Community recommendations for geochemical data, services and analytical capabilities in the 21st century

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11 Abstract

The majority of geochemical and cosmochemical research is based upon observations and, in particular, upon the acquisition, processing and interpretation of analytical data from physical samples. The exponential increase in volumes and rates of data acquisition over the last century, combined with advances in instruments, analytical methods and an increasing variety of data types analysed, has necessitated the development of new ways of data curation, access and sharing. Together with novel data processing methods, these changes have enabled new scientific insights and are driving innovation in Earth and Planetary Science research. Yet, as approaches to data-intensive research develop and evolve, new challenges emerge. As large and often global data compilations increasingly form the basis for new research studies, institutional and methodological differences in data reporting are proving to be significant hurdles in synthesising data from multiple sources. Consistent data formats and data acquisition descriptions are becoming crucial to enable quality assessment, reusability and integration of results fostering confidence in available data for reuse. Here, we explore the key challenges faced by the geo- and cosmochemistry community and, by drawing comparisons from other communities, recommend possible approaches to overcome them. The first challenge is bringing together the numerous sub-disciplines within our community under a common internationally initiative. One key factor for this convergence will be gaining endorsement from the international geochemical, cosmochemical and analytical societies and associations, journals and institutions. Increased education and outreach, spearheaded by ambassadors recruited from leading scientists across disciplines, will further contribute to raising awareness, and to uniting and mobilising the community. Appropriate incentives, recognition and credit for good data management as well as an improved, user-oriented technical infrastructure will be essential for achieving a cultural change towards an environment in which the effective use and real-time interchange of large datasets is common-place. Finally, the development of best practices for standardised data reporting and exchange, driven by expert committees, will be a crucial step towards making geo- and cosmochemical data more Findable, Accessible, Interoperable and Reusable by both humans and machines (FAIR).

¹² Keywords: FAIR data, data standards, data quality

13 1. Introduction

Data are the backbone of geochemical and cosmochemical research, and their acquisition and use are central to many aspects of our research and education. Over the last century, an ever-increasing volume of geochemical data have been acquired and used to explore a variety of past, present and future processes in the Earth, environmental and planetary sciences (Fig. 1). The growing rate of data generation is complemented by new capabilities in storing, accessing, processing and modelling of large datasets (e.g. Morrison et al., 2017; Duke et al., 2022; He et al., 2022; Wieser et al., 2022).

The increasing need for globally standardised geochemical data has become a common subject of discussion amongst the international scientific community in the last few years (e.g. Stall et al., 2019; Chamberlain et al., 2021; Wyborn et al., 2021; Pourret and Irawan, 2022). Motivated by these developments, the three geochemical data systems

EarthChem, GEOROC and AusGeochem held a joint workshop at the Goldschmidt Con-25 ference 2022: "Earth Science meets Data Science: what are our needs for geochemical data, 26 services and analytical capabilities in the 21st century?" (https://conf.goldschmidt. 27 info/goldschmidt/2022/meetingapp.cgi/Session/3301). This workshop primarily fo-28 cused on exploring the data and infrastructure requirements for addressing future scientific 29 challenges. More information about the workshop programme, participating data systems 30 and attendees is available in the Supplementary Material. This paper summarises the 31 workshop outcomes and provides recommendations for a global geochemical data frame-32 work, required to tackle and accomplish the scientific challenges of the 21st century and 33 beyond. 34

35 2. Motivation

³⁶ 2.1. Diversity and Fragmentation of Geochemical Data

We understand geochemistry as the discipline that integrates geology and chemistry 37 by using the principles and tools of chemistry to develop fundamental understanding of 38 the dynamics of geological systems, from the interior of the Earth to its surface envi-39 ronments on land, in the oceans, and in the air, to planetary systems and the entire 40 galaxy. Geochemistry emerged as a discipline of its own in 1838 and, since then, acquisi-41 tion and analysis of geochemical data have become pervasive in the Earth, environmental, 42 and planetary sciences (Fairbridge, 1998). Geochemistry is exceedingly diverse with many 43 recognised subdisciplines, including aqueous, organic, inorganic, isotope, bio- and physical 44 geochemistry as well as cosmochemistry. Geochemical data have further applications in 45 other disciplines such as archaeology, environmental science and technology, resource ex-46 ploration and development (groundwater, minerals, energy), geohealth, oceanography, and 47 agriculture, and are thus relevant to many United Nations Sustainable Development Goals 48 (e.g. Bundschuh et al., 2017; Gill, 2017; Alexakis, 2021; Wyborn and Lehnert, 2021). 49

⁵⁰ Geochemical data are incredibly diverse in nature and generally only have two common



Figure 1: Increase in geochemical data published in journals and repositories since the late 19th century. (a) Data compiled within the GEOROC database, by publication year of the respective journal articles, as a proxy for the increase in data production within the subdiscipline of igneous geochemistry in the continental realm. Inset: Close-up of earliest publication years. (b) Data compiled within the Petrological Database (PetDB) which contains data complementary to GEOROC with a focus on the oceanic realm, mantle xenoliths and tephra. Inset: Close-up of earliest publication years. (c) Data compiled within the Astromaterials Data System, including data from the MetBase database, as a proxy for data production within cosmochemistry. (d) Cumulative number of data submissions to the EarthChem Library, a domain repository for all subdisciplines of geochemistry. Inset: individual number of data submissions per year.

attributes: firstly, they are "Long Tail", i.e. highly variable and small in volume (Heidorn, 51 2008); and secondly, they are primarily acquired by individual investigators or small teams, 52 often across multiple organisations and disciplines with uncertain funding sustainability. 53 Due to this diversity, many geochemical datasets are stored in incompatible and often 54 inaccessible silos, such as individual computers and locally developed database solutions, 55 or they are restricted to figures without accompanying data tables. As a consequence, and 56 despite numerous data rescue efforts, harnessing the wealth of existing geochemical data 57 is a critical and ongoing challenge. 58

Although there have been many attempts to improve the aggregation, sharing and 59 reuse of geochemical data (e.g. Wyborn and Ryburn, 1989; Carbotte and Lehnert, 2007; 60 Geochemical Society, 2007; Goldstein et al., 2014), present-day practices tend to focus 61 on building geochemical databases in either personal, institutional, national, or program-62 matic silos with a noticeable divide in approaches to data management among the sectors of 63 academia, government and industry. Most of these databases are built for specific research 64 projects and do not offer a long-term sustainable solution. There are very few standard 65 practices amongst authors and publishers to make data easily shareable and interoperable. 66 As a result, geochemical data are highly fragmented, blocked from discovery and difficult to 67 reuse directly from the source dataset without considerable efforts in reformatting the data. 68 Moreover, the same data are duplicated numerous times into multiple compilations and 69 credit is rarely given to those who funded, collected, and/or analysed the original datasets. 70 This fragmentation has a measurable financial impact: the European Commission esti-71 mated the annual direct cost of managing non-standardised research data at EUR 10.2bn, 72 with an additional indirect cost to society of EUR 16bn per year (European Commission, 73 2018). 74

75 2.2. Drivers and Rationale for Connecting the Silos

A number of important resources for geochemical and cosmochemical data were established during the past 30 years, including EarthChem (https://earthchem.org/),

GEOROC (https://georoc.eu/), MetBase (https://metbase.org/), and the Astroma-78 terials Data System (https://www.astromat.org/). More recent initiatives are National 79 Research Infrastructures in Germany (NFDI4Earth), Europe (EPOS), Australia (AuS-80 cope), the US (EarthCube), or Norway (NIRD), to name a few. However, barriers around 81 individual data silos remain, hindering simple, inclusive and global access to geochemical 82 data. To overcome these silo walls, we must develop and implement common, community-83 agreed, global standards for geochemical data and metadata. These standards are critical 84 to making geochemical data Findable, Accessible, Interoperable and Reusable to both hu-85 mans and machines (FAIR; Wilkinson et al., 2016). Not only will FAIR data standards and 86 curation procedures increase the value of new data as they are generated and published, 87 they likewise have large potential for utilising the significant proportion of unpublished 88 geochemical data in research and public sectors from the last century. 89

Recognising that mainstream scientific journals were the most effective agents to rectify 90 problems in data reporting and implement best practices, an Editors Roundtable was held 91 in 2007 as an initiative to bring together editors, publishers, and database providers to 92 implement consistent publication practices for geochemical data. Academic societies such 93 as the Geochemical Society also adopted a policy for geochemical data publication at that 94 time (Geochemical Society, 2007). The Editors Roundtable created and signed a policy 95 statement in January 2009 (version 1.1) that laid out 'Requirements for the Publication 96 of Geochemical Data' (Goldstein et al., 2014). Unfortunately, even 14 years on these 97 recommendations are rarely followed. 98

Recently, the nationally-funded, global data systems Astromaterials (USA), Earth-Chem (USA), GEOROC (Germany), EPOS-MSL (European Plate Observing System MultiScale Laboratories, Europe), MetBase (Germany) and AusGeochem (Australia) came together to enable interoperability between their systems. Yet a vast amount of geochemical data lies outside these initiatives. In response to Open Science policies and demands from the scientific community, a Town Hall meeting on 'OneGeochemistry: To-

ward a Global Network of Geochemistry Data' was held at the AGU Fall Meeting 2019 105 to raise awareness of the increasingly urgent need for global standards and best practices 106 for geochemical data— aiming towards better sharing and linking of data resources into a 107 global network (https://www.agu.org/Fall-Meeting-2019/Events/Data-TH23L). The 108 goal of this meeting was to broaden community awareness of and participation in the 109 initiative and speakers represented relevant stakeholders such as geochemical societies, 110 geochemical journal editors, data infrastructure providers, researchers, and funders. The 111 OneGeochemistry initiative was launched. Since then, the OneGeochemistry initiative 112 regularly leads and contributes to scientific sessions during Goldschmidt, EGU and AGU 113 meetings— including a Great Debate and Webinar at EGU22 ('Where is my data, where 114 did it come from and how was it obtained? Improving Access to Geoanalytical Research 115 Data'; https://meetingorganizer.copernicus.org/EGU22/session/42788; https:// 116 www.youtube.com/watch?v=nqjpOePQUOw)— as well as international for as sciDat-117 aCon and the International Science Council's Committee on Data (CODATA) meetings 118 (e.g. Lehnert et al., 2021; Wyborn et al., 2021). 119

120 2.3. OneGeochemistry Mission

OneGeochemistry is an international collaboration between multiple national organ-121 isations that support geochemistry capability and data production. The focus of this 122 initiative is to better coordinate global efforts in geochemical data standardisation, facil-123 itate communication between groups and lessen duplication of efforts. OneGeochemistry 124 is now taking action, predominantly through volunteer work of its member organisations, 125 to collect, synthesise and promote global, community-driven data conventions and best 126 practices. Such global best practices will enable and simplify the (re)use of geochemical 127 data, making possible a global network of trusted geochemical data, which will accelerate 128 the generation of new geoscientific knowledge and discoveries. 129

Data standardisation begins with community agreement on concepts and vocabularies used to describe analytical data. Such vocabularies are critical to organise and classify data: they set out the common terminology. We require experts for each data type to come together to develop the required vocabularies in both human and machine readable forms, whilst building on and integrating existing definitions from the broader geoscience terminology and other related domains. The community must then agree to use these vocabularies to refer to their concepts of interest, as well as evolve and govern them as requirements change.

In line with modern informatics best practices, all geochemical data will need to comply with the FAIR principles of Wilkinson et al. (2016). OneGeochemistry seeks to make geochemical data outputs as well as related inputs (including samples, instruments, software codes):

Findable (F) through machine-actionable metadata and the systematic use of unique
 and persistent identifiers on inputs and outputs;

2. Accessible (A) using standards and internet protocols;

Interoperable (I) through common formats that incorporate authoritative and re ferrable domain vocabularies; and

4. Reusable (R) through use of rich metadata that provide guidelines on provenance,
 quality and uncertainty, that clearly show identity, funders, and provide open licences.

It is also essential to ensure compliance with the CARE and TRUST principles. The CARE Principles for Indigenous Data Governance (Collective Benefit, Authority to Control, Responsibility, and Ethics) protect Indigenous rights and interests in Indigenous data including traditional knowledge, particularly in the sample collection phase (Carroll et al., 2020). The TRUST Principles (Transparency, Responsibility, User focus, Sustainability and Technology) ensure long-term data preservation and trustworthiness in digital repositories. (Lin et al., 2020).

Efforts have already been made to set standards for specific analytical data types: Deines et al. (2003); Demetriades et al. (2020, 2022); Boone et al. (2022); Flowers et al. (2022); Brantley et al. (2021); Abbott et al. (2022); Horstwood et al. (2016); Dutton

et al. (2017); Walker et al. (2008); Courtney Mustaphi et al. (2019); Schaen et al. (2020); 159 Khider et al. (2019); Damerow et al. (2021); Peng et al. (2022); Wallace et al. (2022). 160 These publications are an excellent first step, however they only cover a subset of the 161 chemical data types and very few conform with the FAIR principles that require data 162 to be machine readable. Hence, these standards need to be converted into the digi-163 tal space (e.g., the IUPAC Digital Chemistry Initiative; https://iupac.org/what-we-164 do/digital-standards/). The next step towards standardisation of geochemical data is 165 to follow Cox et al. (2021) and make the vocabularies, recommended within each stan-166 dard to define different data types, FAIR and available from online repositories such as 167 Research Vocabularies Australia (RVA, https://vocabs.ardc.edu.au/) or FAIRsharing 168 (https://fairsharing.org/). Another important point often missing in existing rec-169 ommendations is a governance structure that allows vocabularies and best practices to 170 evolve. 171

OneGeochemistry aims to become an organisation that coordinates across all geo- and 172 cosmochemical data types, both supporting existing community standards as well as facili-173 tating the development of new ones where needed. Importantly, OneGeochemistry will act 174 as the facilitator in these efforts: the initiative will neither set standards nor implement 175 them, but rather support the community in doing so. A starting point will be to support 176 the digitisation of existing standards to make them, and the vocabularies defined within 177 them, fully FAIR. Fundamental to OneGeochemistry's approach is ensuring that network-178 ing common components across disciplines still enables a capacity for deeper disciplinary 179 specialisation. This will be an ongoing, long-term project that must be continually adapted 180 in line with new or improved developments of data acquisition and with support of, and 181 commitment from, the global geochemical and cosmochemical communities. 182



Figure 2: The sample and data life cycle from acquisition to publication to reuse (adapted from Ramdeen et al., 2022). Tools that support researchers throughout this process include SESAR, a registry for physical samples. AusGeochem, StraboSpot and Sparrow are examples of systems that support researchers from field acquisition of samples through sample preparation and analysis to publication in a domain repository. Repositories such as the EarthChem Library serve the Archiving and Publication of Data, while synthesis databases such as the Astromaterials Data Synthesis, PetDB, GEOROC or MetBase facilitate dissemination and data reuse.

¹⁸³ 3. Challenges for the Community

This paper tackles challenges faced by both the active research community (predominantly at academic and government institutions) and the curated data systems that support this community throughout the research data lifecycle. These data systems can be grouped into four types: 1) Laboratory Information Management Systems, 2) Repositories, 3) Data Portals, and 4) Synthesis Databases. Firstly, Laboratory Information Management

Systems focus on physical samples and cover the first half of the research data lifecycle 189 from sample collection or generation to processing and analysis (Fig. 2). Examples of 190 such systems include AusGeochem (https://www.auscope.org.au/ausgeochem), Stra-191 boSpot (https://www.strabospot.org/) and Sparrow (https://sparrow-data.org/). 192 Secondly, the final data products derived from samples might then be published in Repos-193 itories as well as cited in journal publications. Generalist repositories, such as Figshare 194 (https://figshare.com/), Dryad (https://datadryad.org/) or Zenodo (https://zenodo. 195 org/), publish research outputs irrespective of academic discipline and without review. Do-196 main repositories, in contrast, cater to specific disciplines or subdisciplines and therefore 197 offer data services targeted to the particular requirements of these domains. PANGAEA 198 (https://www.pangaea.de/) and GFZ Data Services (https://bib.telegrafenberg. 199 de/dataservices/) are examples of domain repositories for the Earth Sciences, whilst the 200 Astromaterials Data Repository (https://repo.astromat.org/), the EarthChem Library 201 (https://earthchem.org/ecl/) or the GEOROC Data Repository (https://georoc. 202 eu/) are domain repositories specifically for geochemical data. Thirdly, Data Portals 203 offer a catalogue of datasets hosted by different repositories. For example, DataONE 204 (https://dataone.org/) searches across 44 data repositories of all disciplines operated by 205 research centres, universities, libraries, scientific consortia, non-profit organisations, citizen 206 science initiatives, corporate divisions, governmental and non-governmental organisations. 207 Such data portals greatly increase the discoverability of data products stored in the respec-208 tive systems by searching through their metadata catalogues, including the title, abstract or 209 keywords of individual datasets. Finally, Synthesis Databases compile individual data pub-210 lications and harvest data from the scientific literature to enable data discovery and reuse 211 across multiple datasets. In contrast to data portals, synthesis databases do not only sup-212 port searches across the metadata of datasets in multiple repositories (e.g. title, keywords, 213 etc), they further compile the actual data held in each of these records and allow download 214 of single, combined datasets. Similar to domain repositories, synthesis databases usually 215

specialise in a particular subdiscipline or have a geographical focus. However, in contrast to 216 repositories they do not serve as a data publisher but instead only focus on synthesising and 217 compiling previously published data. Note that we do not consider research datasets de-218 rived from literature compilations as databases here as they usually are ephemeral, one-off 219 research products that are not continuously curated and more importantly, rarely uniquely 220 identify each analysis so that the author and funder can track citations and measure impact. 221 The Astromaterials Data Synthesis, GEOROC, LEPR (https://lepr.earthchem.org/), 222 MetBase and PetDB (https://search.earthchem.org/) are all examples of synthesis 223 databases. These databases provide valuable resources not only for further research but 224 also for teaching. Both repositories and synthesis databases also play an important role 225 in data rescue efforts. Figure 3 shows an example of the flow of geochemical data from 226 natural samples through the IEDA2 (Interdisciplinary Earth Data Alliance) and affiliated 227 data systems. 228

In an ideal world, all analytical data produced in a laboratory and subsequently published in the scientific literature, would eventually be made available in a federated, global data system that makes it easy for others to find, access and reuse these data. Features of such an ideal data system include:

 Relevance & Findability: A variety of data types are available for all types of sample material (natural and synthetic). It is easy to combine multiple databases to search, capture and organise all existing data. These databases contain minimal redundancy and the use of globally unique, persistent and resolvable identifiers (e.g. digital object identifiers, DOIs, and the international generic sample number, IGSN) allows compilation of analyses from the same sample or publication. Database versioning allows reproducibility of previous searches.

Accessibility: User access is facilitated by optimised complex queries, for example
 through a customisable search engine, visualisation, data analysis and export options.
 Access through standard programming languages guarantees machine-readability.



Data Flow through the IEDA2 Data Systems

Figure 3: An example of the flow of geochemical data from natural samples through the IEDA2 (black) and partner (blue) data systems. Together, these data systems cover the entire research data lifecycle as shown in Fig. 2. Note that the EarthChem Portal enables data searches across distinct synthesis databases, in contrast to the data portals described in the text that facilitate metadata searches across different repositories. Not included in this schema is the Library of Experimental Phase Relations (LEPR) for experimental and synthetic materials. For comparison, the AusGeochem system covers stages I to III of this diagram for data produced by Australian geochemistry laboratories.

Furthermore, access is free and open to all: there should be no cost to the researcher in either publishing or accessing data.

3. Data Quality: Data are reliable and their quality is straightforward to assess, i.e.
they follow a common standard that ensures availability of rich sample and analytical metadata (e.g. provenance, description of method and analysis conditions).
Completeness of metadata allows assessment of accuracy and precision, and ensures
reproducibility. Both data providers and data users perform QA/QC; any data quality issues are reported and promptly resolved.

4. Attribution: Appropriate citation of the people, laboratories, organisations, fun-

ders, research artefacts and data is ensured through use of globally unique, persistent
and resolvable identifiers and compliance with international metadata standards (e.g.
the IGSN for samples, the Open Researcher and Contributor IDentifier, ORCID, for
authors, the Research Organization Registry, ROR, for institutions; or the DataCite
metadata standard).

Many of the data systems mentioned above strive to provide such a comprehensive data 257 infrastructure. It is now increasingly recognised that data and metadata capture should 258 start with the collection/production of the sample itself, and not only after data publication 259 (e.g. Damerow et al., 2021). However, there are many challenges along the path towards 260 FAIR geochemical data, many of which have been introduced above. One of the goals of 261 the Goldschmidt 2022 workshop was to investigate these challenges in more detail, so that 262 appropriate solutions for each of them might be developed. These challenges are rooted 263 in the current research culture around geoanalytical data, as well as the limitations of the 264 existing data systems and their often precarious funding situation. 265

266 3.1. Challenges for Researchers

The current research culture in geochemistry means that few researchers are willing to 267 share their data (Chamberlain et al., 2021). Although the recent push for open science 268 has benefited the open data landscape, community understanding and adoption are still 269 centred around individuals. The majority of data producers remain reluctant to share their 270 data unless forced by journal or funding requirements: the EarthChem Library reported 271 an increase in data submissions after several of the AGU journals enforced data publica-272 tions in trusted domain repositories in 2019 (Fig. 1d; https://www.agu.org/Share-and-273 Advocate/Share/Policymakers/Position-Statements/Position_Data). Nevertheless, 274 there is still a widespread lack of adoption of these policies by the research community. 275 Common barriers to data sharing include the additional effort of organising and formatting 276 of data, distrust and protection of personal interests, e.g. with additional work in progress, 277 insecurity about copyright and licensing, lack of knowledge about the most appropriate 278

repository, lack of time, as well as the costs of sharing data (Stuart et al., 2018; Science
et al., 2021; Tedersoo et al., 2021). Yet even those researchers who are willing to share their
data are faced with a number of considerable challenges that we discuss in the following.

Lack of consistent guidelines: Policies on data management vary widely amongst 282 the different funding agencies, institutions, publishers and journals. Funders often require 283 a data management plan at the proposal stage, yet few enforce these requirements once 284 grants are approved. Researchers are neither penalised nor rewarded in response to how 285 they manage their data, prompting the question as to why this requirement exists in the 286 first instance if there is no mechanism for ensuring compliance. In addition, institutional 287 open access policies often do not extend to include research data or a requirement for 288 machine-readable formats— a PDF-copy of published journal articles in the institutional 289 repositories is usually enough to fulfil these guidelines. This effect is compounded by many 290 institutions lacking the resources to support their researchers in appropriate data man-291 agement. Finally, the publishing landscape is as diverse as the journals available. Each 292 publisher has defined their own policies on data management, and often these guidelines 293 differ for each journal even with the same publisher. The publishers Springer Nature, 294 American Association for the Advancement of Science (AAAS) and American Geophysi-295 cal Union (AGU) are proponents of consistent data management practices, requiring data 296 publication in domain repositories prior to manuscript acceptance across many of their 297 journals, yet each have developed their own—differing—guidelines on how to comply 298 with this policy. Dedicated data journals, such as Data in Brief (Elsevier) and Scientific 299 Data (Springer Nature), perhaps present a good alternative in requiring data submission to 300 (domain) repositories and, in addition, providing a platform for publishing and describing 301 data that might otherwise never be made public— for example, data from unfinished or 302 abandoned thesis projects or those transcribed from old, non-digital formats. However, 303 most other journals still accept data tables in formats ranging from tabular (CSV or XLS) 304 to text (DOC, PDF) and even image files (JPEG, PNG) as part of supplementary mate-305

rials or they encourage submission to generalist repositories, such as Figshare, Zenodo or 306 Dryad, where there is no quality control or agreed reporting standards on geochemical data. 307 Researchers, therefore, are faced with the impossible task of navigating these conflicting 308 guidelines, and will generally follow the policy of the journal or publisher they submit to 309 out of fear that their manuscript might otherwise be rejected. When faced with the com-310 plexity of submission to domain repositories (see below), often the publishing option with 311 the lowest workload is chosen. This behaviour naturally leads to highly heterogeneous data 312 published following very different standards, if any, in very different formats across a wide 313 range of repositories or other data publishers. In addition to the many different formats 314 that prevent data from being easily combined and compared, many datasets remain behind 315 a journal paywall and are very hard to access in the first place. Data availability "upon 316 request" also remains a popular option, even though it has been shown to be burdensome 317 and ineffective as a means for data sharing (Vines et al., 2014; Tedersoo et al., 2021). Even 318 for Science, a journal that adopted an open data policy in 2016, 30% of articles do not 319 publish their data at all, and only for about a quarter of articles can research findings be 320 accurately reproduced (Stodden et al., 2018; Yeston, 2021). 321

Complexity of data submission: Good data management takes time. The assem-322 bling and submission of data tables and related information require time and additional 323 effort outside of the primary process of manuscript submission. Usually, substantial pro-324 cessing is performed on raw data coming from an analytical instrument. While this process-325 ing is a common research practice, information on data reduction and reference materials 326 used are often not reported, or only a simplified version is included in the methods or sup-327 plementary information. Yet, reporting this information is crucial for the reproducibility 328 of data and, therefore, a prerequisite for data submission to domain repositories. This 320 considerable, additional investment of research time and resources is often voluntary, and 330 not appropriately rewarded within the current academic structure (Piwowar et al., 2007; 331 Kim and Stanton, 2012). Even though data publications are increasingly visible via (au-332

tomatic) indexing in ORCID profiles, for example, they are rarely counted towards the 333 research track record or valued by recruiting and promotion committees. Whilst assigning 334 DOIs to datasets helps to emphasise the value of data publications, the lack of awareness in 335 the broader research community means that these publications are often not appropriately 336 cited. In addition, researchers who consider submitting to domain repositories are often 337 deterred by the additional processing time before the final data publication. The Earth-338 Chem Library, for example, that specialises in geochemical data, advises a turnaround 339 time ranging from a few days to up to two weeks. PANGAEA, a domain repository for 340 all disciplines within the Earth Sciences, has a data publication timeline of three months. 341 Even though there are good reasons for these timelines— mostly centred around curation 342 as discussed below—, they discourage even more researchers from publishing their data. 343

Variable quality of the available published data: A direct result of the lack of 344 guidelines combined with the complexity of data submission is the highly variable quality 345 of the available datasets. The lack of enforced standard formats for publishing geochem-346 ical data often precludes any quality assessment and, therefore, reuse of published data. 347 Common issues include: dead links or non-existent supplementary material; errors in data 348 reporting; lack of reproducibility due to missing analytical information; and the use of unde-349 fined abbreviations only understood by the owner of the dataset. Data quality assessment 350 is often impossible due to a lack of analytical details or measures of uncertainties, includ-351 ing inconsistent units on uncertainty reporting (e.g. standard deviations, standard errors, 352 confidence interval, 1σ vs. 2σ errors, etc.). When compiling data from multiple sources, 353 additional challenges include inconsistent, non-standardised terminology (e.g. eclogite vs 354 arclogite) and missing units of measurement. Finally, the original owner, funder, and/or 355 creator of the data are rarely credited in compiled datasets. 356

Complexity of citation for data compilation work: The inclusion of all references to the original data sources in published data tables, which is common standard for data collections, does not automatically provide credit in measurable form. In order for

these citations to be tracked, references must be included in the 'References' sections of 360 scholarly literature. Unfortunately, journals commonly limit the total number of citations 361 allowed (often between 40-70) and ask authors to move any additional references into the 362 supplemental information. Yet, references in supplemental information are not properly 363 indexed, not linked to the manuscript, nor tracked accurately— all of which is essential to 364 enable reproducible research and for researchers and institutions to trace data usage and 365 receive appropriate credit for their work. The new "Complex Citations Working Group" 366 of the Research Data Alliance (RDA; https://www.rd-alliance.org/groups/complex-367 citations-working-group) is currently developing a method for handling the citation 368 of large numbers of objects— particularly datasets, software, and physical samples— in 369 scholarly work (Agarwal et al., 2021). They propose the term 'reliquary' to describe a col-370 lection/package of aggregated individual datasets that make up a data compilation used 371 within a specific article. By citing this 'data reliquary', all component datasets would 372 also receive a citation without needing to be included in the article reference list. Work 373 by the RDA group now focuses on (1) the development of a scalable solution and the 374 infrastructure to enable credit for each individual element of this 'reliquary', and (2) its 375 acknowledgement and implementation by journals. 376

Sensitive data: Finally, an important consideration within both the FAIR and CARE 377 principles is how to handle sensitive data that should only be discoverable by certain, autho-378 rised persons or only available after an embargo period. This access control is particularly 379 important for geochemical data produced or funded by industry and for agencies that deal 380 with classified information. Fortunately, good technical solutions already exist, simply re-381 quiring clear licensing of datasets and the ability of repositories to handle management of 382 temporary embargo periods during the publication phase. Such solutions are already im-383 plemented in many geochemical repositories, including, for example, CUAHSI HydroShare 384 (https://www.hydroshare.org/) or the EarthChem Library. 385

386 3.2. Challenges for Data Systems

Some of the challenges for researchers detailed above are related to current limitations 387 of data repositories and synthesis databases. One major issue lies with the resources avail-388 able to these data systems and the sustainability of funding. Long-term staffing solutions 389 for data curators that assist researchers with data submissions are vital for data systems. 390 The advantage of publishing data in domain repositories is that the research data are doc-391 umented in a format specific to the discipline and the respective data type, which ensures 392 that data quality can be easily assessed and data users have greater trust in individual 393 datasets. By collecting data in domain repositories, they are also more visible and easier 394 to discover for others in the field. Even though data sharing practices vary widely between 395 scientific disciplines, the greater discoverability of datasets published in curated domain 396 repositories often leads to greater reuse— and ultimately citation— of these data and the 397 associated publications (e.g. Piwowar et al., 2007; Science et al., 2021). Yet in order to 398 consistently provide this service, domain repositories need to employ curators with domain 399 expertise who carefully review each data submission. Many researchers of today are not 400 familiar with all intricacies of data management, and hence data submissions are often not 401 consistent. While it takes the researchers a considerable amount of time to collate this 402 information, repository curators then need to invest further time to convert submissions 403 to their internal standard and ensure all data and metadata are transparent and easy to 404 understand by third parties. 405

More often than not, repositories are not funded for this additional work and are struggling with staffing issues. These problems arise because many of the data systems catering to a specific domain were born out of research projects that succeeded in attracting additional funding to further develop their infrastructure. However, this funding is usually temporary and restricted to the development of new technologies or services— system maintenance and curation are rarely funded by national science foundations. What is more, these data systems compete for funding with researchers within their domain. Although it has long been recognised that the benefits of open data infrastructure, and the measurable resources saved by their existence, far outweigh the costs of building and maintaining this infrastructure (e.g. Ball et al., 2004), most data systems still struggle for long-term survival. Far too often, data systems that are widely used by the research community are orphaned because of discontinued funding: MetPetDB and SedDB are pertinent examples of such systems that are no longer maintained, and at worst are no longer available to the community.

The availability of resources is intricately linked with community-uptake of domain 420 repository services. For many data systems, it is an ongoing struggle to entice more 421 researchers to submit their data, something which they require as an indicator for their 422 success and continued funding. With additional resources, data systems could better raise 423 awareness within the community, as well as expand their user support, in turn increasing 424 the number of datasets submitted by researchers. Ideally, resources would also be allocated 425 to provide training materials and build guided workflows that operate across repositories 426 and other publication platforms to make it easy for researchers to follow best practices. 427

428 4. Approaches to similar challenges in other communities

Despite the various challenges outlined in the previous section, this topic is not new 429 and other disciplines have successfully begun adopting FAIR data practices. In analytical 430 science, particularly where the same data type is collected by multiple laboratories and 431 institutions, informed decisions on whether or how to (re)use any digital analytical dataset 432 is dependent on a consideration of what practices have been used to obtain the data and the 433 provision of information about the quality specifications (Peng et al., 2022). The following 434 summarises successful approaches to data standardisation and quality assurance in other 435 communities that the geochemistry community can learn from. 436

437 4.1. Chemistry

The International Union of Pure and Applied Chemistry (IUPAC) has a record of over 438 100 years in fostering a global consensus to define and develop a common and systematic 439 nomenclature for chemistry. IUPAC has developed the International Chemical Identi-440 fier (InChI; Heller et al., 2013), a non-proprietary identifier for chemical substances that 441 provides a standard way to encode molecular information. IUPAC has also produced a 442 series of colour books that are regarded as the world's authoritative resource for chemi-443 cal nomenclature, terminology, and symbols. International committees of experts in the 444 relevant sub-disciplines of chemistry draft the recommendations that are then ratified by 445 IUPAC's Interdivisional Committee on Terminology, Nomenclature and Symbols (ICTNS; 446 https://iupac.org/body/027/). The Terminology definitions are published by IUPAC 447 and include books for 448

- 449 1. Naming Chemical Structures
- Blue Book: Nomenclature of Organic Chemistry 450 • Red Book: Nomenclature of Inorganic Chemistry 451 • White Book: Biochemical Nomenclature 452 2. Describing Chemistry Concepts: 453 • Orange Book: Terminology for Analytical Methods 454 • Purple Book: Polymer Terminology and Nomenclature 455 • Silver Book: Properties in Clinical Laboratory Sciences 456 • Green Book: Quantities, Units and Symbols in Physical Chemistry 457 Other IUPAC initiatives include the Gold Book Compendium of Chemical Terminology 458 (https://goldbook.iupac.org/), the Commission on Isotopic Abundances and Atomic 459 Weights (https://www.ciaaw.org/) and the Machine Actionable Periodic Table (https: 460 //pubchem.ncbi.nlm.nih.gov/ptable/). Advancement of digital activities and strategy 461

within IUPAC largely sits with the Committee on Publications and Cheminformatics Data
Standards. IUPAC is currently transforming from a Centre of Excellence for Chemistry
Standards to a Centre of Excellence for Digital Chemistry Standards. Many of their digital
standards could be leveraged by the global geochemistry community (Stall et al., 2020).

IUPAC is primarily a volunteer-based organisation with a modest amount of project 466 funding primarily supported through subventions paid by its member bodies (chemical so-467 cieties or national academies, and some publications income). A small staff office supports 468 the organisation generally, but most volunteers utilise basic infrastructure of their organi-469 sations while they work on projects. After the life of the projects, standard specifications 470 are generally available as open access publications. Further development and ongoing 471 support are primarily coordinated through partnerships with external and affiliated or-472 ganisations. For example, the InChI Trust is a member-supported charity organisation 473 affiliated with IUPAC who develops and maintains the code-base that encapsulates the 474 IUPAC InChI standard specification. Organisations contributing to the InChI Trust in-475 clude journal publishers, chemical societies, government organisations, software vendors 476 and academic organisations. 477

478 4.2. Crystallography

Crystallography has a long history of discipline standardisation starting with develop-479 ment of the Crystallographic Information Framework (CIF) in 1991 under the auspices of 480 the International Union of Crystallography (IUCr). The CIF standard is a general, flexible 481 and easily extensible free-format archive file that was designed to be a machine-readable 482 standard for submissions to Acta Crystallographica and to crystallographic databases (Hall 483 et al., 1991). A CIF dictionary also stores the name, version and time of update, thus 484 enabling precise citation of the standards used to support a particular data set (Hall and 485 Cook, 1995; Hall and McMahon, 2016). Domain repositories ensure the long term preserva-486 tion and access to derived results and processed data published in standard formats (Bruno 487 et al., 2017; Groom et al., 2016; Bergerhoff and Brown, 1987; Berman et al., 2003). These 488

crystallographic repositories also support joint workflows with journal publishers that lower 489 technical barriers to data publication by researchers. Further, domain repositories provide 490 services that enable the discovery and reuse of both data and derived knowledge across 491 domains in academia and industry (Taylor and Wood, 2019). For example, the IUCr is 492 taking a lead in ensuring that the preservation of raw diffraction data is viable at a number 493 of distributed and centralised data archives, each of which registers a dataset and uniquely 494 identifies it with a persistent identifier (Kroon-Batenburg et al., 2022). The IUCr provides 495 tools with online validation checks and validation of the data is part of the peer review 496 process for journals (Spek, 2020). Some journals that publish papers on crystallography 497 also sponsor the development of validation tools. 498

Data infrastructure in crystallography is funded through a variety of mechanisms in-499 cluding research grants, subscription and licensing, and governmental support (Bruno et al., 500 2017). The development of standards in crystallography is supported by IUCr, with the 501 checkCIF service being supported by sponsorship from publishing organisations. Standard 502 activities also rely heavily on volunteer effort as the scientific unions are limited in the 503 level of support and coordination they can provide. The work of the Worldwide Protein 504 Data Bank (wwPDB) in structural biology is primarily supported by direct funding from 505 government. Conversely, data organisations supporting chemical crystallography do not 506 receive direct public funding and must generate their own revenue, which is typically done 507 by charging industry and academia for access to value-added software and services. 508

509 4.3. Seismology

Another example in the development of global community standards for a geoscience data type has been the International Federation of Digital Seismograph Networks (FDSN; https://www.fdsn.org/) which is a commission of the International Association for Seismology and Physics of the Earth's Interior (IASPEI) of the International Union of Geodesy and Geophysics (IUGG). The FDSN began in 1984 when multiple countries agreed to create a global network around those scientists using broadband instrumentation compatible with

community developed specifications (Dziewonski, 1994). In 1987 expert groups within the 516 FDSN were instrumental in the development of a universal standard for the distribution 517 of broadband waveform data and related parametric information, the SEED format (Stan-518 dard for Exchange of Earthquake Data). The SEED format was adopted by instrument 519 manufacturers and has since gone through several evolutions. The FDSN also developed a 520 specification that defines RESTful web service interfaces for accessing common FDSN data 521 types online and publishes a list of Federated Data Centres that provide FDSN-compliant 522 web services (https://www.fdsn.org/webservices/datacenters/). Network operators 523 can apply for FDSN Network codes through the FDSN website to provide unique identifiers 524 for seismological data streams, which are required in publications to uniquely identify and 525 attribute the networks that generated the data (Evans et al., 2015). FDSN is an inter-526 national non-governmental organisation with volunteer membership (Suárez et al., 2008). 527 All funding is derived from voluntary contributions by member institutions. 528

529 4.4. Geological Map Data

In 2003, the GeoSciML (Geoscience Markup Language) project was initiated under the 530 auspices of the Commission for Geoscience Information (CGI) working group on Data 531 Model Collaboration and endorsed by the International Union of Geological Sciences. 532 GeoSciML is an XML-based data transfer standard for the exchange of digital geoscien-533 tific information, which is mainly focussed on the representation and description of features 534 found on geological maps, but is extensible to other geoscience data such as drilling, sam-535 pling and analytical data (Sen and Duffy, 2005). In 2007, GeoSciML was adopted by the 536 OneGeology initiative to underpin and improve the accessibility of global, regional and 537 national geological map data (Jackson and Wyborn, 2008). 538

539 4.5. The Oceans Best Practice System and IODP

The Ocean Best Practices System (OBPS, www.oceanbestpractices.org), is an initiative of the global Intergovernmental Oceanographic Commission (IOC) of UNESCO,

supported by the International Oceanographic Data and Information Exchange (IODE) 542 and the Global Oceans Observing System (GOOS). The OBPS site supports technolog-543 ical solutions and community approaches to ensure FAIR methods and associated data 544 and to facilitate the development, documentation and sharing of ocean best practices. As 545 of 1 March 2023, the OBPS site contains 1787 best practice documents from 52 institu-546 tions/organisations: as new documents are submitted, they are reviewed and endorsed by 547 expert teams (Przesławski et al., 2022). OBPS further runs an ambassador programme 548 to promote equitable access to ocean best practices across communities, disciplines, and 540 regions. 550

Each institution/organisation can submit their best practice documents including qual-551 ity documents specific to their data acquisition programmes. The Australian Integrated 552 Marine Observing System (IMOS), for example, operates a wide range of observing equip-553 ment throughout Australia's coastal and open oceans and makes all of its data openly and 554 freely accessible. Documents related to the quality of their datasets, including quality speci-555 fications, quality evaluation, execution and dissemination are published by IMOS on the in-556 ternational OBPS site (Ruth and Atkins, 2022, https://repository.oceanbestpractices. 557 org/handle/11329/556). Publication of best practice documents in a single site from so 558 many organisations leads to convergence and ultimately globalisation of best practices, 559 meaning that a practice can be accessible and usable in multiple regions. At the same 560 time, best practices can be adapted to match regional infrastructure capabilities (Przes-561 lawski et al., 2022). 562

The International Oceans Discovery Program (IODP, the successor of the Ocean Drilling Program, ODP; https://www.iodp.org/) further requires that samples collected on their cruises are archived in one of three recommended repositories. Access to samples is open and transparent to scientists, educators, museums and outreach officers, but regulated by strict policies that ensure their appropriate use and specify the reporting of any research outcomes derived from these samples (https://www.iodp.org/top-resources/programdocuments/policies-and-guidelines/519-iodp-sample-data-and-obligations-policyimplementation-guidelines-may-2018-for-expeditions-starting-october-2018-andlater/file). These outcomes are made available through the integrated data and publication portal SEDIS (Scientific Earth Drilling Information System; http://sedis.iodp. org/).

Core funding for OBPS is provided jointly by co-sponsors IODE and GOOS (both in turn funded through the International Oceanographic Commission, IOC). Any technological developments and implementation of the OBPS objectives and community recommendations has to be supplemented by external project funding, such as IMOS. The work of OBPS is overseen by a UNESCO-funded project manager and 24 volunteer steering group members.

580 4.6. What can be learned from these initiatives?

The examples from crystallography, chemistry, seismology, geology and oceanography demonstrate that it is indeed possible to unite community efforts and together define, implement and enforce best practices and standards for data reporting at an international level. The geochemical and cosmochemical communities can benefit by implementing many common threads outlined in the above initiatives, including:

- Securing endorsements from recognised, authoritative groups that are connected to
 leading International Science Unions/organisations; in some cases, these groups also
 provide limited funding;
- 2. Establishing expert committees for developing data standards and regularly updating
 these standards as additional requirements emerge;
- ⁵⁹¹ 3. Publishing community-agreed, time-stamped standards and vocabularies online in
 ⁵⁹² both human and machine-readable formats in governed, sustainable repositories;
- 4. Connecting with funding agencies to adopt commonly defined standards and enforce
 research data management plans and data submissions;

595 5. Connecting with publishers and editors to enforce compliance with data standards 596 within publications;

⁵⁹⁷ 6. Developing and implementing tools that validate data standards compliance;

- 598 7. Enforcing data submission to domain repositories that work with publishers to im 599 plement standards and ensure long-term preservation and increased discoverability
 600 of data;
- ⁶⁰¹ 8. Adoption of standard data and file formats by instrument manufacturers;
- 9. Developing education and outreach programs to teach data management and dissem inate existing standards and best practices for data users and contributors.

⁶⁰⁴ 5. The Path Forward: OneGeochemistry

During the workshop at Goldschmidt 2022, organisers and participants discussed possible solutions to the aforementioned challenges and towards the goal of a standardised network of geochemical data resources. The options promising the highest short-term impact are: official endorsement of the OneGeochemistry initiative; establishment of expert committees to collect and define best practices for each data type; and a broad education and outreach programme that highlights the benefits of community engagement in this issue. Each of these strategies is discussed in detail below.

612 5.1. Endorsement

Standards and data management should be developed bottom-up but need to be enforced top-down. As a consequence, OneGeochemistry is pursuing endorsement from (i) societies, (ii) publishers, (iii) funders and (iv) instrument manufacturers to gain authority for the initiative and thus increase community participation.

617 5.1.1. Societies and Unions

The heterogeneity of geochemical data and the multiple purposes that geochemistry can be used for, has resulted in geochemistry being a part of at least four International Science Council (ISC) Science Unions and tens, if not hundreds, of geochemical associations, societies, and commissions at both international and national level. The four main unions
that are relevant to geochemical and cosmochemical data include the International Union
of Geological Sciences (IUGS), International Union of Geodesy and Geophysics (IUGG),
International Union of Crystallography (IUCr) and the International Union of Pure and
Applied Chemistry (IUPAC).

As of December 2022, the OneGeochemistry initiative is acting as the OneGeochem-626 istry CODATA Working Group under the International Science Council to bring together 627 all the disparate initiatives that are happening in geochemistry across Scientific Unions, 628 Associations, Societies and Commissions (https://codata.org/initiatives/decadal-620 programme2/worldfair/onegeochemistry-wg/). Over the next two years, this Working 630 Group will be utilised to recruit a larger membership base to the initiative that will then 631 be able to vote on a long-term governance structure for OneGeochemistry. The OneGeo-632 chemistry interim board has so far secured endorsement from the following six international 633 geochemical societies and associations: the Geochemical Society, the European Association 634 of Geochemistry, the Association of Applied Geochemists, the International Association of 635 Geochemistry, the Meteoritical Society and the IUGS commission on Global Geochemical 636 Baselines. A final decision is pending from the International Association of Geoanalysts 637 and the International Association of Geochemists. These developments lend authority to 638 OneGeochemistry as the trusted international initiative tasked with bringing together the 639 community and coordinate global efforts in geochemical data standardisation. Society en-640 dorsement will further help disseminate the goals and activities of OneGeochemistry to a 641 broad membership throughout the geochemical sub-disciplines, and increase participation 642 in the initiative. Additional national and/or sub-disciplinary societies will be contacted in 643 the future and the OneGeochemistry board invites suggestions and recommendations from 644 the community. 645

646 5.1.2. Publishers

OneGeochemistry will continue the discussion with journal publishers and editors to 647 raise awareness for the need for data standards in geochemistry to be enforced. The 648 Commitment Statement developed by the Coalition for Publishing Data in the Earth 649 and Space Sciences (COPDESS; https://copdess.org/enabling-fair-data-project/ 650 commitment-statement-in-the-earth-space-and-environmental-sciences/) has united 651 many of the repositories, publishers, societies, institutions and infrastructure in an agree-652 ment to uphold minimum standards. OneGeochemistry will build upon this commitment 653 and, through town halls and other meetings at international conferences, will work towards 654 establishing domain repositories as trusted data publishers that collaborate with journals 655 and publishers to ensure that data submitted to a journal comply with agreed community 656 standards and the FAIR principles. 657

658 5.1.3. Funders

As a community we need to communicate with the national and regional funding agen-659 cies to alert them to our requirements for data management. Many funders have FAIR data 660 policies but most do not yet enforce them or check compliance. In addition, funders play an 661 important role in guiding the academic credit system. For example, the German Research 662 Foundation (DFG) recently changed their rules to recognise article preprints, data sets 663 or software packages as research outcomes, which is an important and positive signal to 664 the scientific community (https://www.dfg.de/en/research_funding/announcements_ 665 proposals/2022/info_wissenschaft_22_61/index.html). 666

667 5.1.4. Instrument Manufacturers

At Goldschmidt 2022, members of the OneGeochemistry interim board connected with some of the geochemical instrument manufacturers, who were very supportive of the initiative and committed to implementing community-agreed data, metadata and formatting standards once they were developed and accepted. As shown by the example from the seismological community, support and adoption by instrument manufacturers of communityagreed data standards, aided by common file formats, is crucial to their widespread implementation within laboratories. The increasing adoption of electronic laboratory notebooks, for example, could be exploited to implement data standards and provide a direct data pipeline into certified domain repositories.

677 5.2. Expert Committees

Multiple best practices and recommendations for specific data types, analytical tech-678 niques or sub-disciplines have already been defined and are variably adhered to across 679 the globe. A growing number of publications aim to establish agreement on minimum 680 variables and vocabularies for various geochemical data types Deines et al. (2003); Deme-681 triades et al. (2020, 2022); Boone et al. (2022); Flowers et al. (2022); Brantley et al. (2021); 682 Abbott et al. (2022); Horstwood et al. (2016); Dutton et al. (2017); Walker et al. (2008); 683 Courtney Mustaphi et al. (2019); Schaen et al. (2020); Khider et al. (2019); Damerow et al. 684 (2021). Effective development of scientific standards requires a participatory framework 685 with a need for ongoing, open dialogue within and across research communities (Yarmey 686 and Baker, 2013). The larger the size of the community that agrees and commits to a 687 particular standard, the larger the community that can share and reuse data, particularly 688 in machine-to-machine environments. Hence, to enable global data exchange, we need to 689 harmonise and curate these existing standards through a number of expert committees 690 that are endorsed and/or recognised by authoritative, international geochemical societies 691 and unions. The task of these expert committees would be to compile and further develop 692 standards for each distinct analytical technique or related groups of analytical methods. A 693 committee would be made up of experts within a specific method that are representative 694 of the diversity of users for each data type, including geographical regions, institutions and 695 career levels. 696

⁶⁹⁷ OneGeochemistry's role will be to facilitate and support these expert committees, as ⁶⁹⁸ well as to disseminate best practice recommendations and invite feedback from the wider

community. In addition, OneGeochemistry will set up a technical committee that converts 699 existing standards into machine-readable format. Overall, the focus of the OneGeochem-700 istry initiative is to coordinate global efforts in geochemical data standardisation, facilitate 701 communication amongst distributed groups and thus minimise duplication and redundancy. 702 In a first step, OneGeochemistry will work with the wider community to compile exist-703 ing standards, determine which additional data types require standards/vocabularies and 704 which analytical methods are currently in use or have been used in the past for each data 705 type. The role of the expert committees would then be to: 706

 Compile lists of existing standards or best practices (including data models and vocabularies) and ensure they are in the public domain, accessible online in a repository or vocabulary service, such as OBPS and RVA, respectively;

Review neighbouring fields and disciplines that have already defined data standards
to ensure interoperability (e.g. IUPAC terminologies, government agencies or industry standards);

⁷¹³ 3. Provide governance to existing standards and harmonise where possible;

4. Monitor and update each agreed upon standard as needed;

5. Develop new data standards where required.

The technical committee led by OneGeochemistry would then work with the expert committees to digitise these standards and make them FAIR. A timeframe of two years per thematic expert committee is envisaged, culminating in a formal publication of the recommended standard and its presentation to the community at one of the annual workshops facilitated by OneGeochemistry.

All community-agreed standards are to be published through the 'Brown Book', part of the IUPAC Colour Books Series described in Section 4 above which has been offered to One-Geochemistry. With this Brown Book the geochemistry community will be able to publish any nomenclature, terminology or standards that are not already covered in the geochemistry literature. This resource will be invaluable not only in documenting nomenclatures ⁷²⁶ defined by the geochemical expert committees, but also in ensuring that relevant, existing
⁷²⁷ digital chemical standards are leveraged wherever possible (e.g., the Machine-Accessible
⁷²⁸ Periodic Table).

A successful example of an existing expert committee in geochemistry is the Tephra 729 Community that has developed data submission templates for the EarthChem Library 730 (Wallace et al., 2022). EarthChem has further recently started a working group to develop 731 a method directory. Whilst we acknowledge the risk that this modular approach might 732 further divide the community, we propose that it is the most viable solution to: 1) In-733 volve the community in the process of developing data standards; 2) Provide well-defined, 734 feasible work packages with clear credit/reward/outcome that will motivate community-735 participation; and 3) Give authority to the standards developed to ensure they are ac-736 cepted by the wider community. To contribute to or join the OneGeochemistry initia-737 tive please visit www.onegeochemistry.org for more information and contact onegeochem-738 istry@codata.org. 739

740 5.3. Incentives, Education & Outreach

We recognise that a critical component for the success of OneGeochemistry is increasing 741 outreach and dissemination while establishing appropriate incentives that invite more com-742 munity members to join. An unexpected outcome of the Goldschmidt 2022 workshop was 743 the observation how poorly known the existing data systems are, especially among early 744 career researchers. Through the OneGeochemistry initiative we hope to achieve greater 745 community engagement via (i) passive advertising of data efforts within research presenta-746 tions and publications; (ii) virtual campaigns and the open sharing of resources; and (iii) 747 active training through workshops and data mentoring programmes. Whilst this active 748 training can be primarily facilitated by members of the OneGeochemistry board, passive 749 advertising and sharing of resources rely on community participation. For example, passive 750 advertising may include the proper attribution of data systems in publications, following 751 citation guidelines and templates provided by the systems, or the addition of data sys-752

tem logos to presentation materials (e.g. conference slides, posters, graphical abstracts). 753 Virtual campaigns include a broad social media presence (e.g. on Twitter, LinkedIn), 754 blog posts, webinars and a dedicated YouTube channel to disseminate tutorials and teach 755 data management skills. All of these activities would greatly benefit from the participa-756 tion of a broad group of active community members and 'OneGeochemistry ambassadors' 757 could drive these initiatives. Ambassadors are envisaged as early to mid-career, cutting-758 edge researchers that promote good data management following current best practices and 759 standards. Assisted by the OneGeochemistry board members, ambassadors will spread 760 awareness in the communities of the importance of data management in geo- and cosmo-761 chemistry, the existing landscape of data systems, and inspire new and future generations 762 to contribute. In parallel, OneGeochemistry and its participating data systems would con-763 tinue to host workshops at scientific conferences, organise data hackathons, contribute to 764 the Data Help Desks coordinated by ESIP at major Earth Science conferences such as the 765 AGU Fall Meeting, the EGU General Assembly and the Geological Society of America 766 meeting (https://www.esipfed.org/data-help-desk) and hold Data FAIR workshops 767 (https://data.agu.org/datafair/). In addition, data management could be integrated 768 into mentoring schemes at these conferences and inter-institution and international data 769 mentoring programs could focus on available resources in the communities. 770

While communicating and advertising OneGeochemistry, we must always be aware of 771 motivations and incentives (or disincentives) to contribute to standard development, data 772 publication and global databases for each stakeholder. Options to increase community 773 uptake of data sharing practices have been discussed at length in other communities and 774 center around a balance between the perceived cost *versus* benefit of data sharing (e.g. 775 Kim and Stanton, 2012; Kidwell et al., 2016). Yet, the precise incentives will differ widely 776 between different groups in the community (Fig. 4). For OneGeochemistry, the focus is 777 on engaging: 778

• Publishers and editors who ensure peer review, storage and release of datasets in

780

certified domain repositories prior to publication.

• Funding agencies who require compliance with certified standards, and provide necessary funds for data curation and staff.

Data repositories who are key to storing, curating and making geoanalytical data
 FAIR.

- Government surveys/agencies who have a long history of generating and archiv ing publicly funded research data as well as industry data.
- Professional societies/science unions/associations who can both endorse and
 help to promote the standards/best practices.
- Instrument manufacturers who can ensure any data generated with their instruments and output by their software are compliant with standards.
- Laboratory managers and other geoanalytical data producers to ensure consistency and quality of geochemical data at the point of generation.

• **Researchers** who generate, (re)use and publish geochemical data.

For *researchers*, the main incentive for engaging in good data management practices is 794 credit received towards their scientific track record. As more funding, recruitment and pro-795 motion bodies start considering more than journal publications as a measurable research 796 output, data publications in domain repositories will gain importance. OneGeochemistry 797 and/or its member data systems will further strive to support researchers through ac-798 knowledging the number and quality of individual contributions on their websites or, as 799 is common practice with software, through regular version releases. Tracking of citations 800 to data publications independently of a related research paper will provide an additional 801 measure of impact of specific research outputs. Tracking data citations is also a conve-802 nient way for *funders*, *institutions* and *laboratories* to measure their impact. Both 'data 803



Figure 4: The place of OneGeochemistry within the broader research data landscape (adapted from OECD, 2017). Each group of stakeholders has different needs and motives for contributing to or enforcing FAIR data practices. Blue circles symbolise the role of OneGeochemistry in coordinating expert committees and facilitating education and ambassadorship.

reliquaries' and the new 'smart citation' frameworks, such as scite_, are promising developments that will aid this cause. For *instrument manufacturers*, clear guidance for data and file formats through community-agreed standards would significantly reduce the resources spent on developing custom data formats for each analytical instrument. At the same time, proprietary file formats need not be forfeited as long as final data outputs follow the community-agreed standards.

Industry, such as mining or environmental companies, have been omitted from the

list since this initiative is born out of the academic (and governmental research) domain.
However, we acknowledge that these companies produce large data volumes and we would
welcome future contact and participation with industry representatives. Some countries,
such as Australia, already require that all industry data be made available to local geological surveys after a certain time period— providing an incentive for companies to comply
with common data standards to facilitate data sharing, whilst still ensuring a competitive
advantage through time-limited, confidential agreements.

818 6. Conclusions

There is an urgent need in the geochemistry and cosmochemistry communities to define 819 data-type specific best practices and standards for reporting geoanalytical data. Only 820 once these best practices exist, are implemented in research workflows and are consistently 821 followed will geoanalytical data become easy to find, trust and reuse for education or further 822 data-driven research that is increasingly employed to tackle the next big, data intensive 823 and complex scientific questions. We propose that the international OneGeochemistry 824 initiative enacts this change, driven and supported by the community, through facilitating 825 a global, online network of machine-readable data that is persistent, interoperable and 826 reusable, and above all minimises duplication. Once the community has adopted and 827 fully integrated a culture of standardised data and metadata reporting practices, such a 828 framework will also ensure reliable attribution of those who collected, analysed, curated 829 and made accessible any geochemical and cosmochemical data. Endorsement by societies, 830 publishers and funders will give the OneGeochemistry initiative authority to establish 831 expert committees that develop and promote best practices and standards for specific 832 data types. Community engagement and participation at all stages of the process will be 833 pursued through active outreach and dissemination. 834

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⁸⁶⁷ Appendix A. Supplementary Material

The Supplementary Material contains additional information on the Goldschmidt 2022 workshop "Earth Science meets Data Science: what are our needs for geochemical data, services and analytical capabilities in the 21st century?", including the workshop programme, details on the participating data systems and the complete list of contributors.

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1061

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