

Towards categorizing ethical questions in data literacy


Results of a focus groups study at the NFDI4Ing conference 2022

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Abstract. Data Literacy is crucial for a sustainable engineering education [1]. In aiming to find solutions to solve future challenges, mechanical engineering has started to integrate data literacy into the higher education curriculum [2]. However, in current frameworks ethics are seen as a side topic or are equated to data privacy issues [3]. Since literacy aims to empower people to make informed decisions based on their or other data [4], the development of critical reflection and discussion on ethics is central for data literacy. Those frameworks who do address ethics often remain general in their examples. In our contribution, we aim to add ethical questions that data scientist face in their work with data. Therefore, we will first summarize current existing data literacy frameworks and their ethics concept. Then, through a focus group study among data literacy experts' we collect ethical and categorized questions. The study was conducted with 15 experts at the NFDI4Ing Conference 2022. This approach expands examples in ethics for data literacy beyond data privacy towards applied, current and pressing ethical questions.

1 Introduction

2 Describing a 'set of abilities around the use of data as part of everyday thinking and reasoning for
3 solving real-world problems' [5], data literacy is key for an increasingly digital and data driven
4 society [6]. Along with the ability to solve real-world problems with the use of data, the critical
5 reflection with data is becoming increasingly important [7]. Moreover, there are many risks of
6 incorrect assumptions based on data that might lead to incorrect knowledge and decisions. This
7 then might further fuels biases in societies. There is a responsibility for those communicating
8 through data to inadvertently reduce biases [5].

9 Ethics is a moral philosophy that aims to systematize, defend, and recommend concepts of right
10 and wrong behavior and action [8] [9]. This often results in extensive discussions of complex,
11 interdisciplinary and ambiguous questions – especially in an increasing dynamic and complex
12 global society. To become agent in their decision making, ethical guidelines based on democratic
13 values had been introduced in different literacies such as media literacy [10] and AI literacy [11].
14 As the relevance of data increased along with the difficulty for human beings to comprehend the
15 influence on our knowledge and decision-making, ethics need to be further considered in the

16 data literacy frameworks.

17 Ethical considerations should not be understood as a side subject to be taught with many others,
18 Ethical questions in data literacy are a core element and basis for all subsequent decision making.
19 Especially competencies that consider critical thinking and enabling agency are barely mentioned
20 in current data literacy frameworks. As the relevance of data increased along with the difficulty
21 for human beings to comprehend and process, the influence to our knowledge culture should be
22 further considered in the frameworks.

23 While there are already concepts on teaching ethics in data literacy [12]. However, when training
24 ethics in data literacy those examples are less from actual daily work but from social media
25 interaction [13]. To prepare future workforce for ethical decision making through data, the
26 examples given should be realistic and actual examples that professionals working with data
27 experience.

28 Indeed, many literacy discussions consider ethical discussions as important for supporting
29 empowered citizens [2] [10] [13]. Still, when applying ethics in the curricular topics of data
30 literacy, they are often pushed to the side in favor of more applicable topics such as data
31 visualization, data analytic or data tasting. The objective of this contribution is to invite data
32 scientist and mechanical engineers to reflect on ethical question in their work with data and
33 collect those questions into actual ethical question that arise in daily business. The research
34 question is therefore:

- 35 • What ethical questions are present with data experts and should therefore be addressed
36 and considered as examples, when applying data literacy frameworks?

37 The first part of this contribution will highlight ethics concepts in existing data literacy frame-
38 works. The following part will introduce a focus group study as a explorative method to collect
39 ethical issues in the interaction with data. The focus group study took place among data literacy
40 experts at the NFDI4Ing conference in November 2022. The different ethical questions are
41 summarized to identify key ethical categories that should to be included in ethics discussions
42 on data literacy. Finally, the conclusion will open further potential research questions in data
43 literacy and give examples for addressing ethical questions in daily practice with data.

44 **2 The role of ethics in data literacy frameworks**

45 Contrary to its importance in decision making, ethics remain a minor course within data literacy.
46 They rarely play the central role that is required. Most of the current frameworks that do consider
47 data ethics as important then lack concrete applicable topics in their curricula. They rarely
48 are concrete and give hints to educators on how exactly they can apply ethics in data literacy
49 programs.

50 For example, Heidrich et. al. introduce ethics as a side competency in their framework [14].
51 In the study from Wolff et al, they identify through card sorting that professionals see ethical
52 competence as highly relevant within data literacy, but do not give further examples on what
53 asked professionals understand by this [5]. In Grillenberges and Romeikes approach to create a
54 data literacy Competency Model based of Risdale et al, they introduce their competencies along
55 the data management cycle and divide them into process and content-oriented competencies
56 [15]. They introduce a layer called ethics, but do not connect it visibly with the introduced

57 competencies or exemplify it. Schüller et al introduce a comprehensive data literacy framework
58 considering both comprehensive and selective competencies along a data value chain [2]. In
59 their model ethics is pushed to the side of the framework and is seen as a separate ethics literacy.
60 A general guideline with data processing can be understood in the FAIR principles that ...
61 (Source). The FAIR principles are findability, accessibility, interoperability, and reusability
62 (FAIR) [16]. **They were introduced by and function as However**
63 Closest to concrete examples in ethics is the research team around Giese. They introduce ethics
64 as part of the transparency and awareness pillar [13]. This pillar is one of three other pillars and
65 additionally includes a law and technical component. The ethical pillar in the concept of Giese
66 et al was introduced through real-world examples and thinking and pairing exercises [13].
67 In their example, they introduce a case from twitter, which indicates the importance of (social)
68 media understanding, when it comes to ethics in data literacy. The example of Giese's application
69 of ethics reveals that ethics within data literacy is often connected to other literacy types. This
70 might be the reason why Schüller et. al. frameworks introduce ethics as an additional literacy in
71 their concept.
72 Ethical considerations in data literacy should be seen as a core element for all subsequent decision
73 making. They should not merely be applied at some point in the process, but always remain in the
74 core of a data literacy concept. Regardless of the data processing step aside from the *how* there
75 should always also be the question of the *why*. As ethical questions require the consideration of
76 a wide range of stakeholders and other fields, therefore ethical questions are usually overlapping
77 with other literacy concepts.

78 **3 Method focus group study**

79 To answer the research question concerning the content of the ethic topics, a focus group study
80 with data literacy experts and professionals was conducted. Focus group studies are a qualitative
81 discourse method in which a group is stimulated to discuss a specific topic [17]. While the
82 researchers provide a specific focus, such as ethics in data processing, the data is collected
83 through the observation of a groups response through this topics. According to Kitzinger, this
84 method is used to generate and explore questions among a group and encourage the development
85 of their own analysis of common experiences [18]. While this method might not give a deep
86 insight into individual perspectives and experiences [17], it is well suited to identify norms and
87 values based on a common experience within a group [18].
88 Therefore, this method has been selected to gain a further understanding of ethical issues among
89 a group of data experts (see figure 1). Due to being a complex topic, ethical dilemma are a
90 helpful to identify shared experiences in the decision making process of data. Through the
91 discussion in groups, the individuals might find solutions or at least see that there are patterns to
92 their experienced dilemma. This is helpful for developing a collection of applied ethic topics
93 that go beyond the usual questions of data privacy.
94 The focus group study was conducted at the NFDI4Ing conference in October 2022 to a group of
95 15 participants with various background in mechanical engineering, information science and
96 software engineering. After defining ethics and their relation to data literacy, the starburst method
97 was introduced to collect ethical questions from the experts in smaller rotating groups.
98 The star bursting method is a method in design thinking to collect questions in order to understand

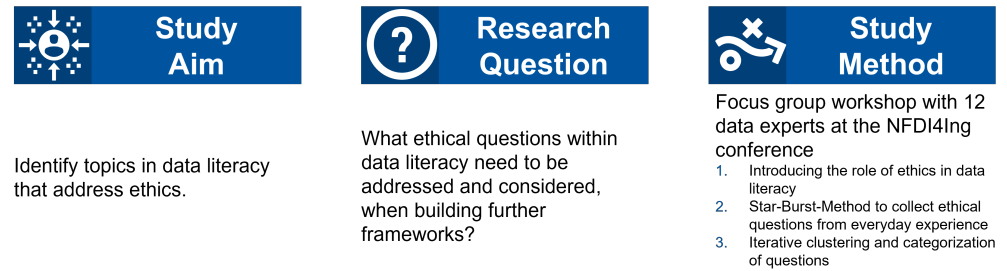


Figure 1: Overview on focus group study design

99 a problem from different perspectives [19]. In this method a star with six spikes represents six
 100 question words (how, who, why, what, when and where). The task for the participants is to
 101 reflect and fill the question words with ethical questions they have faced in their professional
 102 work with data.

103 The group was divided into two groups and asked to collect and discuss ethical question based
 104 on the six question words. The idea behind the ethical questions was not focused on finding
 105 solutions at this point, as it is the nature of such questions to not be easily answerable from the
 106 point of one domain. Rather, this collection was useful in understanding the spectrum of ethical
 107 questions and the contexts that need to be considered when working with data. These questions
 108 were subsequently anonymized and categorized and are presented in the following part.

109 The categorization of the questions was conducted with an iterative open coding method following
 110 the grounded theory method. The grounded theory is a research method and approach towards data
 111 for generating theories of medium range [20]. While the application of grounded theory would
 112 have exceeded the analysis of the focus groups study, the iterative proceeding of summarizing,
 113 coding and categorizing to identify a core image was implemented [20].

114 3.1 Results of the focus group study - categorizing data ethics

115 Through this study around 20 ethical questions in data focused research were collected among the
 116 experts. While the explicit answering of these questions was not the aim of the study, the different
 117 considerations help to gain an understanding of ethical aspects that need to be considered when
 118 addressing ethical questions in data literacy.

119 The ethical questions were summarized in the following six categories (See figure 2): the appli-
 120 cation of the FAIR Principles (4), Stakeholders (4), Role of Authorities (3), Data Representation
 121 (3), Ethical Dilemmas and Examples (3), and a category consisting of questions that did not fit
 122 the other categories (2).

123 The clustering of the categories in human oriented and process oriented describes whether the
 124 questions address data interaction processes or reflect context in which data is processes. Process
 125 oriented are ethical question that address the interactions with data along a data management
 126 process of gathering, analyzing, visualization and documentation. Human centered questions are
 127 addressing different stakeholders interacting with or through the results and decision-making
 128 through data.

129 The FAIR principles are findability, accessibility, interoperability, and reusability (FAIR) [16].
 130 An example question based on these principles was 'When should data transparency be given
 131 and when is it too much?'. As transparency is an underlying theme and the central aim of the

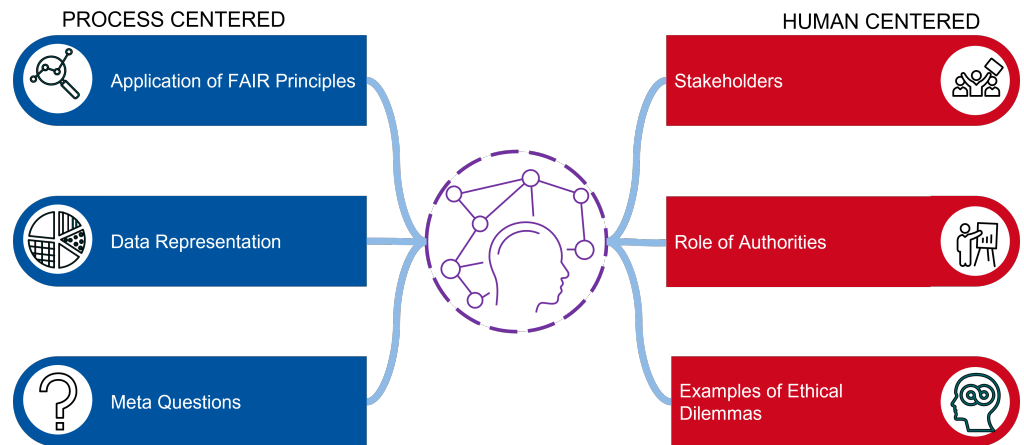


Figure 2: Overview on categorized results of focus groups study

132 FAIR principles, this question addresses an important decision that people working with data are
 133 considered daily.

134 The Stakeholder category reflects different groups that are affected by data-based applications.
 135 The question pair reflecting this is *'Who might struggle with such ethical standards?'* and *'Who*
 136 *would mainly benefit from such ethical standards?'*. This category has an overlap with both the
 137 role of authorities and data representation categories.

138 The role of authorities has evolved around the power that states and companies hold. An example
 139 question here was, *'Where can I turn to with an ethical dilemma in data?'* in combination with
 140 *'Who could have the responsibility for deploying ethical standards in different application areas*
 141 *(e.g. research, practice)?'*. This is more of a meta-category describing the organization of ethics
 142 rather than their application, which is reflected more in the Stakeholder category. It might be a
 143 subcategory of the Stakeholder category but is presented here as a separate category due to the
 144 amount of questions that arise in the discussion.

145 Data Representation overlaps with Stakeholders and includes questions like *'What can we do*
 146 *against misinterpretation of data?'* and *'How can we show that data representation reflects the*
 147 *truth?'*. This category is strongly connected to practical guidelines in design and visualization.
 148 As the visualization of data is closely connected to visual and media literacy, those ideas might
 149 be found in overlapping areas of the other literacies.

150 The Ethical Dilemmas and Examples category collected questions from concrete, applied exam-
 151 ples in daily life. An example question for the category is *'How can we detect bias in data?'*.
 152 The further collection of examples would be helpful for a concrete design of an educational
 153 curriculum, as this category tends to become more specific than the others. There were further
 154 ethical questions that were sorted into the remaining collected category, such as *'When should*
 155 *data literacy and ethical maturity be taught?'*, which is more oriented towards education, and
 156 *'How could Ethics impede data content generation?'* as further practical ethics questions. As
 157 this is a first attempt to address the variety of ethical questions in data management, further focus
 158 studies might develop further categories based on those questions.

159 Finally, in a reflection and feedback round of the study, the exchange gave new insights for
 160 the group as well as for the data. The biggest downside addressed by the group was that this

161 exchange was too short and could have been extended further. Still, the collected categories
162 extend current ethics in data literacy with a collection of topics that professionals recently face.
163 For the design of educational frameworks this suggests that ethics in data literacy is both human
164 centered and process oriented. Ethics is present through the full data management cycle. Along
165 with the known FAIR Principles the perspective of different stakeholders and identification of
166 authorities in ethical dilemmas are relevant to teach about data ethics. Also the question about
167 the limitations of representing and suggesting truths in your own data set are suitable reflecting
168 questions. Further applications of those results need to be tested further.

169 **4 Conclusion and outlook**

170 This paper aims to broaden the understanding of data literacy by including discussions and
171 critiques from media literacy into the development of a data literacy framework. This approach,
172 with a literature review on how ethics is applied in combination with a focus group study among
173 data literacy experts, can be seen as a first step towards developing ethical foundations in literacy
174 frameworks that go beyond data privacy discussions.

175 In order to address the research questions:

- 176 • What ethical questions are present with data experts and should therefore be addressed
177 and considered as examples, when applying data literacy frameworks?

178 First a literature study compared how different data literacy concepts applied ethics in their
179 frameworks. As a result, it became clear that ethics is often seen as important but is rarely
180 prominently applied. Additionally, it was concluded that applied reflection of ethical questions
181 needs to include multiple perspectives. Still, the shift of ethics into the center is required, as
182 ethical considerations are not limited to one scientific field.

183 To fill ethics in data literacy, a focus group study was conducted among data literacy experts
184 at the NFDI4Ing conference in October 2022. Through an online workshop around 20 ethical
185 questions were collected, categorized, and introduced (see figure 1). The main categories are the
186 Application of FAIR Principles, Stakeholders, Role of Authorities, Data Representation, Ethical
187 Dilemmas and Examples (see figure 2). These questions give further insights into themes that
188 ethical programs in Data literacy apply and which are worth further examination.

189 As a next step, the scientific exchange between different literacy frameworks is highly recom-
190 mended. Some of the collected ethical questions overlap other scientific fields such as media or
191 sustainability literacy. Through further interdisciplinary exchange, data literacy will empower
192 professionals, students and educators to make informed data-based decisions.

193 5 Attachment - Table

Category	Definition	Questions
Application of FAIR Principles	Questions that are related to the FAIR Principles in either pointing towards an answer or giving guidelines for those questions. The FAIR Principles are findability, accessibility, interoperability, and reusability (FAIR).	How can I discern how long my research data must remain in the area of confidentiality until we have safeguarded the internal scientific process of gaining knowledge? Where should data be stored? Is only EU really applicable? When should data transparency be given and when is it too much? Who would have the responsibility for the implementation of FAIR principles?
Data Representation	Data Representation describe questions that evolve around rules for visualizing and representing data without misleading implications.	Why should ethical aspects influence data visibility? What can we do against misinterpretation of data? How can we visualize the truth (data visualization)?
Meta Questions	This category collects questions that are discussing the (teaching) methods behind ethics in data literacy.	How could ethics impede data content generation? How can we distinguish between ethical methods and ethical data content? When should data literacy and ethical maturity be taught? - is this a topic that needs to be started in primary school and WHEN should the levels be deepened?
Examples of Ethical Dilemma	The Ethical Dilemmas and Examples category collected questions from concrete, applied examples in daily life.	How can we detect bias in data? How have ethical considerations evolved over time and how do we address research subjects that are no longer up to date from an ethical point of view? What are good examples for ethical questions in data literacy? Where can I turn to with an ethical dilemma?

194

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197 conference 2022. The authors thank the participants of the workshop for their active and engaged
198 contribution to the ethical questions, insights in the ethical dilemmas they have faced in their
199 professional life and the open exchange on eye-level.

200 7 Roles and contributions

201 **Samira Khodaei:** Conceptualization, Execution, Writing, Original Draft

202 **Anas Abdelrazeq:** Review & Editing

203 **Ingrid Isenhardt:** Review & Editing

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