

ESS-DIVE: Enabling Integration Across Diverse ESS Datasets

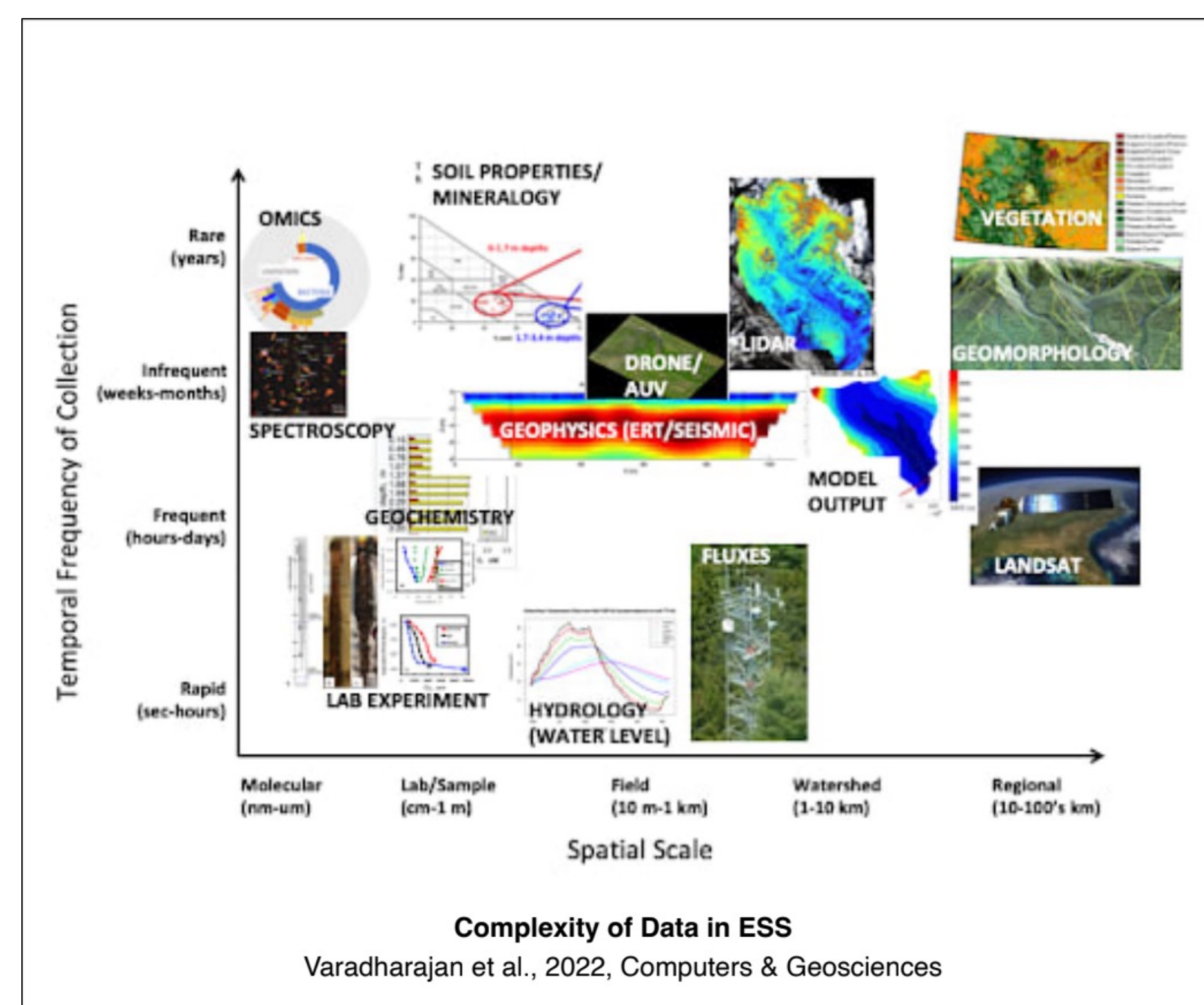
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ESS Data Integration Challenges

The volume, complexity, and diversity of interdisciplinary data collected for ESS-sponsored research present unique data integration challenges.

Use and synthesis of these data are challenging. How can we make these data reusable and interoperable over the long-term?



ESS-DIVE Approach

ESS-DIVE enables ESS projects to follow **FAIR** (Findable, Accessible, Interoperable, Reusable) principles and address data integration challenges by developing **community data standards** and **technologies** that build on their adoption.

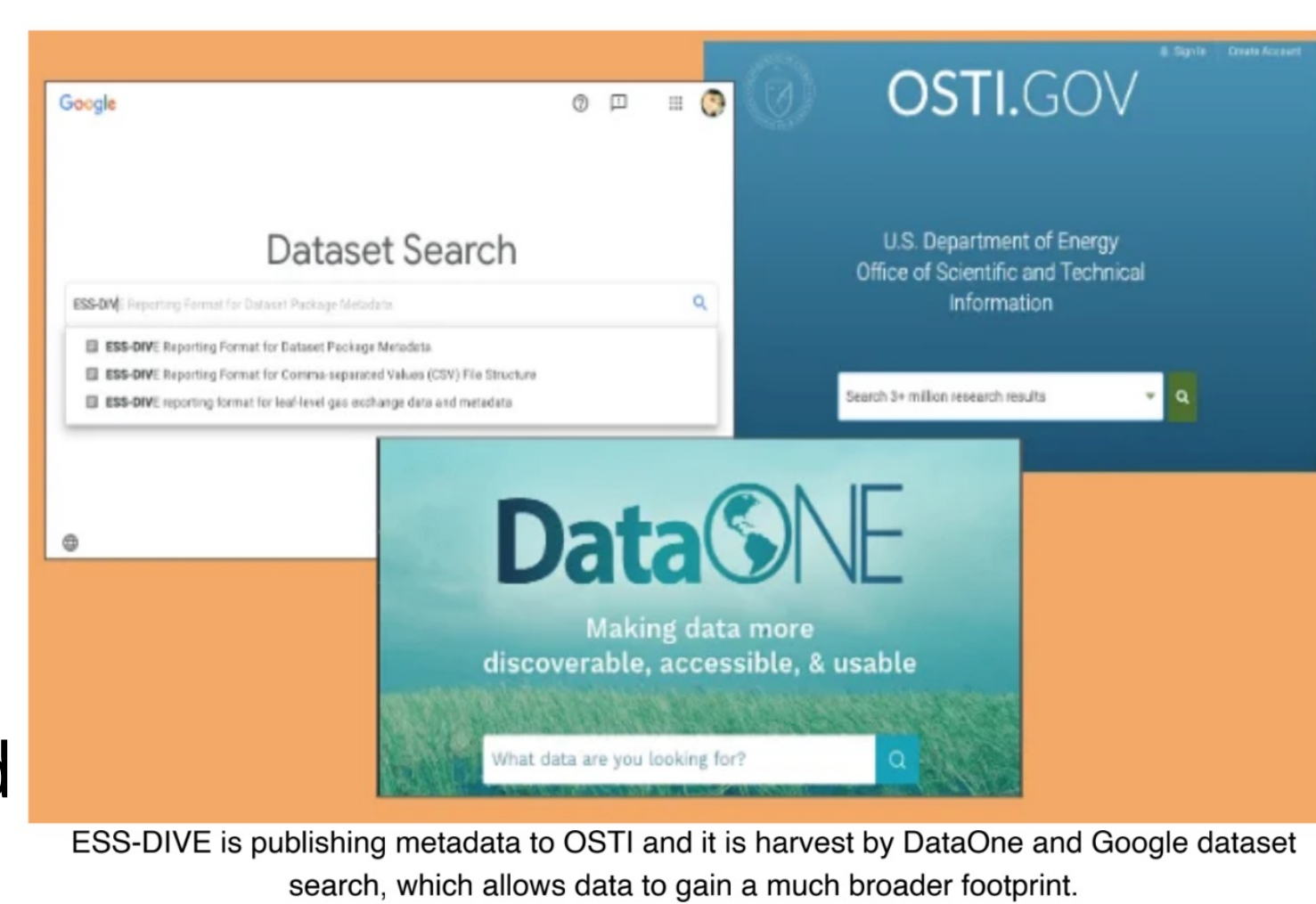
ESS-DIVE is making **ESS data reusable and interoperable**

- publishing dataset metadata in multiple formats for broad access
- creating and encouraging adoption of community data standards
- encouraging use of sample data identifiers
- linking datasets to other recognized data providers

Addressing **challenges of use and synthesis** via technologies that enable advanced data discovery and synthesis of ESS-DIVE datasets that follow community standards.

Cross-listing Datasets

ESS-DIVE dataset metadata are **searchable** and **accessible** beyond the primary ESS-DIVE search page by publishing in multiple formats (e.g. JSON-LD, EML) to Google Dataset Search and DOE's Office of Science and Technical Information (OSTI)



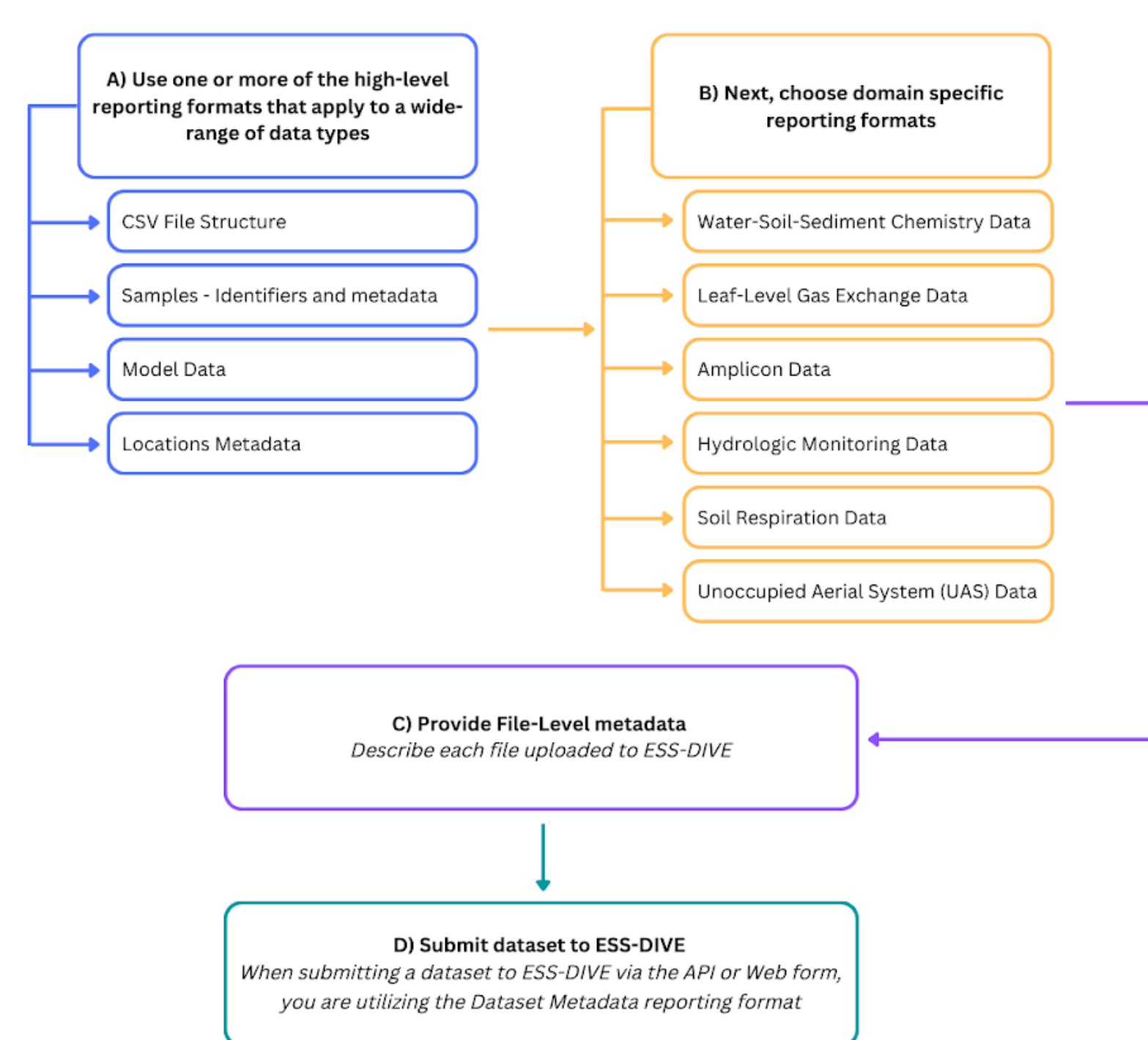
ESS-DIVE is publishing metadata to OSTI and it is harvest by DataOne and Google dataset search, which allows data to gain a much broader footprint.

Making Data Usable & Interoperable

ESS-DIVE is enabling data is reported within Environmental System Science (ESS) to make data more reusable and interoperable.

Data Format Standards

ESS-DIVE works with the scientific community to **co-develop** data and metadata **standards** and **reporting formats** (<https://ess-dive.lbl.gov/data-reporting-formats/>)



12 reporting formats are available for standardizing data and metadata (Crystal-Ornelas et al., 2022). The vision is that these reporting formats:

- will make data in ESS-DIVE **more useful** across communities
- allow scientists to **work across** datasets
- in the longer term, these formats will be more **broadly applied**.

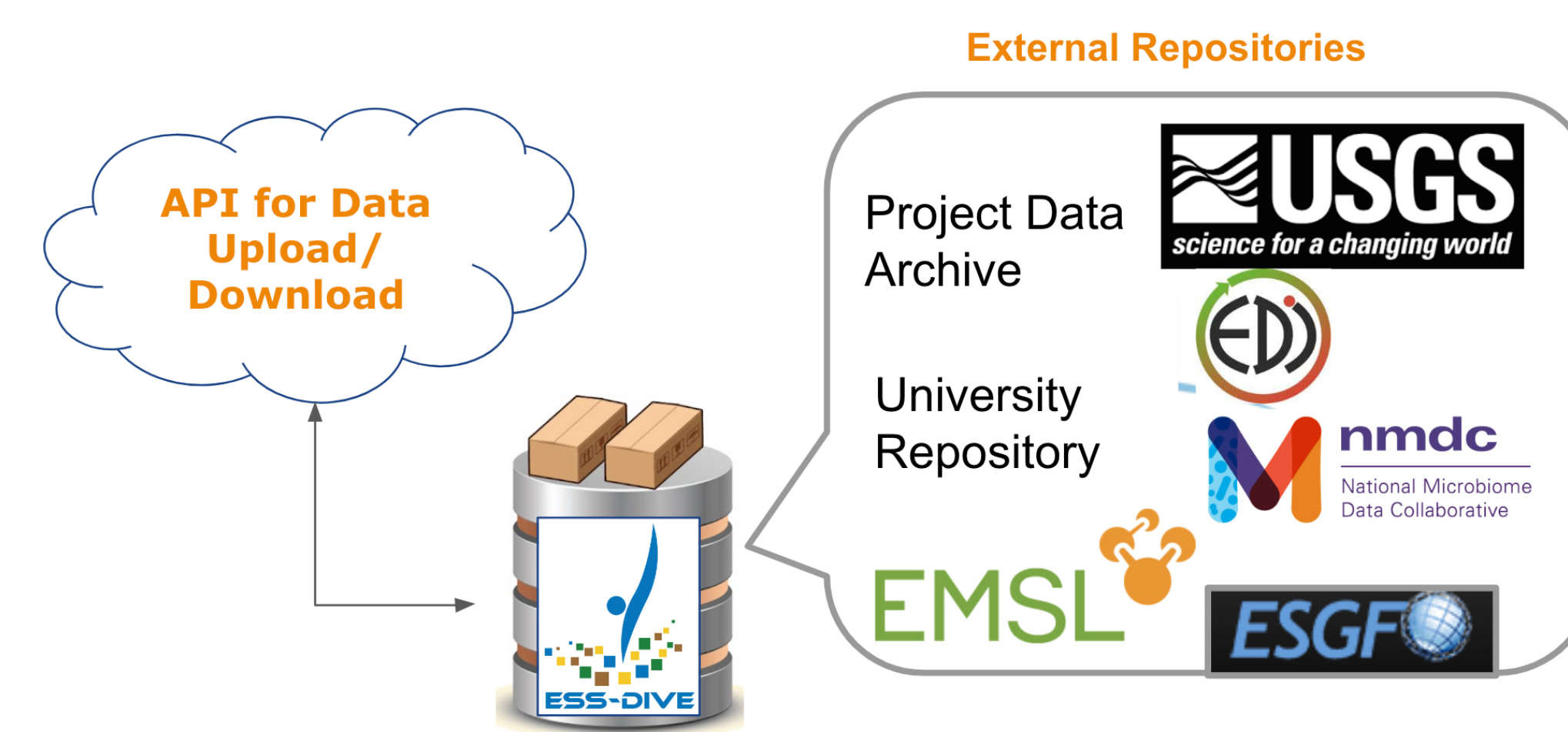
Sample data Identifiers

ESS-DIVE encourages the use of **common standards** for sample data identifiers, such as the **International Generic Sample Number (IGSN)** to track and relate sample data across systems (Damerow et al., 2021).

ESS-DIVE is engaged in discussions with NMDC, KBase, JGI, EMSL on integrating sample data with persistent identifiers. **Let us know if you have a sample data integration use case!**

Linking to Data Beyond ESS-DIVE

ESS-DIVE enables a systematic method for **linking datasets** to other **recognized data providers** directly in its metadata.



External Links to Data or Metadata

ESS-DIVE metadata enable links to related external data

| Description | Relationship | URL |
|---|---|---|
| Soil thickness estimation v1.0 (archived at Zenodo) | [archived at] Complete copy of the data in this dataset | http://doi.org/10.5281/zenodo.4445383 |

This allows metadata to be searchable in ESS-DIVE, while **referencing and linking out** to externally managed data products in a standardized manner. This also allows ESS projects to track all their data together on ESS-DIVE.

Enabling Data Synthesis

ESS-DIVE takes advantage of standardized formats to support **data synthesis** and provide a **deep dive beyond** the dataset metadata into the data.

Dataset Deep Dive

ESS-DIVE Fusion DB makes standardized data searchable via the Deep Dive API (<https://fusion.ess-dive.lbl.gov/>).

- Validates and indexes** ESS-DIVE datasets that are in standard formats
- Automation pipeline** to introspect into the data files themselves (e.g. extraction, summarizing, indexing, error feedback)
- Deep search** for scientific data and their metadata.



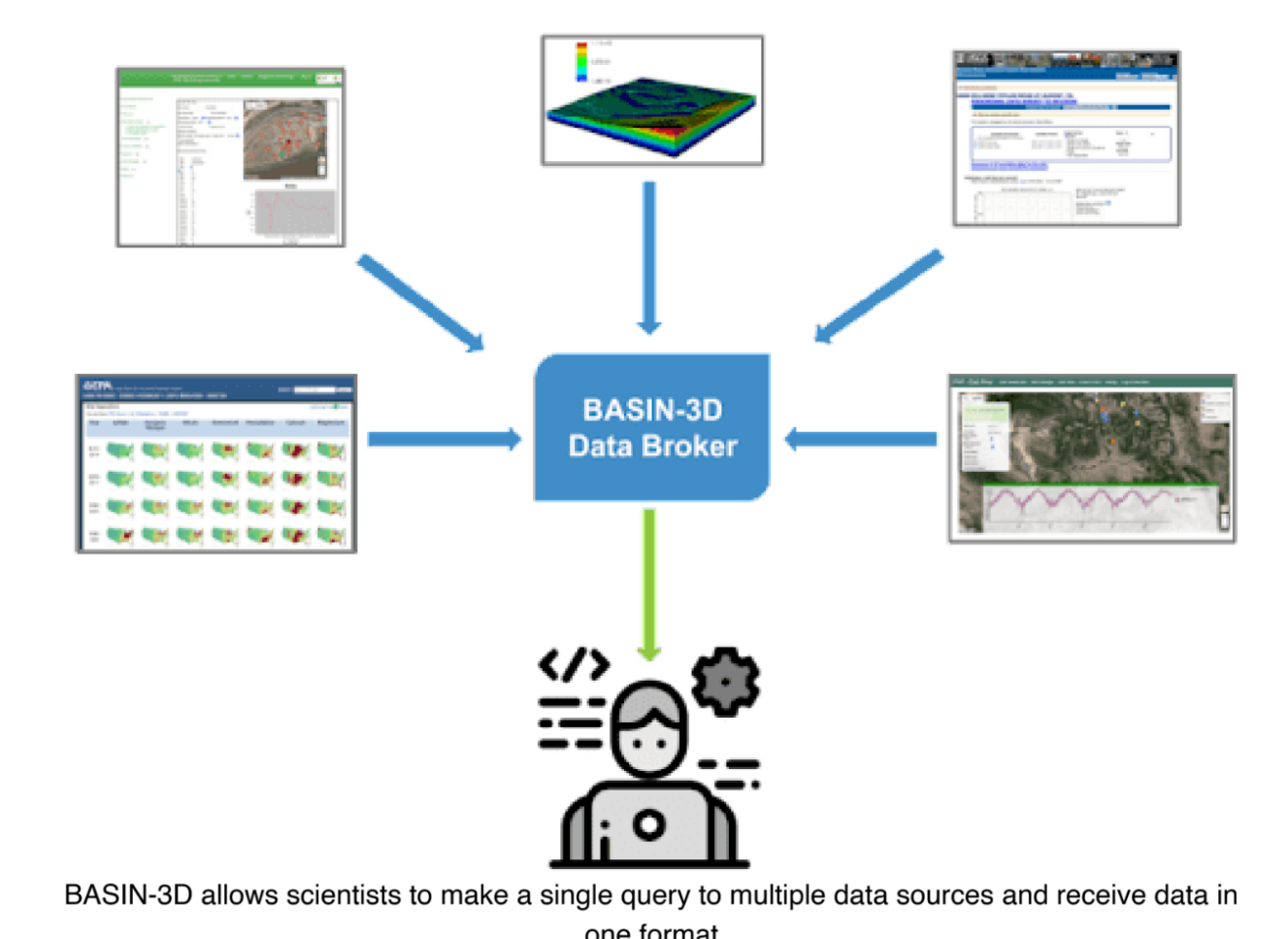
Use ESS DIVE Deep Dive search to

- Find datasets relevant to your scientific research
- Understand if data is valid for your scientific goal
- Download data of interest

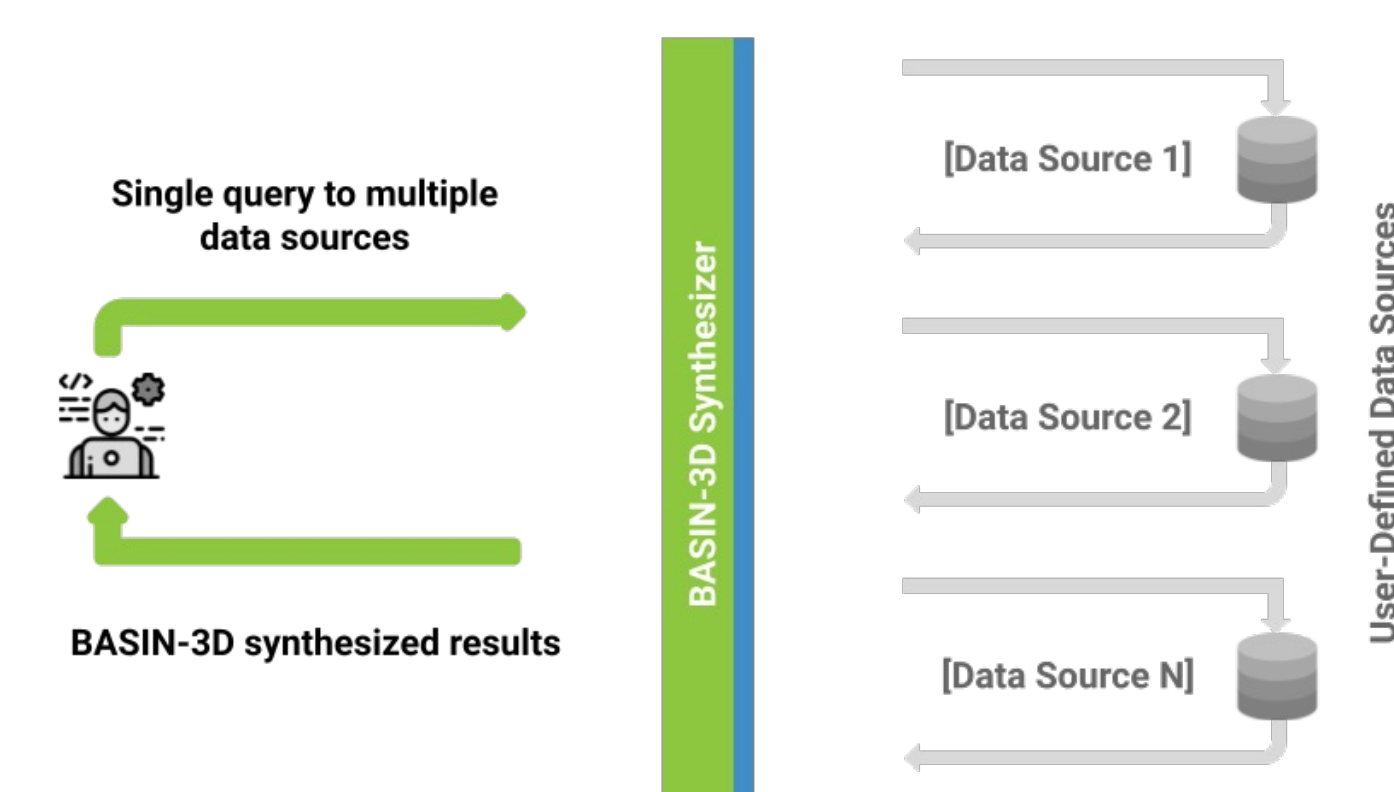
Data Synthesis with BASIN-3D

BASIN-3D is a software ecosystem that **synthesizes diverse earth science data** from a variety of remote data sources on demand and presents results in a harmonized format without the need for storing data in a single database.

BASIN-3D can currently synthesize ESS-DIVE timeseries data that use hydrological reporting formats with USGS NWIS, EPA WQX data (<https://github.com/BASIN-3D>). **Let us know if you have an ESS timeseries data integration use case!**



BASIN-3D allows scientists to make a single query to multiple data sources and receive data in one format



BASIN-3D synthesized results

References

- Varadharajan, C., Hendrix V.C., Christianson D.S., et al. (2022). BASIN-3D: A brokering framework to integrate diverse environmental data. Computers & Geosciences, Volume 159, 105024. <https://doi.org/10.1016/j.cageo.2021.105024>
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- Damerow, J.E., Varadharajan, C. et al. (2021). Sample Identifiers and Metadata to Support Data Management and Reuse in Multidisciplinary Ecosystem Sciences. Data Science Journal, <https://doi.org/10.5334/dsj-2021-011>

Acknowledgements

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