwin Core Data Package Guide, constitutes a vocabulary enhancement to the Darwin Core Biodiversity Data Standard that allows coherent implementation of a new data publishing model: the Darwin Core Data Package (DwC-DP).

DwC-DP is an implementation of the Conceptual Model using a Frictionless Data Package format. It is simple and similar enough to the existing DwC-A to support community adoption while maintaining the complexity necessary to support richer and more structured biodiversity data publishing. It consists of a JSON file that describes the structure of the Data Package, an EML file to describe the dataset metadata, and the text files (formatted, for example, as CSV) that contain the data. Unlike

DwC-A, DwC-DP does not use 'cores' to structure data, overcoming the structural complexity limitation of the star schema.

In addition, from the community feedback new classes were proposed to the Darwin Core standard and relationships between them defined in the Conceptual Model. These enable DwC-DP implementation to support publication of new kinds of data that DwC-A cannot support, such as Organism Interactions, environmental DNA Surveys, Identifications that support multiple taxa, and Surveys in which detections, non-detections and abundance can be expressed for any user-defined target scope, among many others.

Early use cases

More than 20 use cases were explored in the development of the broader Conceptual Model. Information about 14 of these is available under 'Case Studies' on the [GBIF New Data Model page](#). Seven case studies were presented as part of five public webinars/presentations:

- [Exploring camera trap data](#): This webinar presents a case study exploring camera trap data from [CamtrapDP](#).
- [Exploring collection management systems](#): This webinar covers three case studies exploring specimen data, including specimen data in the Arctos collection management system, specimen data with tissue samples (e.g., VertNet data), and specimen data with media.
- [Exploring eDNA data](#): This webinar reports on a case study exploring eDNA data from soil samples reported by the BioWide project. The [original BioWide dataset](#) is available at GBIF as an occurrence dataset.
- [Exploring interactions data on plant pollination](#): This webinar uses a *Melitaea cinxia* (Glanville fritillary butterfly) population study on Sottunga Island as a use case to report on explorations into capturing organism interaction data. The use case is based on data from Duplouy A., A. Nair, T. Nyman, and S. van Nouhuys. 2021. Long-term spatiotemporal genetic structure of an accidental parasitoid introduction, and local changes in prevalence of its associated Wolbachia symbiont. *Molecular Ecology* 30(18), 4368-4380. https://doi.org/10.1111/mec.16065.
- [Invasive alien species in the GBIF Unified Model](#): This presentation reports on experiences in developing a use case about the management of invasive alien taxa in Flanders – muskrats (*Ondatra zibethicus*).

One case study exploring wildlife disease data from [eNetWild](#) was published as a European Food Safety Authority (EFSA) Supporting publication: ENETWILD consortium, F. Jaroszynska, G. Body, S. Pamerlon, and A.S. Archambeau. 2022. Applying the Darwin Core data standard to wildlife disease – advancements toward a new data model. *EFSA Supporting Publications* 19(11):7667E. https://doi.org/10.2903/sp.efsa.2022.EN-7667.

Darwin Core Data Package use cases

DwC-DP (an implementation of the Darwin Core Data Package Guide) was tested and subsequently enhanced through a series of use cases representing multiple biological domains and data types.

Many of the case studies used to develop the broader Conceptual Model in early efforts were re-opened to test DwC-DP; and numerous others were added. These use cases consist of original datasets that were structured (mapped) to test the Darwin Core Data Package publishing model. Once a first, stable version of DwC-DP was achieved, a webinar formally introduced DwC-DP and a preliminary community testing period was announced. This community testing period was open from the beginning of May 2025 until 1 August 2025. Parties interested in exploring the DwC-DP were provided access to a Data Mapping Guide and a GitHub repository dedicated to the early testing phase. A curated suite of examples were made available in the DwC-DP examples folder. The repository includes example datasets broadly representing three data categories: biological surveys, datasets with material samples, and datasets reporting organism interactions. There are three example datasets for each dataset category. Four datasets were added to the DwC-DP example datasets repository (https://github.com/gbif/dwc-dp-examples) and/or published using the GBIF test instance of DwC-DP Integrated Publishing Toolkit (IPT) during the early community review.

An in-depth overview of the DwC-DP implementation experience for two use cases used in early data model development and in testing the Darwin Core Data Package –the Broke West Fish dataset and the Insektmobilen dataset– is described below.

Broke West Fish, OBIS

'Broke West Fish' is a test dataset derived from a biotic survey with target organism scopes (fish collected by rectangular midwater trawl nets) published by the Ocean Biodiversity Information System (OBIS). This dataset has been a use case several times. It was used as a case study in early data model explorations, and also in developing and testing the Humboldt Extension for Ecological Inventories. Finally, the dataset was used to explore the implementation of the Darwin Core Data Package.

The original dataset is available here. The DwC-DP example dataset folder includes a ReadMe document, the originally mapped data used for testing against the database schema, and output data. The test dataset was successfully published to the GBIF test instance of the DwC-DP IPT and is viewable at broke-west-fish on the DwC-DP test IPT.

The Broke West test dataset was used to explore:

Inclusion of persistent identifier terms in the Survey table. Although IRI equivalents exist for terms in the Humboldt Extension, the current GBIF IPT implementation does not allow publication of these identifiers. The use of identifiers was tested as a means of ensuring coherence in the shared data, since string values alone may vary (e.g., name spellings). By including persistent identifiers such as ORCIDs for *samplingPerformedByID* alongside the name of the person in *samplingPerformedBy* in the Survey table, proper attribution of contributors can be maintained.

Representation of survey targets. In the Humboldt Extension, multiple survey targets are reported in the same table, requiring survey design and effort information to be repeated for each target combination, resulting in clutter. Moreover, survey targets can be expressed from different perspectives, such as listing all taxa within a scope or defining a functional group at the survey area with a given body size range that the sampling gear is capable of detecting. While this can be forced

into the Humboldt Extension using *eco:verbatimTargetScope*, the Survey Target table in DwC-DP provides a more structured and flexible approach for capturing such information.

Representation of community and individual measurements. In marine datasets, measurements are often collected both on complete groups of individuals and on individuals subsampled from a group. For example, the abundance of a fish species within a catch is recorded as a measurement of an Occurrence, while individual specimens from that catch (with their own sample IDs) are further measured for standard length, total length, wet weight, and other traits. Using DwC-A, the common workaround has been to duplicate Occurrence records to accommodate both group- and individual-level measurements (Figure 3). DwC-DP provides a clearer distinction between Occurrence and Material, enabling separate identifiers and measurement assertions to be maintained without duplication.
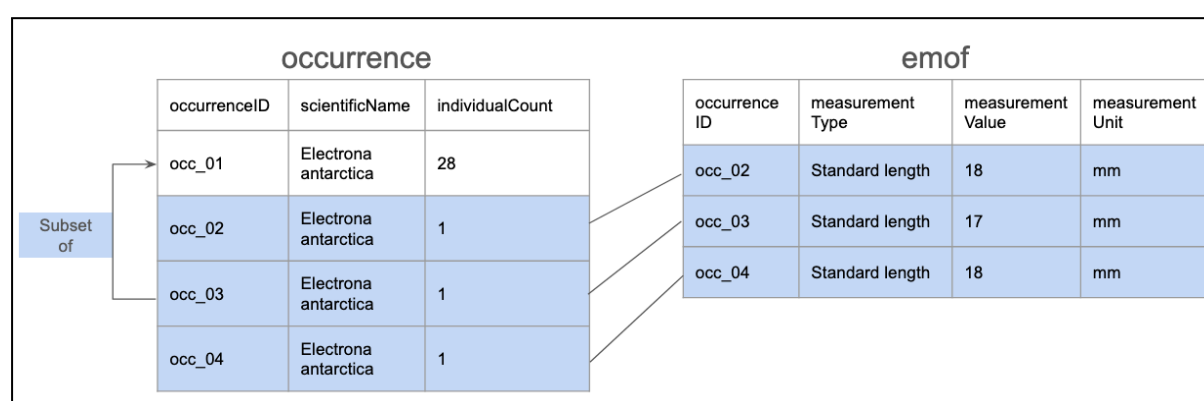
Figure 3. Representation of group- and individual-level measurements in DwC-A. A catch of *Electrona antarctica* (occ_01) is recorded with an individual count of 28, while subsets (occ_02 – occ_04) are duplicated as Occurrence records to capture individual measurements (e.g., standard length) in the extended measurement or fact (emof) table.

Information constrained by the DwC-A star schema. During the mapping process, some information was never published because it could not be easily represented in DwC-A. For instance, the stomach contents of a subset of fish were identified and linked to individual counts and digestion state (e.g., two krill observed in the stomach of specimen 001, itself an individual within an Occurrence of 25 fish). Such nested relationships are difficult to capture within the DwC-A structure. Similarly, specimen photographs could be represented in DwC-A, but the model forces them into the Occurrence core using an audiovisual or simple multimedia extension, which means sampling event information will have to be repeated for all Occurrences. Although associatedMedia can be used within the Occurrence extension alongside Event core, this results in a loss of critical attribution information. This information is not constrained in this way with DwC-DP.

Preservation of identifier meaning. In DwC-A, publishing through an IPT results in an Occurrence table that requires a unique *occurrenceID*, leading to conflation of the Occurrence and Material classes. For example, a preserved specimen (an individual fish from a catch of 25) is represented as an Occurrence record with its own *occurrenceID* and *basisOfRecord* = 'PreservedSpecimen', even though it originates from a single catch-level Occurrence. In practice, the *occurrenceID* is often repurposed to serve as the identifier of the specimen, since the table structure leaves no alternative. In biodiversity research involving material gathering, however, scientists typically track samples with

sampleID, and even different body parts of the same individual can have distinct *sampleID*s. This granularity is lost when data is forced into a single Occurrence table. DwC-DP allows the meaning of identifiers to be preserved by maintaining a clear distinction between Occurrence and Material.

Completeness limitations. The dataset could only be mapped to a limited extent due to completeness issues. Much information was not captured from the start because it was not anticipated for publication, while other details were omitted because DwC-A did not support sharing the information in a structured way. The dataset originally existed as a single Occurrence table and therefore lacked substantial contextual information, which could only be enriched by contacting the data provider. With DwC-DP, such information can now be reported, encouraging researchers to record these details from the start so they become FAIR rather than remaining buried in manuscripts and/or notes.

Challenges of mapping into DwC-DP. Mapping the dataset into DwC-DP required substantial knowledge of the model, which currently consists of 77 tables and presents a steep learning curve. The presence of many-to-many relationships made it difficult to keep track of connections across tables, especially given the high degree of normalization. Numerous identifiers had to be invented during the process, including many (e.g., *identificationID*) that data providers may have never used. If persistence of such identifiers is expected, updating datasets will remain a challenge, as these IDs are difficult to manage and maintain over time.

Ultimately, publication of the Broke West Fish test dataset as a DwC Data Package required 14 table schemas (Table 1).

Table 1. DwC-DP tables implemented to comprehensively map all data from the *Broke West Fish test* dataset.

Agent	Material	Protocol
Agent Identifier	Material Assertion	Survey
Event	Material Media	Survey Protocol
Event Assertion	Media	Survey Target
Identification	Occurrence	

Insektmobilen

The Insektmobilen dataset represents a biotic survey with target organisms (insects collected with roof-top-mounted nets, by citizen scientists) and land cover scopes, collection material, media, DNA metabarcoding data, and multiple identifications. The dataset was originally published as an Occurrence core Darwin Core Archive. The DwC-DP example dataset folder includes a ReadMe, the originally mapped data used for testing against the database schema, and the output data.

The Insektmobilen data was used to explore:

Information constrained by the DwC-A star schema. Ideally, the original DwC-A dataset would have been shared as a DwC Event core dataset, but in that case the star schema limitation meant thatDNA

metabarcoding data associated with occurrence data could not have been shared using the DNA-derived data extension. In order to ensure that published occurrence data included relevant DNA metabarcoding data, the dataset was then shared as a DwC Occurrence core dataset (Figure 4). Sharing the data using the Occurrence core meant that the connection between the data was either misrepresented or excessively repeated. For example:

1. Images taken from the material output of the sampling Events are associated with the individual Occurrences although they represent bulk insect samples (Material) from which the Occurrences are derived.
2. Measurements of the bulk insect sample (i.e. dry weight biomass and DNA concentration) are repeated for each Occurrence, although they represent measurements of the subsampled Material.
3. DNA sequences, their associated Identifications, and sampling Event information were repeated for each Occurrence record, although they pertained to either a child or a parent Event.
4. Survey and laboratory analyses yielded several Material entities that are not well-represented in the Darwin Core Archive.
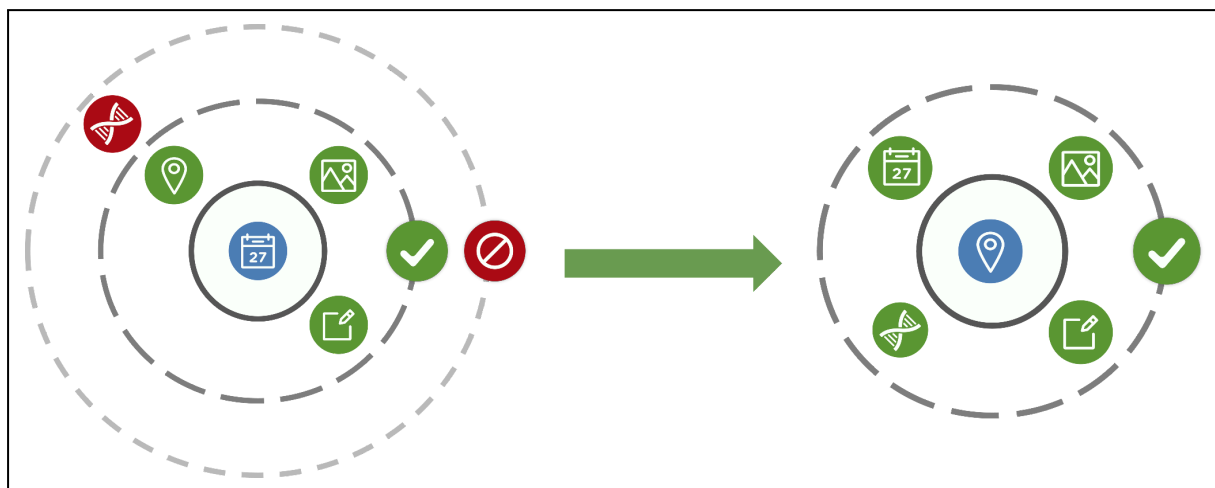
Figure 4. DwC-A star schema limitation for sharing DNA-derived extension associated with Occurrences. Only one layer of extensions is allowed and must relate to the core table. *To the left:* representation of breaking the star schema if the data were shared with DwC Event core. *To the right*: sharing the data with DwC Occurrence core. The date icon represents DwC Event core, the note icon represents the Extended measurement or fact extension, the image icon represents the Audiovisual media extension, the place marker icon represents Occurrences, and the double helix DNA icon represents the DNA-derived data extension.

Mapping DNA metabarcoding survey data to DwC-DP. Mapping the Insektmobilen dataset to DwC-DP provided an opportunity to share a more detailed and accurate representation of data from the project. The process required the implementation of 12 tables. A list of these is shared in Table 2, and their relationships are illustrated in Figure 5.

Table 2. DwC-DP tables implemented to comprehensively map all data from the *Insektmobilen* dataset.

Event	Material Assertion	Occurrence
Event Media	Molecular Protocol	Survey
Identification	Nucleotide Analysis	Survey Target
Material	Nucleotide Sequence	

In general, information was not repeated excessively and more information could be shared in a structured way, with clear data relationships across tables. As with the newly ratified Humboldt Extension for Ecological Inventories for DwC Event core datasets, it was possible to define the scope and targets of the data in the Survey and Survey Target tables. Before, survey-specific information was mostly described in the metadata of the DwC-A version.

This use case also served as a mapping exercise to structure the tables for sharing DNA-derived data: Nucleotide Analysis, Nucleotide Sequence, and Molecular Protocol. The Nucleotide Analysis table defines which protocol was used to yield a specific DNA sequence, and the sequence's relative abundance, from a specific material of a sampling Event. It enabled linking the sequence to the purified DNA extract in a collection, while the Material table provided information on the bulk sample, the raw DNA extract, and the purified DNA extract, thus increasing potential reuse of not only the data point, but the breadth of material behind it. Each DNA sequence was shared only once in the Nucleotide Sequence table, and the Identification table allowed for sharing the identification of each DNA sequence, but also any morphological identifications of the same material, from the same event. Mapping the data to DwC-DP solved several problems faced when mapping the data as a DwC-A:

1. **Sharing media of an entire research project**. Media can be associated with all the main tables. Currently, media of the material is shared, but videos and images taken by the citizen scientist can potentially be shared as Event Media as well.
2. **Limit repetition of DNA-derived identifications**. Only sharing DNA sequences once allows for much smaller tables compared to sharing them as individual Occurrences. This is particularly useful for eDNA surveys that yield thousands to millions of sequences.
3. **Highlight data provenance**. Separating Materials from Events allows for a clear distinction between Survey Events and subsequent material handling in a structured manner.
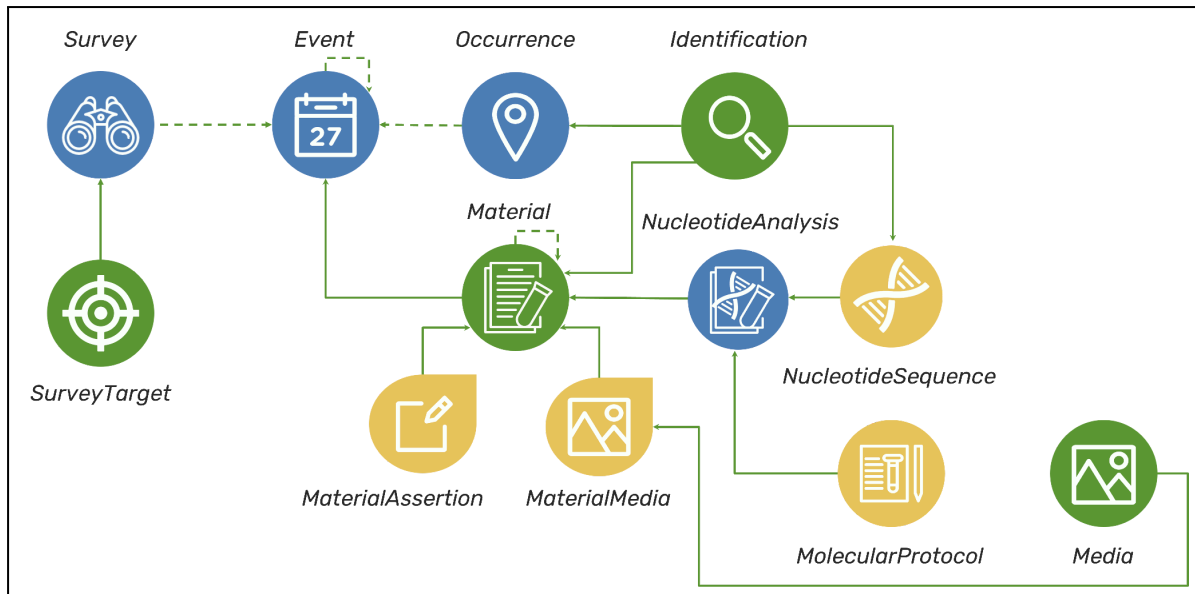
Figure 5. Tables included in the DwC-DP mapping of the Insektmobilen dataset and how they are connected (predicates not shown).

Completeness limitations of the project data. DNA sequences had not been annotated for two out of three primer pairs, which did not allow for proper testing of identifications coming from multiple protocols and primers. The output tables of the use case have some pending updates to be made. For example, the Occurrence table contains missing occurrenceIDs, and the eventID is missing for the morphological identifications. Because of the missing occurrenceIDs, the dataset is not published on the test IPT yet. Sharing richer information on Agents was purposefully left out of the mapping due to privacy concerns. However, several Agent-related tables could be included to highlight when different agents were involved in data generation or processing, and acknowledge the contribution of the citizen scientist who participated in the project.

Challenges of mapping into DwC-DP. Although identifications were only shared for one primer pair, the same species could be detected with multiple primers, which potentially could lead to duplicated Occurrences. If the dataset is updated with Identifications from the two other primers used, it would require the publisher to choose a *isAcceptedIdentification* e.g., for the reference database match with the highest confidence or another threshold. Although much more information could be shared in a structured way in DwC-DP compared to DwC-A, creating identifiers for all tables was challenging. Most of the identifiers that had to be created were constructed from a data context and would probably have benefited from being constructed as non-meaningful identifiers. However, constructing the identifiers based on the data helped inform the relationship of the IDs at a time when the Darwin Core Data Package Relationship Explorer and the Darwin Core Data Package Quick Reference Guide were not available. Lastly, structuring records from a highly nested sample pool into the available tables also proved to be a challenge, although an increased familiarity with the model as mapping progressed helped provide structure. The main challenge was to figure out what constituted an Event; however, this is also a challenge when constructing a DwC-A, hence not a unique issue for DwC-DP. The Material table helped split any subsampling into separate categories, and the option of referring to whether the Material was *derivedFrom* or *isPartOf* allowed for clear data provenance tracking.y

Other community feedback – GitHub

Feedback from the biological data publishing community was also obtained via two GitHub issue trackers: the general DwC-DP GitHub issue tracker and the DwC-DP early community testing issue tracker. These two avenues for reporting issues and discussing concepts, terms, and applications successfully drove a broad series of debates. Feedback and discussion in GitHub included topics such as:

Versioning and addition of new table schemas. The community should be able to extend the data model through the addition of new table schemas. DwC Task Groups could be a mechanism to develop and test each new schema proposed. Each new schema would need to respect the DwC-DP profile (see discussion in issue #114) to ensure there are no adverse effects on existing table schemas. The DwC Maintenance Group could provide support to integrate new schemas, resulting in new DwC-DP versions.

Seeming duplication of classes. It was noted that the DwC ResourceRelationship concept was retained even though DwC-DP includes an OrganismInteraction class. This is because the resource relationship concept can support a much broader range of relationships that cannot be supported by the OrganismInteraction class. Conversely, the ResourceRelationship class is too generic for implementation in data packages precisely because the flexibility of ResourceRelationship can not be validated in practice.

Reuse of DwC Properties and Classes. Inquiries were made into the fact that while developing DwC-DP sometimes DwC terms were reused and adopted, but not always. While the aim in developing DwC-DP was to reuse DwC terms as much as possible, there was a balance in determining when to retain existing classes or properties, rename or update definitions for others, and when to create new ones (that would afterwards be proposed as new terms for the standard). For details, see the GitHub issue #113 - Table Schema property proposal - terms in context. For example, there is a MeasurementOrFact class in DwC that captures information that in DwC-DP would be shared through Assertion tables. While both can coexist, it is proposed that the first be converted into the latter. DwC-DP adds additional terms in Assertion tables as well, to validate or add contextual meaning, for example, referencing controlled vocabularies used for data mapping (issue #89).

eDNA and metabarcoding data. Concerns were raised about creating new schemas and terms for DNA data where other standards exist. The DNA-relevant tables in DwC-DP were constructed based on terms included in the DNA-derived data extension maintained by GBIF, which itself is constructed by incorporating existing data standards, mainly MiXS. An output format for DwC-DP has been implemented in the GBIF Metabarcoding Data Toolkit to help with testing.

GeologicalContext cardinality. The review identified places where the schema table connections required re-evaluation. The issue was discussed thoroughly in GitHub and addressed within the publishing model. See DwC-DP issue #108 for more details.

Taxon class. Although a Taxon class is part of the Darwin Core Conceptual Model, it is not currently included in DwC-DP implementation, as that would require consensus in ongoing community work on this topic. See DwC-DP issue #88 for more details.

Phylogenetic trees and phylogenetic tree tips. To support phylogenies without supporting Taxon explicitly is hard to justify. With that reasoning, PhylogeneticTree and PhylogeneticTreeTip are not currently considered for inclusion in DwC-DP (see issue #111).

Unresolved issues/future challenges

The DwC Maintenance Group, or task groups formed under the interest group, could potentially work on future integration of taxonomy and phylogeny into DwC-DP, and of provenance, rights and references into the DwC Conceptual Model.

Taxon class. The current DwC-DP does not include a Taxon class. Potential integration of Taxon-level information into DwC-DP awaits developments to integrate and standardize the Catalogue of Life Data Package (CoL-DP) and the Taxonomic Concept Schema version 2 (TCS2). See DwC-DP issue #88 for more details.

Phylogenetic trees. Early plans aimed to support the sharing of phylogenetic trees and phylogenetic tree tips with DwC-DP. Efforts to enable this feature will remain on hold until other taxon-related issues have been addressed. Refer to DwC-DP GitHub issue #111 and the original discussion in issue #10.

Rights, Provenance and References. As a result of discussion on GitHub and in other forums, UsagePolicy (GitHub issue #119), Provenance (GitHub issue #103) and References (GitHub issue #49) are included as tables in DwC-DP, but have not been included in the DwC Conceptual Model, as they have not yet been community tested.

Conclusions

After several years of discussion, debate, and stress testing with myriad data types and formats, we feel confident in pushing the Darwin Core Conceptual Model and the Darwin Core Data Package Guide forward for community review, both of which support the implementation of the DwC-DP publishing model. DwC-DP grew from individual use cases, integrating each one while ensuring the whole system continued to work for all of them. DwC-DP addresses the need to capture much more diverse and complex biological data types, but responds to community demands to limit the number of publishing models and to ensure as much consistency with Darwin Core Archives as possible. DwC-DP supports translation of Occurrence and Event Darwin Core Archives without loss of information and allows richer data sharing by overcoming the limitations of the star schema.

Acknowledgements