

Guiding the Selection of Research Methodology in Industry–Academia Collaboration in Software Engineering

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Abstract

Background: The literature concerning research methodologies and methods has increased in software engineering in the last decade. However, there is limited guidance on selecting an appropriate research methodology for a given research study or project.

Objective: Based on a selection of research methodologies suitable for software engineering research in collaboration between industry and academia, we present, discuss and compare the methodologies aiming to provide guidance on which research methodology to choose in a given situation to ensure successful industry–academia collaboration in research.

Method: Three research methodologies were chosen for two main reasons. Design Science and Action Research were selected for their usage in software engineering. We also chose a model emanating from software engineering, i.e., the Technology Transfer Model. An overview of each methodology is provided. It is followed by a discussion and an illustration concerning their use in industry–academia collaborative research. The three methodologies are then compared using a set of criteria as a basis for our guidance.

Results: The discussion and comparison of the three research methodologies revealed general similarities and distinct differences. All three research methodologies are easily mapped to the general research process describe–solve–practice, while the main driver behind the formulation of the research

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methodologies is different. Thus, we guide in selecting a research methodology given the primary research objective for a given research study or project in collaboration between industry and academia.

Conclusions: We observe that the three research methodologies have different main objectives and differ in some characteristics, although still having a lot in common. We conclude that it is vital to make an informed decision concerning which research methodology to use. The presentation and comparison aim to guide selecting an appropriate research methodology when conducting research in collaboration between industry and academia.

Keywords:

Research methodology, Selecting research methodology, Design Science, Action Research, Technology Transfer Model, Industry–Academia Collaboration

1. Introduction

The awareness of the need to use appropriate research methodologies and methods has increased in software engineering during the last decades. As a socio-technical engineering discipline, it is no surprise that software engineering, particularly in industry-academia collaborative research with empirical evaluations of research solutions, needs to adopt, adapt and be influenced by research methodologies from other disciplines. The influence comes particularly from information systems, engineering disciplines and social, behavioral and management sciences.

Research methodology refers to the research approach, particularly the various types of activities to systematically address the research challenge, which is based on assumptions and justification of the choices made. *Research methodologies* are framed within a *research paradigm*, which is an overarching concept relating to “the set of common beliefs and agreements shared between scientists about how problems should be understood and addressed”, according to Kuhn [1]. A vital aspect of a research paradigm is the research methodology, i.e., our approach to acquiring new knowledge. It should be contrasted with *research methods*, which are the means to collect and analyze data, i.e., how the research activities are concretely conducted. Thus, different research methods may be used within a research methodology.

The borderlines between these three concepts are not always clear cut, and

22 it may differ between disciplines and between researchers depending on their
23 view of the world. Our *scope* is on research methodologies suitable for soft-
24 ware engineering research in collaboration between industry and academia,
25 particularly when conducting empirical evaluations of solutions developed to
26 address an industrial challenge.

27 Given our scope, we are targeting methodologies where the intention is
28 to study and improve software engineering practice. We have chosen to fo-
29 cus on three candidate research methodologies, which fulfill the needs of this
30 type of software engineering research. Two of them are brought to software
31 engineering via information systems, i.e., Design Science [2, 3] and Action
32 Research [4, 5], and the third is developed in the software engineering com-
33 munity, the Technology Transfer Model [6, 7]. A fourth one is presented in
34 Appendix A, i.e., the Design Research Methodology, which emanates from
35 mechanical engineering, to complement the other three research methodolo-
36 gies.

37 The methodologies include different activities, but they are all possible to
38 map to a general engineering research cycle, which we have chosen to sum-
39 marize in the following three activities: *describe–solve–practice*. The wording
40 is inspired by a discussion by Shaw [8] and further elaborated in Section 2.
41 The three research methodologies are summarized based on their respective
42 background, in particular, based on their use in software engineering.

43 The article provides novel contributions by presenting, discussing, com-
44 paring, and providing guidance concerning selecting a *suitable* research method-
45 ology when industry and academia collaborate to derive research solutions
46 that can both be used in industry practice, and being research of high-quality.
47 Thus, the overarching goal is to support successful research in industry-
48 academia collaboration. It should be emphasized that our scope is con-
49 cerned with research–when–transfer, and not research–then–transfer. The
50 presentations provide overviews of each research methodology. Furthermore,
51 the research methodologies are discussed from the perspective of conducting
52 solution-oriented software engineering research in collaboration between in-
53 dustry and academia. Details concerning the research methodologies are pro-
54 vided, and they are put into a software engineering context, and references
55 to their use in software engineering are provided. Moreover, one example
56 from the literature is summarized to provide more information on how each
57 research methodology may be applied. The three research methodologies are
58 then compared with respect to their main characteristics. Finally, guidance
59 is provided concerning which research methodology to select in a given re-

60 search situation when conducting research in collaboration between industry
61 and academia. The selection of a research methodology should be firmly
62 based on the research to be undertaken and not based on current knowledge
63 or research tradition.

64 The remainder of the paper is structured as follows. In Section 2, related
65 work is presented. Our motivation for the research and selection of research
66 methodologies and our research approach is presented in Section 3. In the fol-
67 lowing three sections, we provide an overview and discuss the three selected
68 research methodologies in the context of conducting software engineering re-
69 search in collaboration between industry and academia. They are presented
70 as follows: Design Science in Section 4, Action Research in Section 5 and the
71 Technology Transfer Model in Section 6. A comparison of the three research
72 methodologies is provided in Section 7. The conclusions and further work
73 are presented in Section 8.

74

75 2. Related work

76 Shaw denotes software as an engineering discipline, noting that “software
77 engineering shares with classical engineering the need for design techniques
78 to reconcile conflicting constraints and achieve cost-effective results, as well
79 as reliance not only on established scientific knowledge but also on systemati-
80 cally codified observations drawn from experience.” [9] In her seminal article
81 “Prospects for an Engineering Discipline of Software” [8], she proposed a
82 cyclic learning process of *new problems*, solved by *ad hoc solutions*; these
83 solutions are shared in a *folklore* style; gradually, knowledge is more system-
84 atically *codified*, to become *models and theories*, which may more generally
85 *improve practice* with respect to the original problem.

86 Her cyclic learning process may be interpreted as two interconnected
87 learning cycles, as illustrated in Figure 1. The first learning cycle is pri-
88 marily a learning cycle for engineering in practice: new problems—ad hoc
89 solutions—folklore experience from applying the solution in practice. The
90 second learning cycle is more geared towards software engineering research:
91 describe challenge (codify)—develop a general solution (e.g., models and
92 theories)—evaluate and improve practice. The second learning cycle requires
93 a research methodology with suitable activities to deliver research results use-
94 ful in practice.

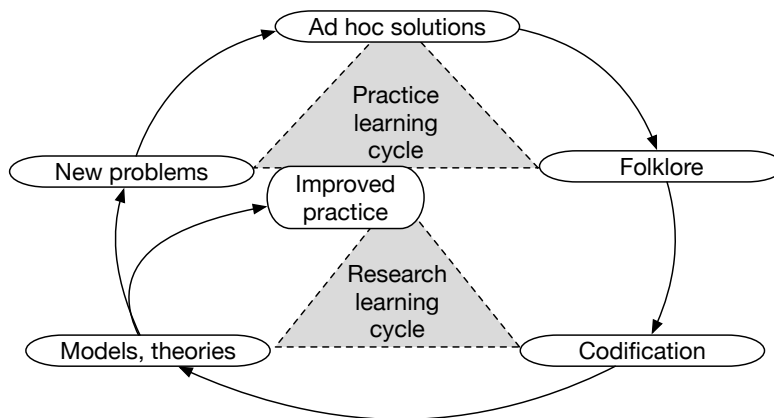


Figure 1: Shaw’s learning cycle [8], augmented with practice and research learning cycles.

95 Building on the terminology of Shaw, software engineering research may
 96 be viewed as a cyclic research process, which begins and ends in relevant
 97 practice and theory. We have chosen to describe the three activities in the
 98 cyclic research process as *describe–solve–practice*, where practice refers to
 99 the evaluation and practical use of the solution. The cyclic research pro-
 100 cess for software engineering is illustrated in Figure 2. Wieringa proposed a
 101 cyclic process with three activities along the lines suggested here when using
 102 *investigate–solve–validate* [10]. In particular, we chose to use the verb “prac-
 103 tice” to highlight the collaboration between industry and academia, with the
 104 objective to put the research solution into use in an industrial context.

105 Similar cycles exist for research in other disciplines. For example, Agnew
 106 and Pyke [11] suggest *observe–think–test* in behavioral and social science. For
 107 research in information systems, Venable [12] suggests adding a fourth activ-
 108 ity in the middle called *theory building*, which is connected to the other three
 109 activities in Figure 2. This activity aims to capture the generalized learning
 110 from the problem–solving activities represented by the three activities.

111 Different aspects concerning industry–academia collaboration in software
 112 engineering are summarized in two systematic literature reviews by Garousi
 113 et al. [13] and Brings et al. [14], while Wohlin et al. [15] presented suc-
 114 cess factors for industry–academia collaboration. Mikkonen et al. [16] high-
 115 lighted the need for close and continuous collaboration between industry and
 116 academia. Furthermore, they stressed the need for technology pull by indus-
 117 try instead of technology push by academia, resulting in industry–academia
 118 co-creation. The collaborative challenge is not new. As early as 1997, Beck-

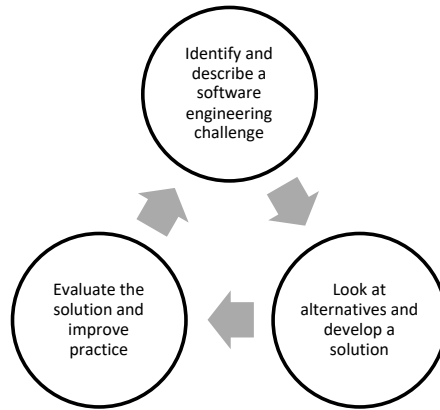


Figure 2: The *describe-solve-practice* research cycle for software engineering research.

119 man et al. [17] stressed the need to close the gap between industry and
 120 academia, and Sandberg et al. [18] discussed what they refer to as agile col-
 121 laborative research. The need for industry-academia collaboration is also
 122 part of the reasoning by Shaw [8], as discussed above, when she highlights
 123 “evaluate and improve practice”. However, we have not identified any article
 124 explicitly addressing the challenge of selecting research methodology when
 125 conducting research in collaboration between industry and academia.

126 Stol and Fitzgerald [19] highlighted the natural setting (field studies) as
 127 one of four types of software engineering research settings. Storey et al. [20]
 128 use the same model when classifying articles. They argue that we need
 129 to “improve the relevance of our research for human stakeholders”. Their
 130 argument builds on an analysis of 151 articles published in the International
 131 Conference on Software Engineering and the Journal of Empirical Software
 132 Engineering. Out of the 151 articles, only ten articles are classified into the
 133 field studies category. Thus, more studies are needed in the natural setting,
 134 which requires improving the collaboration between industry and academia.

135 We now turn to empirical evaluations in software engineering, which have
 136 been around for more than 50 years [21]. In industry-academia collaboration,
 137 empirical methods such as surveys, interviews and case studies are essential.
 138 Chapters on these methods are provided in edited volumes such as Shull
 139 et al. [22] and Felderer and Travassos [21]. Furthermore, books on empiri-
 140 cal methods have been presented, for example, the book on case studies in
 141 software engineering [23].

142 Based on the need to choose research methods for evaluating and assessing

143 software engineering solutions, authors have provided guidance in selecting
144 appropriate research methods. For example, Easterbrook et al. presented
145 guidelines for choosing empirical methods [24], and Wohlin and Aurum [25]
146 provided a decision-making structure for selecting the research design in em-
147 pirical software engineering. Stol and Fitzgerald [19] take it one step fur-
148 ther by applying a framework from social sciences to discuss eight research
149 strategies in software engineering. Their objective is to trade “the level of
150 obtrusiveness of the research, and generalizability of research findings”.

151 In recent years, the interest not only for research methods but also for
152 research methodologies has increased, and books on design science [3] and
153 action research [5] in a software engineering context have been published.
154 However, the support for selecting an appropriate research methodology in
155 a given situation is limited. The objective here is to provide guidance con-
156 cerning selecting among the three research methodologies presented in Sec-
157 tions 4–6 and further compared in Section 7.

158 **3. Approaching the research methodologies**

159 *3.1. Motivation for research and the selection of methodologies*

160 Our analysis of related work shows 1) the lack of guidance for method-
161 ology selection and 2) the need for more industry–academia collaboration
162 to improve the research relevance. Furthermore, the importance of context
163 is also argued by Briand et al. [26] when they put forward the need for
164 context-driven software engineering research. Basili et al. [27] continued the
165 discussion along the same lines by stressing the importance of context. Thus,
166 the collaboration between industry and academia is by many viewed as essen-
167 tial. However, the collaboration between industry and academia in research
168 is by no means easy given the different timelines and objectives with the
169 collaboration as discussed by Runeson et al. [28].

170 One challenge in the collaboration between industry and academia is iden-
171 tifying a collaborative research approach that benefits both parties, and pro-
172 vide credible evidence [29]. This implies that support is needed to select
173 an appropriate research methodology to increase the likelihood of success-
174 ful collaboration. We have chosen three research methodologies, which by
175 no means is an exhaustive selection. However, it is three strong contenders
176 when it comes to selecting an appropriate research methodology when col-
177 laborating between industry and academia.

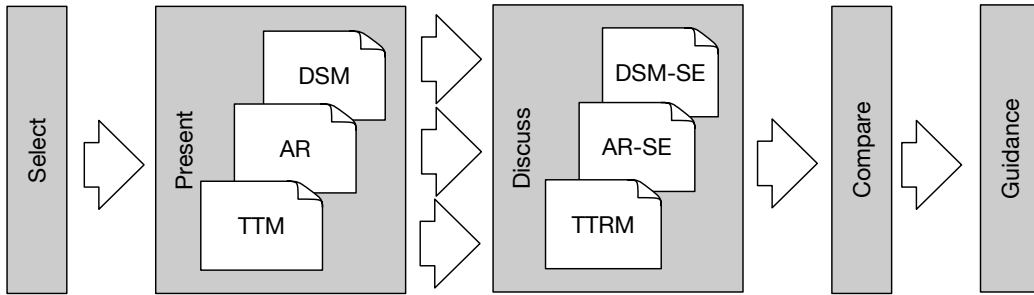


Figure 3: Overview of steps in our research.

178 We have focused on solution-oriented research methodologies, i.e. when
 179 we set out to provide useful research solution to industrial challenges. The
 180 motivation for selecting the three methodologies is as follows. For two of
 181 them, i.e., Design Science Methodology (DSM) and Action Research (AR),
 182 we have seen books, articles and book chapters published in the context of
 183 software engineering. Thus, these two methodologies were natural candidates
 184 to include when discussing research methodologies in software engineering.
 185 As a third research methodology, the Technology Transfer Model (TTM)
 186 was included given that it emanates from a software engineering context,
 187 and it has been used by several researchers in software engineering, as fur-
 188 ther discussed in Section 6.2. Due to the solution-oriented scope, we have
 189 not included research methodologies focusing more on understanding and de-
 190 scribing software engineering practices such as Grounded Theory discussed
 191 by, e.g. Stol et al. [30] and Ethnography presented by, e.g. Sharp et al. [31].

192 3.2. Research approach

193 Our research approach is a theoretical analysis of multiple research method-
 194 ologies through thematic synthesis [32] in the context of our extensive expe-
 195 rience from industrial collaboration and empirical research in software engi-
 196 neering. The overall objective is to present, discuss and compare research
 197 methodologies to provide guidance concerning the selection between them
 198 for software engineering research when conducted as a collaboration between
 199 industry and academia. The research work is iterated in several cycles. For
 200 each cycle, tasks were divided among the authors and next reviewed by the
 201 other author. The major steps in our research method are presented in Fig-
 202 ure 3 and explored below.

203 Based on the above objective, the following research questions were for-
204 mulated:

- 205 • RQ1: What are the characteristics of the different research methodolo-
206 gies?
- 207 • RQ2: What are the main similarities and differences between the re-
208 search methodologies?
- 209 • RQ3: How do we select a suitable research methodology in a specific
210 situation?

211 To start addressing the research questions, we studied the literature on
212 the three methodologies and summarized them primarily as *presented* in their
213 fields of origin. The overviews in Sections 4.1, 5.1 and 6.1, include the origin
214 of the methodologies and a description of their core characteristics. Depend-
215 ing on the heterogeneity of the respective methodology, they are presented at
216 different levels of detail. During the information collection, we also gathered
217 aspects to compare the methodologies.

218 DSM and AR are then *discussed* from an industry–academia collaboration
219 perspective in software engineering. We do not provide such a discussion
220 for TTM, which emerged in a software engineering context. The outcome
221 concerning DSM and AR, presented in Sections 4.2 and 5.2 respectively,
222 varies depending on to what extent each methodology has been applied in
223 software engineering. For methodologies existing in multiple variants, we
224 selected one as a reference that was synthesized from various sources [2] or
225 established as the practice [33].

226 Furthermore, TTM is not primarily put forward as a research methodol-
227 ogy, although it has been used as such. Thus, we have chosen to reformu-
228 late the technology transfer model to gear it more towards being a research
229 methodology than originally presented [6]. It is here called the Technology
230 Transfer Research Methodology (TTRM), as shown in Figure 3.

231 For each research methodology, some references illustrating its use in
232 practice are provided. One of the identified examples is described in some
233 further details to illustrate each methodology, provided in Sections 4.3, 5.3
234 and 6.2. The selection of illustrations was based on the following criteria:

- 235 • Use different research methods within the use of the research method-
236 ology,

- 237 • Other researchers have conducted the study reported than the authors
238 of this article,
- 239 • If possible, illustrate the comparison aspects, which are listed in the
240 next section.

241 Based on our analysis of each methodology, we then *compared* them based
242 on several aspects. The comparison is presented in Section 7, which also
243 provides *guidance* for the selection of a research methodology in software
244 engineering.

245 3.3. Aspects of comparison

246 In the comparison, we start with comparing the primary objectives of the
247 research methodologies. Next, the following aspects are compared:

- 248 • Origin – This refers to the background of the respective research method-
249 ology, i.e. from which research domain the methodology originates.
- 250 • Outcome – Different research methodologies may have different main
251 and secondary outcomes.
- 252 • Roles – Research methodologies may include different roles, particularly
253 which roles practitioners and researchers take.
- 254 • Driver of literature search – Related work is an essential part of re-
255 search in general, but different research methodologies may approach
256 it differently, and in particular, the motivation may differ.
- 257 • Learning – The methodologies may have different objectives with re-
258 spect to generalized and case specific learning, and hence different pri-
259 mary expected lessons learned.

260 4. Design Science Methodologies

261 4.1. Overview

262 Design science may denote a *paradigm* or *methodology*. We do not take
263 a stand in this sometimes infected debate on whether it is a paradigm or
264 methodology [34, 35] but discuss the views as being possible to coexist. As
265 mentioned in Section 1, paradigm refers to “the set of common beliefs and

266 agreements shared between scientist about how problems should be under-
267 stood and addressed”, according to Kuhn [1]. As a paradigm, design science
268 embraces research on designed phenomena in contrast to research explaining
269 naturally occurring phenomena, or formalizing philosophical or logical sys-
270 tems. For example, information systems research is often conducted under
271 the design science paradigm [36], and so is management science [37], while
272 physics typically is explanatory, and mathematics is a dominantly formal
273 branch of science. Design science as a paradigm for software engineering is
274 explored by Runeson et al. [38] and Engström et al. [39].

275 As defined in Section 1, we refer to a research methodology as the ap-
276 proach to research, particularly the various types of activities to system-
277 atically address the research challenge, which is based on assumptions and
278 justification of the choices made. DSM, as a research methodology, provides
279 prescriptive guidance and frameworks. DSM is at a more concrete level than
280 the Design Science Paradigm and depicts one of many potential methodolo-
281 gies within the paradigm. However, a DSM is flexible enough to allow many
282 different research methods for data collection and analysis to be utilized
283 within the DSM frame.

284 Design science emerged from the desire to conduct research on artificial,
285 or designed constructs, in contrast to naturally occurring phenomena [40].
286 Simon, a 1978 Nobel Prize laureate in Economics, defined engineering as
287 the historical roots of design science. However, he embraces all kinds of
288 design, for example, architecture, business, education, law, and medicine [40].
289 Consequently, the primary outcome of the research is the artifact emerging
290 from the design, accompanied by knowledge about the design process.

291 Several instances of DSM are proposed and used in different fields of
292 research, e.g. by Hevner et al. [36] and Peffers et al. [41] in the field of infor-
293 mation systems, and Wieringa, bridging information systems and software
294 engineering [3]. Offermann et al. [2] compare four existing “design science
295 research processes” and propose a fifth one, which we discuss in Section 4.2.

296 All of these instances encapsulate three generic activities:

297 1. Problem identification or conceptualization

298 The problem under study has to be understood in its context. This
299 is not only a description or enumeration of problems but an in-depth
300 understanding of the constituents of the problem – its concepts. Tax-
301 onomies or model proposals may emerge from problem conceptualiza-
302 tion, or existing theories are used as concepts in the problem identifi-

- 303 cation.
- 304 2. Solution or artifact design and implementation
- 305 The envisioned solution emerges from the problem identification, sup-
306 ported by existing knowledge of the field. Solutions may be instances of
307 earlier known general solutions or developed specifically for the partic-
308 ular problem. Design knowledge is used and produced in the solution
309 design process, often referred to as an artifact.
- 310 3. Evaluation or validation
- 311 This activity aims to assess to what degree the solution solves the
312 problem. If the solution is instantiated in a new type of context, it also
313 extends the scope of the solution’s validity.

314 DSMs stress that the research is conducted in a context of practice and
315 generates contributions to practice. Multiple case studies are brought for-
316 ward as the typical research method for design science research [37], both for
317 the problem conceptualization and the evaluation. Some scholars label the
318 outcomes *artifacts*, although there is no unified taxonomy for what an artifact
319 is. Offermann et al. reviewed design science literature and synthesized arti-
320 fact types from 106 papers, identifying the following categories of artifacts:
321 system designs, methods, languages, algorithms, guidelines, requirements,
322 patterns, and metrics [42]. Van Aken defines “*technological rules*” as the
323 primary contributions from design science, which means “field-tested and
324 grounded” exemplars of how a problem can be solved [37], typically in the
325 form: *To achieve <Effect> in <Context> apply <Intervention>*.

326 Furthermore, DSMs stress the research to i) be built on existing knowl-
327 edge or theory, and ii) create/generate/synthesize design knowledge, in more
328 or less generalized form, about the area of study. Venable focuses on the
329 practical utility in design science by defining: “Theory embodies statements
330 of knowledge...in a form that has both use in the practical world...and in the
331 theoretical world” [12]. This duality is presented as rigor versus relevance
332 cycles by Hevner [36] and is put forward as an “act of producing knowledge
333 by designing useful things” by Wieringa [10]. Wieringa further distinguishes
334 between knowledge problems and practical problems to address these dual
335 goals, which are also present in Shaw’s practice and research learning cycles,
336 as illustrated in Figure 1 [8].

337 4.2. DSM for industry–academia collaboration in software engineering

338 As an example of DSM, we use the research process proposed by Offer-
339 mann et al. [2] since it is synthesized from several other methodologies and

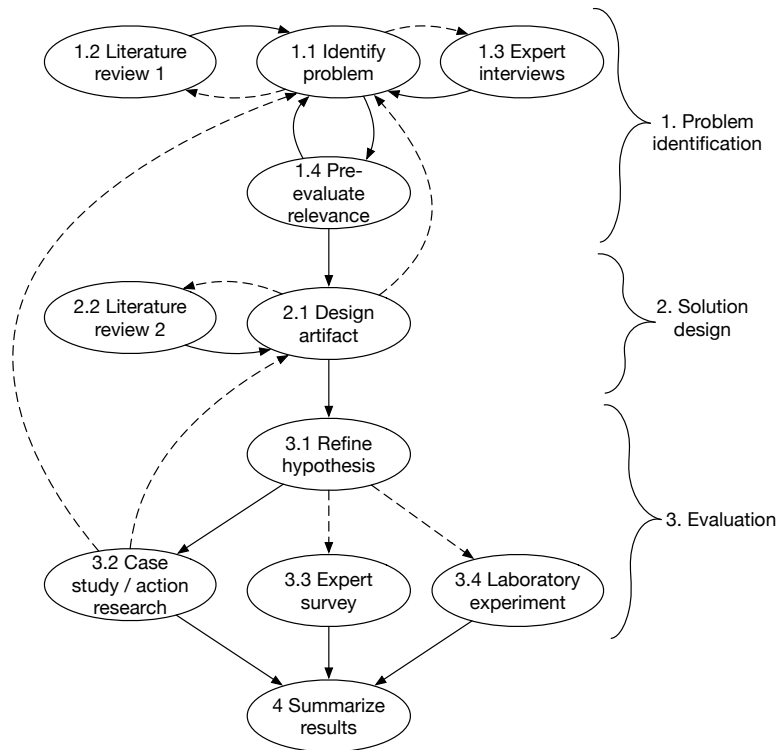


Figure 4: Research process for Design Science Methodology research, adapted from a proposal by Offermann et al. [2]. Ovals represent activities which are grouped into three main phases. Dashed lines indicate optional paths.

340 maps well to the general problem-solving model. They present a primarily
 341 linear process model, with some iterations, see Figure 4.

342 The model contains 11 activities, which are grouped into three main
 343 phases: problem identification, solution design, and evaluation. These phases
 344 map perfectly onto the general engineering research cycle in Figure 2.

345 The first phase concerns *problem identification* and contains activities to
 346 identify a relevant research problem within the domain of study. The prob-
 347 lems shall be rooted in the literature and practice, implying some form of
 348 industry–academia collaboration to ensure both. To support the problem
 349 identification, a *first literature study* may be conducted of scientific publica-
 350 tions and practitioner reports. The search aims to find knowledge, both about
 351 the problem and potential solutions to the problem. As proposed in software
 352 engineering, the search for practitioner reports implies that gray literature

353 also is taken into account, as discussed by Garousi et al. [43]. However, they
354 do not claim any general requirement on the rigor of the literature review, in
355 contrast to software engineering research, where systematic literature reviews
356 and mapping studies gradually have evolved as a norm [44].

357 The phase may also encompass *expert interviews* to help understand the
358 identified problem and assess its relevance. Interviews could take place one by
359 one or in workshops. This practice is well established in software engineering
360 as focus groups [45]. Offermann et al. stress that the problem should be
361 of interest to more than one organization. If not, it should be generalized
362 to make it relevant for more actors [2]. It is worth noting that they do *not*
363 propose case studies to identify the research problem, in contrast to software
364 engineering guidelines, where exploratory case studies are proposed to be
365 conducted for “generating ideas and hypotheses for new research” [46].

366 Next, a *pre-evaluation relevance* assessment is conducted. This includes
367 stating a research hypothesis “in the form of a utility theory” [2]. Venable [12]
368 defines that a utility theory should express a hypothesized connection be-
369 tween the solution and the problem space, i.e. what is the problem and how
370 is the proposed solution expected to address that. Offermann et al. [2] pro-
371 pose the hypothesis be expressed in a specific format: “if a solution to the
372 problem is applied, some observed aspects will be changed in a way which
373 ultimately helps the entities”. It resembles the technological rule brought
374 forward by van Aken [37]. In software engineering research, it is more com-
375 mon to express the utility theory in terms of research questions, for which
376 there also exist empirically derived guidelines in information systems [47].

377 The second phase, *solution design*, is a creative engineering process. It
378 is not much prescribed, but for the guidance about taking existing solutions
379 and state-of-the-art into account. For this purpose, a *second literature re-*
380 *view* may be conducted, now focusing on scientific literature searching for
381 solutions. During this phase, a need for better understanding or a revision
382 of the problem may be identified, thus iterating back to the problem iden-
383 tification phase. Other design science methodologies stress that alternative
384 solutions should be considered. For example, Johannesson and Perjons [48]
385 propose *divergent thinking*, meaning generating multiple, alternative ideas or
386 solutions to address a problem, and *convergent thinking*, meaning evaluation
387 of and selection from alternative ideas generated. The primary outcome of
388 this phase is, however, the *artifact*. In software engineering research, typ-
389 ical artifacts are tools, models or techniques, in which design knowledge is
390 embedded [39].

391 The third phase, *evaluation*, starts by refining the research hypothesis.
392 The overall research hypothesis may be too general or comprehensive, to be
393 feasible for evaluation. Therefore, the hypothesis is refined to be more specific
394 or limited in scope. The primary evaluation method is *case study* or *action*
395 *research*, but may also embody *expert surveys*, or *laboratory experiments*. In
396 this context, action research is seen as a research method, not a methodology.
397 Also, here, the process may iterate back for deeper problem understanding
398 or improved solution design.

399 The evaluation is at the core of empirical research in software engineer-
400 ing, where the authors of this article have contributed to method guide-
401 lines for experiments [49], case studies [23] and systematic literature re-
402 views [44, 50, 51], and Staron recently contributed with an action research
403 guidebook [5]. Which approach to use depends on the goal of the evaluation,
404 whether generalizability, precision in measurements, or realism is prioritized.
405 Stol and Fitzgerald provide guidance in this respect through the ABC frame-
406 work [19]. They have further recently integrated the ABC framework with
407 the design science perspective [52].

408 In the final step, the *results are summarized* and published in feasible for-
409 mats. Intermediate results may also be published, and thereby early feedback
410 on the results can be gained.

411 Engström et al. conducted an analysis of 38 distinguished papers at the
412 ICSE conferences 2014–2018 from a design science perspective [39]. They
413 conclude that most papers can be expressed from a design science perspective:
414 solution-oriented, aiming to provide design knowledge, although it is less
415 clear which practical problem they address. They observe that the solution
416 design process is often implicit, although defined in terms of the previous
417 and updated state of a technology or process under improvement. Only 13
418 out of the 38 papers reported a complete problem–solution pair. However, a
419 design science research project can be published partially in several papers.
420 Eight papers focused on describing the problem, seven on solution design and
421 seven on solution validation. Still, the outcome of the analysis is that this
422 part of the software engineering community would benefit from being better
423 anchored in practice, again stressing the need for closer industry–academia
424 collaboration.

425 In summary, the design science methodology, as formulated by Offermann
426 et al. [2], aligns well with software engineering research and the general re-
427 search cycle. Software engineering research may put even more emphasis on
428 the empirical methods in problem identification, and the notion of an artifact

429 may differ from the information systems concepts.

430 *4.3. Illustration of DSM*

431 DSM is used to some extent in software engineering, although the design
432 science approach is often implicit, as mentioned above [39]. However, there
433 are studies explicitly following DSM, foremost referring to Hevner [36] or
434 Wieringa [10, 53, 3] for their methodology. Examples include design and eval-
435 uation of an artifact-based requirements engineering model [54], specification
436 of confidentiality requirements [55], design and evaluation of a lightweight
437 analysis method to find root causes for defects [56], and a method to im-
438 prove the alignment between test and requirements, by reducing communi-
439 cation gaps [57]. Furthermore, DSM is used in research where the design of
440 the software itself is the resulting artifact [58] and to the creation of software
441 engineering research tools to mine GitHub data [59].

442 To illustrate DSM, we selected the work by Bjarnason et al. [57], where
443 they designed and evaluated an artifact, namely Gap Finder, which is a
444 maturity and improvement model. Expressed as a technological rule (see
445 Section 4.1 and [37]) they recommend using “Gap Finder for assessing and
446 identifying suitable improvements to the alignment of requirements and test-
447 ing within a software development project” [57].

448 Its theoretical underpinning comes from Bjarnason et al.’s theory of dis-
449 tances in software engineering [60], which in turn was based on literature
450 reviews and empirical observations of practice in five companies. The the-
451 ory of distances explains how certain software engineering practices improve
452 the communication within a project by impacting distances between people,
453 activities and artifacts.

454 They proceeded the work using DSM to design a practical method for ap-
455 plying the theory in practice. Figure 4 is used below as a frame of reference
456 in the illustration. A case organization was studied to describe the problem
457 of communication gaps between requirements and testing and to validate its
458 practical relevance (1. Problem identification). Semi-structured interviews,
459 document studies, and ethnographic observations were used to identify prob-
460 lems. Thus, they used more thorough empirical methods for the problem
461 identification, compared to the DSM process by Offermann et al. [2].

462 Gap Finder was then iteratively designed to guide the systematic assess-
463 ment of organizations, which is a key characteristic of DSM. The research
464 team designed (2.1 Design artifact) the initial version based on the under-
465 pinning theory (2.2 Literature review 2) and the knowledge gained from the

466 studied case in the first round of interviews, document studies, and observa-
467 tions. As a first evaluation, the scope was reduced (3.1 Refine hypothesis)
468 and it was applied to one sprint for one development team to help the re-
469 searchers assess its feasibility and evolve the Gap Finder (3.2 Case study).
470 They gained new insights from the case, improving the design for the specific
471 needs (2.1 Design artifact, 2nd iteration) while maintaining its generality.

472 The resulting method contains an assessment process with workshop and
473 measurement guidelines, outcome presented in radar diagrams, and recom-
474 mendations for improved practice.

475 The method was then evaluated in the case context by applying the assess-
476 ment process of the Gap Finder (3.2 Case study, 2nd iteration). In addition
477 to the data collected in the method, a focus group session and a survey were
478 organized to collect specific validation feedback (3.3 Expert survey). The
479 validation concerned the evaluation method as such, as well as the proposed
480 practices to reduce gaps between requirements and testing.

481 In summary, this DSM study revolves around the derivation of knowledge
482 about reducing requirements–test communication gaps, embedded in an ar-
483 tifact, the Gap Finder method. Both problems and solutions were derived
484 from existing empirically based knowledge, while the change process is left
485 to the organization to continue with support from the Gap Finder method.

486 5. Action Research

487 5.1. Overview

488 Action Research (AR) has its roots in social science and was developed
489 to change a social system while doing research. It emerged as a reaction to
490 research only creating knowledge without setting it into action, thus focusing
491 on the researchers being involved in a change process. Lewin coined the term
492 in the 1940s [61], and it became gradually more defined and prescriptive,
493 particularly by Susman and Evered [62], introducing a cyclical process of
494 five phases:

- 495 1. Diagnosing – identifying or defining a practical problem to be addressed
496 in collaboration between researchers and practitioners. The researcher
497 should confirm the problems identified by the practitioners and also
498 determine the root causes of the problems.
- 499 2. Action planning – considering alternative approaches to solve the prob-
500 lem. The diagnosing phase informs the action planning towards poten-
501 tial solutions to the problem under study.

- 502 3. Action taking – setting the planned actions into practice. The change
503 process may need support from actors in various roles of the organiza-
504 tion, for example, a project champion who helps initiate changes.
- 505 4. Evaluating – studying the consequences of an action. Data collection
506 should be performed before, during and after the action taken to ensure
507 that enough information is gathered to assess the goals of the actions
508 and the mechanisms leading to the change.
- 509 5. Specifying/learning – identifying general findings in relation to the
510 problem and actions under study. The primary focus is set with re-
511 gard to the current project, and decisions related to the exit of the
512 researcher or initiation of a new cycle is taken.

513 This cyclical process is widely adopted in the social sciences and consti-
514 tutes one of the five principles for Canonical Action Research (CAR) [33].
515 The other four principles are about researcher–client agreement, theory, change
516 through action, and learning through reflection. Specifically, the principle of
517 theory focuses on using theory to guide research rather than generating or
518 validating theory as an action research goal. However, AR comes in many
519 forms. In 1948, AR pioneers Chein et al. [63] identified four varieties of AR,
520 depending on the degree and type of interaction between researchers and the
521 community under study. Baskerville and Wood-Harper provide an overview
522 of the evolution of AR in social science and information systems, identifying
523 ten distinguishable forms of AR in the information systems literature [4].

524 Action Research was first introduced into information systems as a re-
525 search methodology by Wood-Harper in 1985 [64] and then into software
526 engineering around the turn of the millennium, according to a literature re-
527 view by Santos and Travassos [65]. Guidelines for action research in software
528 engineering are published by Santos and Travassos [65], Wieringa [66], and
529 Staron [5].

530 AR methodologies, in general, have been criticized for lacking rigor while
531 generally producing relevant results [33]. Davison does not refute the crit-
532 icism but argues against rigor and relevance in AR having an inverse rela-
533 tionship. “[T]hese two attributes need not be mutually exclusive, although
534 they can be hard to achieve in a single CAR project.” [33]

535 The relation between action research and design science is another point
536 of debate in the information systems community. While Järvinen argues that
537 “Action research is similar to design science” [67], Iilari and Venable claim
538 AR and DS are “Seemingly similar but decisively dissimilar” [35]. Baskerville

539 states that “Design science is not action research” [34]. We do not want to
540 enroll in these methodological wars but conclude that the differences depend
541 on whether they compare AR with DSM or design science as a paradigm.
542 In this paper, we choose, like Wohlin and Aurum [25], to treat both action
543 research and design science as methodologies to get comparable entities in
544 our analysis.

545 5.2. *AR for industry–academia collaboration in software engineering*

546 Our discussion concerning AR takes its starting point from CAR (i.e.
547 Canonical Action Research), as defined by Susman and Evered [62] and later
548 refined by Davison [33], see Section 5.1. We further analyze Staron’s proposed
549 instantiation of AR for software engineering [5]. The five phases of CAR map
550 to the three activities in the general research cycle illustrated in Figure 2:

- 551 • describe – diagnosing the problem
- 552 • solve – action planning and action-taking
- 553 • practice – evaluating and specifying/learning

554 CAR stresses the cyclic procedure and that there may be more fine-
555 grained iterations, e.g. if the proposed actions have to be revisited. Fur-
556 thermore, Davison refers to early proposals of a spiral model of multiple
557 cycles from Kemmis and McTaggart [68], where each cycle focuses closer on
558 the organizational problem under study. A similar approach was used in soft-
559 ware engineering by Andersson and Runeson [69], inspired by Boehm’s spiral
560 process model for software engineering [70], see Figure 5. Their research en-
561 deavor on software quality monitoring included seven cycles, starting with a
562 modeling activity, followed by two exploratory cycles, which were confirmed
563 in the fourth cycle. The three last cycles were explanatory and aimed to
564 develop quality prediction models. All cycles were performed in industry–
565 academia collaboration, although tasks were divided between the groups.
566 Goals and scope for each iteration were set jointly, researchers collected and
567 analyzed data, while the practitioners were responsible for the change action
568 and working procedures in the organization.

569 The social context, and the change of the conditions of the social con-
570 text, is in focus for AR. Baskerville defines as a key assumption for AR that
571 the “social setting cannot be reduced for study” [71], implying that the phe-
572 nomenon under study loses key characteristics if taken out of its context.

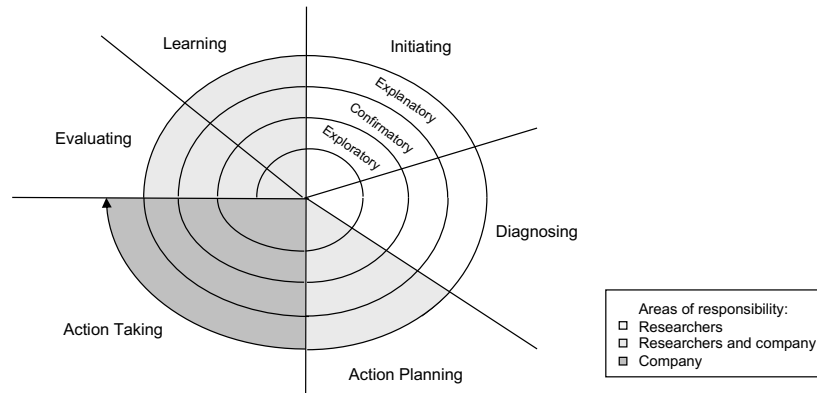


Figure 5: Spiral research model adapted from Andersson and Runeson [69] to the CAR terminology.

573 This fits well with particular aspects of software engineering research, where
 574 complex interactions in a socio-technical system are at the core of its research
 575 challenges. For example, Runeson et al. define a software engineering case
 576 study to be “... an empirical enquiry ... in its real-life context, especially
 577 when the boundary between phenomenon and context cannot be clearly spec-
 578 ified.” [23, p. 12] Furthermore, Wohlin et al. put forward a general theory
 579 for software engineering based on balancing human, social and organizational
 580 capitals [72].

581 Santos and Travassos surveyed the software engineering literature 1993–
 582 2010 and found an increasing trend of the use of AR, although at a low level.
 583 In total, 22 studies were found in nine high-quality software engineering
 584 journals and four conferences [65]. We have not found any later systematic
 585 literature review on AR in software engineering. However, database searches
 586 indicate more AR studies published in software engineering after 2010, al-
 587 though still at a low pace.

588 There are several proposals for the adaptation of AR to software en-
 589 gineering. Santos and Travassos [65] elaborated on the interplay between
 590 the change action and the theoretical learning, arguing that “the Action
 591 Research methodology with its dual objective of improving organizational
 592 problems and generating scientific knowledge leads to a ‘win–win’ scenario
 593 for both professionals (organization) and researchers.”

594 Wieringa defined the notion of Technical Action Research (TAR), using
 595 DSM guidelines to design an artifact and AR practices to scale it up to

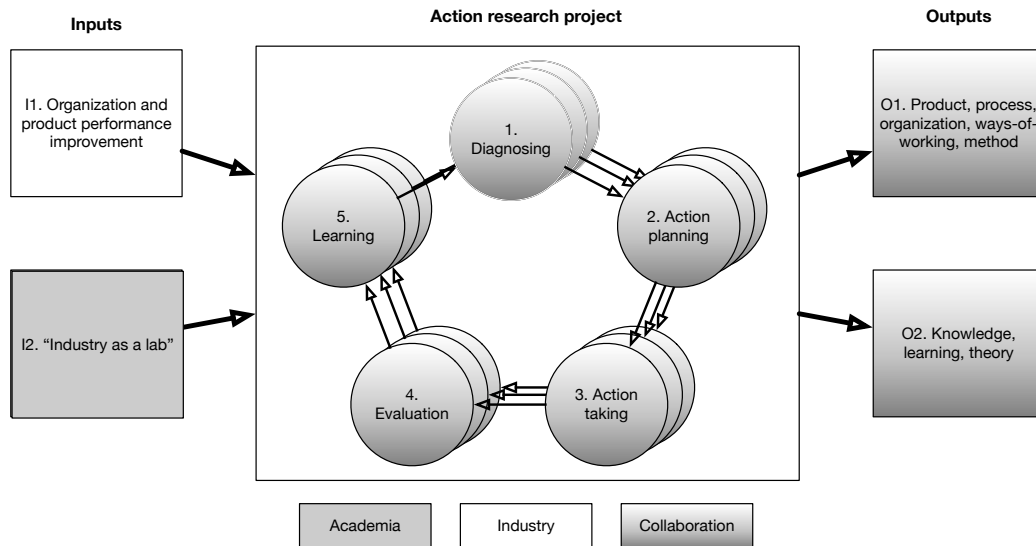


Figure 6: Overview of Staron's AR model for software engineering research [5]

596 practice and validate it [66]. Petersen et al. proposed AR as an industry–
 597 academia collaboration model [73]. Garousi et al. recently proposed AR as a
 598 feasible approach to improve the relevance of software engineering research,
 599 based on their analysis of peer-reviewed and gray literature on academic
 600 and practical relevance [74]. Thus, there are several applications of AR to
 601 software engineering, indicating its feasibility for software engineering.

602 Staron, who has published several papers on AR research in software en-
 603 gineering, recently published comprehensive practical guidelines for AR in
 604 software engineering, including the process of industry–academia collabora-
 605 tion at large [5]. Staron's guidelines extend CAR by contextualizing the
 606 five phases for software engineering companies and research projects through
 607 experience-based recommendations. An overview of the AR model is pre-
 608 sented in Figure 6. Furthermore, he defines three key team roles in the
 609 research collaboration, namely:

- 610 • The action team is responsible for planning, executing and evaluating
 611 the research.
- 612 • The reference group is responsible for the advice and feedback to the
 613 action team.
- 614 • The management team is responsible for managing and governing the

615 project and its institutionalization of changes.

616 The action team comprises both researchers and practitioners, while the ref-
617 erence group and management teams consist of company representatives only.

618 Action research methodology has several characteristics that fit soft-
619 ware engineering research, particularly for collaboration-intensive industry-
620 academia projects, focusing on the change of industrial practices. The cyclic
621 approach, the problem-oriented focus, and the empirical evaluations in real-
622 life contexts resonate well with successful collaboration projects, exemplified
623 by Carver and Prikladnicki [75]. They also stress the importance of feasible
624 roles in the collaboration, which also is a key asset of CAR [33].

625 Wohlin et al. confirmed the importance of roles in a survey with re-
626 searchers and practitioners [15]. Both groups ranked the role of a cham-
627 pion on-site as the top 1 or top 2 factor for a successful industry-academia
628 collaboration. Still, there are different views on the balance between the
629 researcher and the practitioner in AR. Davison states that “[r]esearchers
630 typically guide the overall process, but their scope of responsibility on con-
631 tent issues is a common topic of negotiation.” [33] Staron [5, p.22] stresses
632 that the action team comprises both researchers and practitioners without
633 detailing who is doing what within the team. They complement each other
634 based on their different knowledge and perspectives. Decision making con-
635 cerning change proposals involves an interplay with the management team.
636 Andersson and Runeson [69] make the separation between researchers and
637 practitioners clearer by assigning responsibility for action taking to the com-
638 pany, while the researchers are responsible for the diagnosis, see Figure 5.

639 Software engineering is a socio-technical field, and as AR emerges from
640 the social sciences, it strengthens the social side of the research and opens up
641 towards qualitative research methods [76]. Software engineering challenges
642 is often an interplay between technical and organizational or human aspects.
643 Notably, Staron defines AR as a “quantitative methodology”, arguing that
644 quantification “provide[s] the possibility to reduce the bias of subjective ob-
645 servations and provide quantitative evidence” [5, p.19]. In contrast, the
646 software engineering community gradually has evolved towards taking on so-
647 cial sciences’ qualitative methodologies (e.g. Seaman [76] and Runeson et
648 al. [23]) and learned to address the validity of such studies too.

649 Action research has been criticized for being more action than research [33].
650 On the contrary, software engineering research has been criticized for being
651 more research than action. Particularly, Briand et al. [26] argue for problem-

652 driven research in collaboration with practitioners conducted in specific con-
653 texts. This is indeed a trade-off that has to be handled properly. Conducting
654 research in complex contexts add to the relevance of the research. On the
655 other hand, there is a risk that the research becomes “advocacy research” in
656 the sense that researchers advocate for their proposed solutions and look only
657 for signs of confirmation of their hypothesis. However, this can be handled
658 by adhering to proper research and validation procedures for both qualitative
659 and quantitative research.

660 As the primary goal of AR is to support change in a specific context,
661 generalization is given less priority. However, Davison et al. strongly argue
662 for the role of theory in CAR to guide the research and as an output that helps
663 to communicate generalized knowledge [33, p.74]. In software engineering,
664 the use of theory is not very prevalent [77, 78]. Staron, therefore, extends
665 the notion of theory: “The theory, in this context, is the description of
666 the phenomena that need to be studied, theoretical relationships between
667 elements of that phenomenon, and the rationale behind them.” [5, p.38] This
668 is what may be called a hypothesis or a model in other contexts, but still,
669 the AR model embraces the scientific knowledge-building process.

670 In summary, AR is a feasible research methodology for software engineer-
671 ing research in industry-academia collaboration, focusing on the change of
672 practice. It has limitations with risks for focusing too much on action, but
673 it is a sound counteract against too much research in the lab for the soft-
674 ware engineering community. Theorizing is embedded in the methodology
675 but rather a means or a by-product than a primary goal.

676 *5.3. Illustration of AR*

677 Action research studies exist in software engineering, although they tend
678 to be more inspired by the AR principles rather than fully adhering to AR
679 methodological guidelines. However, such studies are in emergence, as men-
680 tioned above, in relation to Staron’s guidelines [5]. Staron and co-authors
681 recently published two AR studies, where two companies worked together
682 on improving tool support for selecting code fragments for review [79] and
683 identifying violations of coding guidelines [80], respectively. Choras et al.
684 also used software engineering tools as a vehicle to improve practice [81], and
685 Razavian and Lago developed a strategy for data migration [82], based on
686 Wieringa’s TAR guidelines [66]. These TAR studies focus more on the design
687 and less on diagnosis than the original CAR principles [62]. This is, in fact,
688 the aim of TAR with its dual engineering and research cycles, focusing on

689 action and generalized design knowledge, respectively. To illustrate AR, as
690 such, we select Ananjeva et al.’s study, aiming to integrate user experience
691 (UX) work with agile software development, as our illustrative example [83],
692 referring to artifacts and activities in Figure 6.

693 The AR study is conducted jointly (Collaboration) between a small software-
694 as-a-service company (Industry), an on-site observer (Master thesis stu-
695 dent), and researchers with software engineering and UX competence (Academia)
696 over 12 months. The company observed challenges integrating their UX work
697 in their agile development process, performed by two separate teams (In-
698 put I1). The problems were explored in depth through five months of on-site
699 observations, interleaved with 32 recorded interviews and ad hoc conversa-
700 tions with team members (1. Diagnosing). The primary concern identified,
701 was in short, that the user stories were too lengthy to match with agile
702 principles.

703 The first proposed intervention (2. Action planning) was to write more
704 concise user stories and complement them with face-to-face communication.
705 This intervention proposal was discussed at length and criticized by one of
706 the managers – according to the researchers, wanting “verbose user stories
707 as a shield to protect herself and the stories from [...] criticism”. Thus, as a
708 second intervention, a workshop was organized to help the two teams discuss
709 and resolve the latent conflict about the user stories. They came up with a
710 compromise, which they decided to implement (3. Action taking).

711 In a follow-up workshop two months later, the managers of the two teams
712 confirmed that they were in the process of eliminating the verbose user sto-
713 ries, but they had not yet succeeded (4. Evaluation). The researchers also
714 reflect on the lessons learned from the case, demonstrating the interplay be-
715 tween the organization, its culture, and the development processes (5. Learn-
716 ing).

717 In summary, the AR study focuses on the change in the organization
718 (Output O1). It is an iterative and highly intertwined endeavor between
719 researchers and practitioners. This example demonstrates how a technical
720 change proposal triggers a social or organizational conflict, which has to be
721 addressed in conjunction with the change. The study is well anchored in
722 existing theory, while the outcome is rather lessons learned than generalized
723 knowledge (Output O2).

724 6. Technology Transfer Model

725 6.1. Overview

726 Gorschek et al. [84] formulated a model for technology transfer with sev-
727 eral activities for conducting industrially relevant research and then transfer
728 the research outcomes to practice. It includes working very closely between
729 practitioners and researchers throughout the process to create trust and com-
730 mitment from the practitioners concerning the solutions developed as part of
731 the research. Hence, the model is developed with a strong focus on academia-
732 industry collaboration, where the problem being researched emanates from an
733 industrial challenge. The solution developed through research goes through
734 several validation steps to ensure that it may be put into practice with low
735 risk.

736 The model highlights three different roles: *practitioner*, *champion* and *re-*
737 *searcher*. Practitioner refers to stakeholders in the industry, potentially with
738 varying roles in the company. In comparison, the champion is a driver of the
739 research collaboration from the industry side. The champion is the primary
740 contact person and is supposed to help with the right contacts within the
741 company and to ensure a broader company commitment. Commitment is
742 needed from both adequate technical staff and appropriate management lev-
743 els. In the different activities, it is essential to have comprehensive coverage
744 of roles and stakeholders to ensure a smooth transfer of the solution once it
745 put into practice.

746 The model is not formulated as a research methodology as such. However,
747 the activities in the model describe the process of conducting research in
748 close collaboration between industry and academia. The model is illustrated
749 in Figure 7, and the activities may be summarized as follows:

750 1. Industrial challenge

751 The research should be based on industry needs identified in a dia-
752 logue between industrial partners and the researchers. The identifi-
753 cation includes process assessment and observation activities. Having
754 researchers present at collaborative partner sites is highlighted as essen-
755 tial to ensure good personal contacts and to build trust on an individual
756 level.

757 2. Problem statement and state-of-the-art

758 The industrial challenge from item 1 is formulated in terms of research
759 and, in particular, research questions. Furthermore, the literature is
760 studied to capture relevant research concerning the industrial challenge.

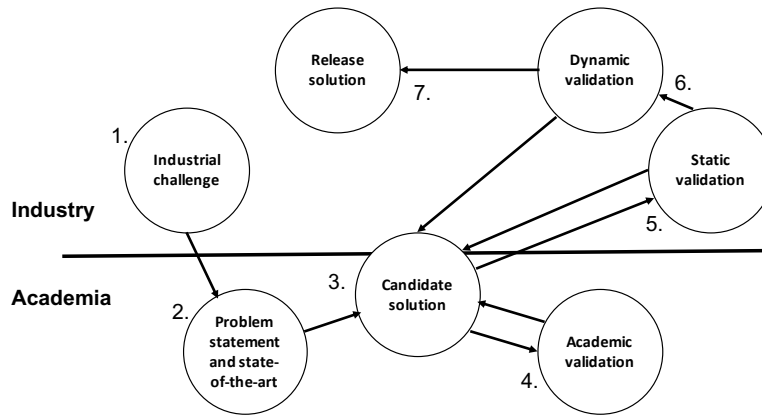


Figure 7: The technology transfer model adapted from Gorschek et al. [84].

- 761 3. Candidate solution
 762 In close dialogue with the industrial partner(s), and, in particular, the
 763 champion(s), a solution is developed. The solution should be based on
 764 relevant existing research, novel research ideas as part of the collabo-
 765 ration and the industrial context that the solution should fit into.
- 766 4. Academic validation
 767 To minimize risk before transferring a solution to the industry, it is
 768 preferably validated in an academic setting. This may be done, for
 769 example, through experimentation with human subjects [49] or simu-
 770 lation [85].
- 771 5. Static validation
 772 Once no further improvements are identified in the academic setting,
 773 a static validation is conducted. The static validation is done through
 774 seminars and discussions with the key stakeholders to anchor the pro-
 775 posed solution. Based on potential feedback from the static validation,
 776 the solution is refined. Depending on the changes to the solution, there
 777 may be a need for more than one round of static validation.
- 778 6. Dynamic validation
 779 Dynamic validation means running a pilot in a suitable situation. The
 780 pilot should be as representative as possible of the regular context in
 781 which the solution is expected to be used. It should help ensure that the
 782 solution fits well with the current practices and the potential roles and
 783 responsibilities put forward by the solution. Based on the outcome, the
 784 solution may be updated or fine-tuned, and it then has to be decided

785 whether further pilots are needed, or the solution is ready for broader
786 usage within the company.

787 7. Release solution

788 It is essential that appropriate documentation, training and support are
789 available when the solution is integrated into the normal work processes
790 at the company.

791 In summary, the technology transfer model focuses on a close collabora-
792 tion between industry and academia. Through successive validation, it builds
793 trust and commitment to the proposed solution to the industrial challenge
794 identified as suitable for the collaborative effort.

795 To bring TTM closer to a research methodology, we propose reformulating
796 it as consisting of the following six activities:

- 797 1. Identify the industrial challenge
- 798 2. Assess practice and formulate a research objective
- 799 3. Study state-of-the-art
- 800 4. Develop one or more candidate solution(s)
- 801 5. Evaluate the solution(s)
 - 802 (a) In an academic setting
 - 803 (b) Static evaluation
 - 804 (c) Pilot evaluation
- 805 6. Move the chosen solution into practice and evaluate

806 Thus, we have divided the second step in TTM into two activities and
807 collapsed the three validation activities into a single evaluation activity. The
808 main reason for the latter is that the three validation steps are viewed as too
809 detailed, and often all three of them are not practiced, as further discussed
810 in Section 6.2. Depending on the technology to be put into practice, the
811 evaluation step may also include training of practitioners. Henceforth, we
812 refer to these six activities as the Technology Transfer Research Methodology
813 (TTRM) to distinguish it from the original TTM. The six activities are easily
814 mapped to the research cycle *describe–solve–practice*.

815 Given that TTM/TTRM is formulated within software engineering for
816 industry–academia collaboration, we turn directly to the illustration of its
817 use.

818 *6.2. Illustration of TTM/TTRM*

819 TTM has been used as a research methodology in several areas of soft-
820 ware engineering and by different researchers. The model emanates from
821 a collaboration between industry and academia in the area of requirements
822 engineering. The model captures how the research resulting in the Require-
823 ments Abstraction Model [6] and its evaluation [86] was conducted. Since
824 then, it has been used in software testing for test case selection methods
825 as described by, e.g. Garousi et al. [87] concerning regression testing and
826 de Oliveira Neto et al. [88] in relation to continuous integration. Further-
827 more, Torkar et al. [89] used TTM for studies on adopting open source in
828 the industry. Moreover, Borg et al. [90] have used it for impact analysis in
829 their industrial collaboration. As a final example in software engineering, we
830 would like to highlight the work by Briand et al. [91] in the area of model-
831 driven engineering. The research by Briand et al. is described in further
832 detail below to illustrate their use of TTM in their research together with
833 industry. It is also worth noting that TTM has been used outside software
834 engineering, which is here exemplified with a study by Pochyly et al. [92] in
835 the area of robotic vision.

836 Briand et al. [91] presented three research projects in the area of model-
837 driven engineering and their experiences from using an adapted version of
838 the TTM. They adapted TTM by introducing a particular training activity,
839 which we have chosen to integrate into the evaluation activity discussed in
840 Section 6.1. The transfer of novel research solutions was the main driver
841 in the collaboration between industry and academia, and hence training
842 becomes an essential aspect. Furthermore, they only used two validation
843 activities and highlighted that just one might be needed depending on the
844 situation. Thus, TTRM is well-aligned with the use of TTM by Briand et al.
845 References to the activities in TTM as illustrated in Figure 7 are provided be-
846 low to ease the mapping between the example and the research methodology
847 description.

848 In their study, Briand et al. [91] used participation in regular project
849 meetings, organizational observations, and meetings and interviews with do-
850 main experts to identify and formulate the industrial challenge in their three
851 reported projects (1. Industrial challenge). They continued with studying
852 state-of-the-art about the identified challenge (2. Problem statement and
853 state-of-the-art).

854 In the next step, they developed candidate solutions, including an infor-
855 mation model supporting traceability, a model-based approach for support-

856 ing software configuration and a model-based approach for assessment of
857 new technologies (3. Candidate solution). The solutions were based on the
858 identified challenges, the needs of their collaborative partners and available
859 research, and innovative ideas from the participating researchers.

860 Briand et al. [91] chose to not conduct validation in academia (4. Aca-
861 demic validation). They argue that they did not have a sufficiently good
862 benchmark to conduct a validation in academia. Thus, once candidate so-
863 lutions were available, they were discussed with the practitioners (5. Static
864 validation), and the solutions were in all three projects evaluated using case
865 studies (6. Dynamic validation). Furthermore, they included training as part
866 of the industrial validation. The research-based innovations have begun to
867 be used, according to Briand et al. [91] (7. Release solution).

868 Briand et al. have introduced the adapted model as their way of produc-
869 ing research-based innovation together with their industrial partners

870 **7. Comparison**

871 *7.1. The three research methodologies*

872 The research methodologies discussed above have been formulated for
873 different main reasons, which we explore below. Thus, the research method-
874 ologies are complementary but also competing. They are complementary
875 based on their primary objective when being formulated and competing in
876 the sense that they can all be adapted to produce the main outcome of each
877 other. The primary objective governs to a large extent what each methodol-
878 ogy puts forward as its main outcome. This implies that it is not apparent
879 which research methodology to choose.

880 We recommend that researchers choose wisely and not only use the re-
881 search methodology they are used to and know very well. The primary
882 objective of each methodology should be an essential aspect. However, ele-
883 ments from other research methodologies may influence the implementation
884 of the chosen research methodology. For example, action research can be
885 used within the methodological frame of design science as a method, see Fig-
886 ure 4. In summary, the main recommendation is to choose based on matching
887 the main goal of your research and your intended way of conducting the re-
888 search with the primary objective of the research methodology. As a positive
889 side-effect, it may also mean that researchers become more explicit in their
890 primary objective with the research (or study) they conduct.

891 The primary objective of the three research methodologies may be sum-
892 marized as follows:

- 893 • Design Science Methodologies
894 Design science is focused on the design knowledge acquired through
895 the design of artifacts. It emerged as a complement to studying natural
896 phenomena, based on a desire to study artificial or designed constructs.
897 The artifacts primarily focus on tangible outputs and less on social
898 change.
- 899 • Action Research
900 Action research is focused on social systems and emerged based on a
901 need to put knowledge into action. In action research, the researchers
902 are deeply involved in the change process, i.e. being a member of the
903 team responsible for the change.
- 904 • Technology Transfer Research Methodology
905 The technology transfer research methodology is an adaptation of the
906 TTM that emerged as a model for collaboration between industry and
907 academia. There is a strong focus on successfully transferring research
908 into practice.

909 From a software engineering perspective, the different research method-
910 ologies may be used in industry–academia collaboration as follows:

- 911 • If the primary objective is to derive knowledge through the development
912 of tangible artifacts, then design science methodologies may be a good
913 starting point.
- 914 • If the primary objective is to support change, such as changing the ways
915 of working, and the researcher is a member of the team responsible for
916 the change, action research may be a good starting point.
- 917 • If the primary objective is to transfer a research result to the industry
918 but not being part of a team responsible for the change. In this case,
919 the technology transfer research methodology may be a good starting
920 point.

921 It should be noted that the items above are formulated based on having
922 a primary objective in the research. However, it is essential to allow different

	DSM	AR	TTM/TTRM
<i>Origin</i>	Multiple (via IS)	Social science (via IS)	Software engineering
<i>Main outcome</i>	Design knowledge	Change	Knowledge transfer
<i>Roles</i>	Knowledge vs change	Integrated action team	Knowledge vs change
<i>Driver of literature search</i>	Problem and solution	Diagnosing	State-of-the-art study
<i>Learning</i>	Problem and solution theory	Theory as secondary output	Lessons learned

Table 1: Summary of the comparison between the three research methodologies.

923 research methodologies’ strengths to influence the research, although having
 924 one research methodology as the main starting point.

925 Our guidance in selecting a research methodology is based on a systematic
 926 comparison between the methodologies used for software engineering research
 927 in industry–academia collaboration. We summarize the comparison of the
 928 aspects listed in Section 3.3 in Table 1 and elaborate on the similarities and
 929 differences below.

930 The *origin* sets some fundamental principles of the methodologies, which
 931 influence the research. The socio-technical characteristics of software en-
 932 gineering imply that methodologies from both a social and technical back-
 933 ground are relevant. Furthermore, different branches of software engineering
 934 research may focus more on one side or the other.

935 DSM has multiple roots in the sciences of “the artificial” [40] and has
 936 primarily emerged into software engineering via information systems [36,
 937 10], although influences have also come via management science [37]. AR
 938 emerged from social science [61] and has also reached software engineering
 939 via information systems [71]. The social and information systems origin
 940 tend to make the methodologies lean towards the social side, although DSM
 941 counteracts that by focusing on artifacts.

942 TTRM, on the other hand, is designed for software engineering and takes
 943 the intangible characteristics of the products and services into account [74].

944 The *main outcomes* are what the methodology puts forward as the driving
 945 force in the research. However, what is the main outcome for one method-
 946 ology may be secondary outcomes for another. Hence, this is not a clear
 947 distinction between what outcomes there may be. It is more a matter of
 948 which outcome is considered most important.

949 DSM focuses on design knowledge, i.e. how to design artifacts and prod-
 950 ucts. The term artifact indicates that DSM is flexible in what type of knowl-
 951 edge may be the outcome, as artifacts may involve product and process-

952 related outcomes [42]. AR focuses on changes in the natural context, similar
953 to TTRM, which focuses on impacting software engineering practice through
954 knowledge transfer.

955 All methodologies address the collaboration between industry and academia,
956 as they aim to produce (DSM) or transfer knowledge about some practice
957 (TTRM) or make a change of practice (AR). The *roles* taken by researchers
958 and practitioners are, however, slightly different. AR emphasizes the unified
959 research team of both researchers and practitioners, although acknowledg-
960 ing that there are management roles taken by practitioners only. The other
961 two methodologies make more separation in that a joint team, mostly led
962 by researchers, derive the knowledge. At the same time, the practitioners
963 have the ultimate responsibility for the change, based on the derived knowl-
964 edge. Still, all methodologies aim for industry–academia collaboration and
965 co–production of knowledge, although it is emphasized to somewhat different
966 degrees.

967 The role of *literature* or underpinning theory as a starting point for the
968 research endeavor differs between the methodologies. DSM, in the Offermann
969 instance (see Figure 4), proposes two literature reviews, one for problem
970 identification and one for solution design. In TTRM, one activity focuses
971 on “study state-of-the-art”, identifying potential solutions in the literature.
972 In AR, the literature is more implicitly covered as a part of the diagnosing
973 phase.

974 The *learning* gained from the research is tightly related to the main out-
975 come in the study contexts. Still, being research methodologies, the learning
976 is also communicated in academic contexts. Venable [12] adds that theory
977 may be output from design science research. According to Staron [5], AR
978 presents theory as a potential outcome, which is in line with general AR [62],
979 although not the main outcome. In TTM/TTRM, which is directed towards
980 supporting engineering, lessons learned are documented, although it is not
981 prescribed to be expressed in terms of theory.

982 7.2. Implications of comparison

983 As a socio-technical inter-discipline [93], software engineering is constantly
984 being influenced by multiple research fields. Consequently, increasing aware-
985 ness and focus on research methodology also leads to influences from adjacent
986 areas, like information systems and other engineering disciplines. In this ar-
987 ticle, we have analyzed research methodologies from these fields, aiming to

988 derive guidance for what to use in industry–academia collaborative research
989 on software engineering under different circumstances.

990 Selection of research methodology seems to be a sensitive question, as we
991 have found disputes over research methodology in adjacent fields of research,
992 sometimes conducted in emotional and authoritarian tones [35, 67, 34]. Fur-
993 thermore, we have observed that many variants of research methodology
994 exist under the same label. When methodologies evolve in parallel in differ-
995 ent fields of research, the evolution may take different paths. For example,
996 Offerman et al. [2] analyze five design science variants for information sys-
997 tems and merge them into one. Moreover, regarding action research, one of
998 the multiple variants has been assigned the label ‘canonical’ [33] as a kind
999 of official mark in an – in this case successful – attempt to homogenize the
1000 concepts in a field of research.

1001 Further adding to the confusion about terms and concepts, the labels used
1002 for research *methodologies* also appear as a denotation for *paradigms* or *meth-*
1003 *ods*. As presented in Section 4, design science denotes both a paradigm [38,
1004 35] and a methodology [2].

1005 Why are these distinctions important? Aren’t they just examples of these
1006 “academic battles” without relevance outside a narrow (minded) elite? Un-
1007 fortunately, smart people have wasted their energy on academic battles, but
1008 we argue that the core of these issues is *research conduct* and *communication*.
1009 When planning a research endeavor, it is essential that the methodology sup-
1010 ports the aims set out for the research. When reviewing a manuscript, it is
1011 important to assess it based on its primary claims of contributions.

1012 In our analysis of the three research methodologies and their feasibility
1013 for software engineering research, we first observe their similarity. All three
1014 match the general research cycle *describe—solve—practice*, as discussed in
1015 Section 2 and illustrated in Figure 2. They also, in one way or another, em-
1016 brace the *knowledge or theory building* activity [12] included in engineering
1017 research, in contrast to engineering practice, where the primary focus is to
1018 solve a problem rather than understanding why the solution works. Design,
1019 change, improvement, transfer, or action are also common elements of the
1020 three methodologies. However, what differs between them is what they put
1021 forward as primary versus secondary objectives and outcomes, as demon-
1022 strated in the comparison in Section 7.1. The roles in the collaboration
1023 between researchers and practitioners are also different.

1024 We observe that AR and TTRM primarily focus on change, while DSM
1025 primarily aims for more generalized design knowledge. Consequently, AR

1026 and TTRM implicitly address one case at a time – although examples of
1027 AR studies with two companies exist [79, 80] – while DSM involves multi-
1028 ple cases for generalization. Furthermore, AR stresses the highly integrated
1029 action team of researchers and practitioners, while in TTRM, they jointly
1030 derive knowledge for practitioners to use in their improvement actions. DSM
1031 separates the roles even more in its aim for generalized design knowledge,
1032 although it is derived and validated in specific collaboration settings.

1033 In an attempt to combine the aims on equal terms, Wieringa’s technical
1034 action research [66] includes one engineering cycle and one knowledge cycle,
1035 corresponding to AR and DSM, respectively. Similarly, Garousi et al.[87]
1036 conducted what they label an AR project, “[u]sing the systematic guidelines
1037 for technology transfer provided by Gorschek et al.” However, these hybrid
1038 approaches risk blurring the primary goal and contribution.

1039 To properly guide the research conduct in industry–academia collabora-
1040 tion and to communicate the outcomes to researchers and practitioners,
1041 we, therefore, advice researchers to select research methodology according to
1042 their *main goal* of the research. It also helps peer reviewers to assess the
1043 contribution properly.

1044 We hope that our guidance, based on an in–depth analysis of the method-
1045 ologies, will add clarity. Maybe it can encourage some researchers to leave
1046 the comfort zone of their favorite methodology, and adopt something new,
1047 that better fits the main goal of their research?

1048 8. Conclusion

1049 The selection of appropriate research methodologies in solution–oriented
1050 software engineering research in close collaboration between industry and
1051 academia is essential. The selection of a research methodology should help
1052 ensuring successful collaborative research between industry and academia. It
1053 is vital both for the research conduct and the communication of its results.
1054 As software engineering is inter–disciplinary, methodological influences come
1055 from different disciplines, and may be used and referred to in different ways.

1056 We selected three methodologies to bring clarity about research method-
1057 ologies and provide guidance for their selection in industry–academia collabora-
1058 tion. They are used in software engineering and cover various character-
1059 istics, namely DSM, AR and TTRM, and they were analyzed theoretically,
1060 using thematic synthesis.

1061 The research methodologies can all be characterized (RQ1) as cyclic re-
1062 search processes, aligning to the general research cycle of *describe—solve—*
1063 *practice*.

1064 The second research question (RQ2) encompasses both similarities and
1065 differences. Concerning similarities, the methodologies are similar in address-
1066 ing generalized learning or theorizing in the collaboration between researchers
1067 and practitioners, although in different forms, using different terminology.
1068 All methodologies have been used in software engineering research. It is also
1069 worth noting that the same methods for data collection (for example, surveys
1070 and observations) and analysis (statistical modeling and thematic analysis)
1071 may be used in all of the methodologies.

1072 When it comes to differences, the three methodologies differ in their pri-
1073 mary objective: DSM on acquiring design knowledge through the design of
1074 artifacts, AR on change in socio-technical systems, and TTRM on the trans-
1075 fer of research to industry. The primary objective of one methodology may
1076 be a secondary objective in another. Thus, the differences between them are
1077 more in their focus than in which activities they include.

1078 In our analysis and comparison of their feasibility for industry-academia
1079 collaboration in software engineering research, the selection depends on the
1080 primary objective and scope of the research (RQ3). We, therefore, advice
1081 researchers to consider the objectives of their software engineering research
1082 endeavor and select an appropriate methodological frame accordingly. Fur-
1083 thermore, we recommend studying different sources of information concern-
1084 ing, in particular, the chosen research methodology to better understand the
1085 methodology before using it when conducting industry-academia collabora-
1086 tive research.

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1092 **Appendix A. Supplementary data**

1093 A link to supplementary material, related to the Design Research Method-
1094 ology, can be found in this section in the online version of the article at: **Link**

1095 to be provided by Elsevier

1096

1097 References

- 1098 [1] T. S. Kuhn, *The Structure of Scientific Revolutions*, The University of
1099 Chicago Press, 1962.
- 1100 [2] P. Offermann, O. Levina, M. Schönherr, U. Bub, Outline of a design
1101 science research process, in: *Proceedings International Conference on*
1102 *Design Science Research in Information Systems and Technology*, ACM,
1103 2009, pp. 1–11.
- 1104 [3] R. J. Wieringa, *Design Science Methodology for Information Systems*
1105 *and Software Engineering*, Springer Berlin Heidelberg, 2014.
- 1106 [4] R. L. Baskerville, T. Wood-Harper, Diversity in information systems
1107 action research methods, *European Journal of Information Systems* 7
1108 (1998) 90–107.
- 1109 [5] M. Staron, *Action Research in Software Engineering - Theory and Ap-*
1110 *plications*, Springer, 2020.
- 1111 [6] T. Gorschek, C. Wohlin, Requirements abstraction model, *Requirements*
1112 *Engineering Journal* 11 (2006) 79–101.
- 1113 [7] T. Gorschek, K. Wnuk, Third generation industrial co-production in
1114 software engineering, in: M. Felderer, G. H. Travassos (Eds.), *Contem-*
1115 *porary Empirical Methods in Software Engineering*, Springer, 2020, pp.
1116 503–525.
- 1117 [8] M. Shaw, Prospects for an engineering discipline of software, *IEEE*
1118 *Software* 7 (1990) 15–24.
- 1119 [9] M. Shaw, Research toward an engineering discipline for software, in:
1120 G. Roman, K. J. Sullivan (Eds.), *Proceedings Workshop on the Future*
1121 *of Software Engineering Research*, ACM, 2010, pp. 337–342.
- 1122 [10] R. Wieringa, Design science as nested problem solving, in: *Proceed-*
1123 *ings International Conference on Design Science Research in Information*
1124 *Systems and Technology*, ACM, 2009, pp. 8:1–8:12.

- 1125 [11] N. M. Agnew, S. W. Pyke, *The Science Game – An Introduction to*
1126 *Research in the Social Sciences*, Oxford University Press, 7th edition,
1127 2007.
- 1128 [12] J. R. Venable, The role of theory and theorising in design science re-
1129 search, in: *Proceedings Design Science Research in Information Systems*
1130 *and Technology*, Curtin Research Publications, 2006, pp. 1–18.
- 1131 [13] V. Garousi, K. Petersen, B. Ozkan, Challenges and best practices in
1132 industry-academia collaborations in software engineering: A systematic
1133 literature review, *Information and Software Technology* 79 (2016) 106–
1134 127.
- 1135 [14] J. Brings, M. Daun, S. Brinckmann, K. Keller, T. Weyer, Approaches,
1136 success factors, and barriers for technology transfer in software engi-
1137 neering – results of a systematic literature review, *Journal of Software:*
1138 *Evolution and Process* 30 (2018) e1981.
- 1139 [15] C. Wohlin, A. Aurum, L. Angelis, L. Phillips, Y. Dittrich, T. Gorschek,
1140 H. Grahn, K. Henningsson, S. Kågström, G. Low, P. Rovegård,
1141 P. Tomaszewski, C. V. Toorn, J. Winter, The success factors power-
1142 ing industry-academia collaboration, *IEEE Software* 29 (2012) 67–73.
- 1143 [16] T. Mikkonen, C. Lassenius, T. Männistö, M. Oivo, J. Järvinen, Continu-
1144 ous and collaborative technology transfer: Software engineering research
1145 with real-time industry impact, *Information and Software Technology*
1146 95 (2018) 34–45.
- 1147 [17] K. Beckman, N. Coulter, S. Khajenoori, N. R. Mead, Collaborations:
1148 closing the industry-academia gap, *IEEE Software* 14 (1997) 49–57.
- 1149 [18] A. Sandberg, L. Pareto, T. Arts, Agile collaborative research: Action
1150 principles for industry-academia collaboration, *IEEE Software* 28 (2011)
1151 74–83.
- 1152 [19] K. Stol, B. Fitzgerald, The ABC of software engineering research, *ACM*
1153 *Transactions on Software Engineering and Methodology* 27 (2018) 11:1–
1154 11:51.

- 1155 [20] M.-A. Storey, N. A. Ernst, C. Williams, E. Kalliamvakou, The who,
1156 what, how of software engineering research: a socio-technical framework,
1157 *Empirical Software Engineering* 25 (2020) 4097–4129.
- 1158 [21] M. Felderer, G. H. Travassos (Eds.), *Contemporary Empirical Methods*
1159 *in Software Engineering*, Springer, 2020.
- 1160 [22] F. Shull, J. Singer, D. I. K. Sjøberg (Eds.), *Guide to Advanced Empirical*
1161 *Software Engineering*, Springer, 2008.
- 1162 [23] P. Runeson, M. Höst, A. Rainer, B. Regnell, *Case Study Research in*
1163 *Software Engineering – Guidelines and Examples*, Wiley, 2012.
- 1164 [24] S. Easterbrook, J. Singer, M.-A. Storey, D. Damian, Selecting empiri-
1165 cal methods for software engineering research, in: F. Shull, J. Singer,
1166 D. I. K. Sjøberg (Eds.), *Guide to Advanced Empirical Software Engi-*
1167 *neering*, Springer London, London, 2008, pp. 285–311.
- 1168 [25] C. Wohlin, A. Aurum, Towards a decision-making structure for selecting
1169 a research design in empirical software engineering, *Empirical Software*
1170 *Engineering* 20 (2015) 1427–1455.
- 1171 [26] L. Briand, D. Bianculli, S. Nejati, F. Pastore, M. Sabetzadeh, The
1172 case for context-driven software engineering research: Generalizability
1173 is overrated, *IEEE Software* 34 (2017) 72–75.
- 1174 [27] V. Basili, L. Briand, D. Bianculli, S. Nejati, F. Pastore, M. Sabetzadeh,
1175 *Software engineering research and industry: A symbiotic relationship to*
1176 *foster impact*, *IEEE Software* 35 (2018) 44–49.
- 1177 [28] P. Runeson, S. Minör, J. Svenér, Get the cogs in synch – time horizon
1178 aspects of industry–academia collaboration, in: *International Workshop*
1179 *on Long-term Industrial Collaboration on Software Engineering*, ACM,
1180 2014, pp. 25–28.
- 1181 [29] C. Wohlin, E. Mendes, K. R. Felizardo, M. Kalinowski, Challenges and
1182 recommendations to publishing and using credible evidence in software
1183 engineering, *Information and Software Technology* 127 (2020) 106366.
- 1184 [30] K.-J. Stol, P. Ralph, B. Fitzgerald, Grounded theory in software engi-
1185 neering research: A critical review and guidelines, in: *Proceedings Inter-*
1186 *national Conference on Software Engineering*, ACM, 2016, pp. 120–131.

- 1187 [31] H. Sharp, Y. Dittrich, C. R. B. de Souza, The role of ethnographic stud-
1188 ies in empirical software engineering, *IEEE Transactions on Software*
1189 *Engineering* 42 (2016) 786–804.
- 1190 [32] D. S. Cruzes, T. Dybå, P. Runeson, M. Höst, Case studies synthesis: A
1191 thematic, cross-case, and narrative synthesis worked example, *Empirical*
1192 *Software Engineering* 20 (2015) 1634–1665.
- 1193 [33] R. M. Davison, M. G. Martinsons, N. Kock, Principles of canonical
1194 action research, *Information Systems Journal* 14 (2004) 65–86.
- 1195 [34] R. L. Baskerville, What design science is not, *European Journal of*
1196 *Information Systems* 17 (2008) 441–443.
- 1197 [35] J. Iivari, J. Venable, Action research and design science research - seem-
1198 ingly similar but decisively dissimilar, in: S. Newell, E. A. Whitley,
1199 N. Pouloudi, J. Wareham, L. Mathiassen (Eds.), *Proceedings European*
1200 *Conference on Information Systems*, Association for Information Sys-
1201 tems, 2009, pp. 1642–1653.
- 1202 [36] A. R. Hevner, S. T. March, J. Park, S. Ram, Design science in informa-
1203 tion systems research, *MIS Quarterly* 28 (2004) 75–105.
- 1204 [37] J. E. van Aken, Management research based on the paradigm of the
1205 design sciences: The quest for field-tested and grounded technological
1206 rules: Paradigm of the design sciences, *Journal of Management Studies*
1207 41 (2004) 219–246.
- 1208 [38] P. Runeson, E. Engström, M.-A. Storey, The design science paradigm
1209 as a frame for empirical software engineering, in: M. Felderer, G. H.
1210 Travassos (Eds.), *Contemporary Empirical Methods in Software Engi-*
1211 *neering*, Springer, 2020, pp. 129–149.
- 1212 [39] E. Engström, M.-A. Storey, P. Runeson, M. Höst, M. T. Baldassarre,
1213 How software engineering research aligns with design science: A review,
1214 *Empirical Software Engineering* 25 (2020) 2630–2660.
- 1215 [40] H. A. Simon, *The Sciences of the Artificial*, MIT Press, 1969.
- 1216 [41] K. Peffers, T. Tuunanen, M. A. Rothenberger, S. Chatterjee, A design
1217 science research methodology for information systems research, *Journal*
1218 *of Management Information Systems* 24 (2007) 45–77.

- 1219 [42] P. Offermann, S. Blom, M. Schönherr, U. Bub, Artifact types in infor-
1220 mation systems design science – a literature review, in: R. Winter, J. L.
1221 Zhao, S. Aier (Eds.), *Global Perspectives on Design Science Research*,
1222 Springer Berlin Heidelberg, 2010, pp. 77–92.
- 1223 [43] V. Garousi, M. Felderer, M. V. Mäntylä, Guidelines for including grey
1224 literature and conducting multivocal literature reviews in software en-
1225 gineering, *Information and Software Technology* 106 (2019) 101–121.
- 1226 [44] B. A. Kitchenham, D. Budgen, P. Brereton, *Evidence-Based Software
1227 Engineering and Systematic Reviews*, Chapman and Hall/CRC, 2015.
- 1228 [45] J. Kontio, J. Bragge, L. Lehtola, The focus group method as an empirical
1229 tool in software engineering, in: F. Shull, J. Singer, D. I. K. Sjøberg
1230 (Eds.), *Guide to Advanced Empirical Software Engineering*, Springer
1231 London, London, 2008, pp. 93–116.
- 1232 [46] P. Runeson, M. Höst, Guidelines for conducting and reporting case
1233 study research in software engineering, *Empirical Software Engineering*
1234 14 (2009) 131–164.
- 1235 [47] N. H. Thuan, A. Drechsler, P. Antunes, Construction of design science
1236 research questions, *Communications of the Association for Information
1237 Systems* 44 (2019) 332–363.
- 1238 [48] P. Johannesson, E. Perjons, *An Introduction to Design Science*,
1239 Springer, 2014.
- 1240 [49] C. Wohlin, P. Runeson, M. Höst, M. C. Ohlsson, B. Regnell, A. Wesslén,
1241 *Experimentation in Software Engineering*, Springer, 2012.
- 1242 [50] C. Wohlin, Guidelines for snowballing in systematic literature stud-
1243 ies and a replication in software engineering, in: *Proceedings Interna-
1244 tional Conference on Evaluation and Assessment in Software Engineer-
1245 ing*, ACM, 2014, p. 38.
- 1246 [51] C. Wohlin, A. Rainer, Guidelines for the search strategy to update
1247 systematic literature reviews in software engineering, *Information and
1248 Software Technology* 134 (2021) 106555.

- 1249 [52] K. Stol, B. Fitzgerald, Guidelines for conducting software engineering
1250 research, in: M. Felderer, G. H. Travassos (Eds.), *Contemporary Empirical Methods in Software Engineering*, Springer, Cham, 2020, pp. 27–63.
1251
- 1252 [53] R. J. Wieringa, Design science methodology: principles and practice,
1253 in: J. Kramer, J. Bishop, P. T. Devanbu, S. Uchitel (Eds.), *Proceedings International Conference on Software Engineering*, ACM, 2010, pp. 493–
1254 494.
1255
- 1256 [54] D. Méndez Fernández, B. Penzenstadler, Artefact-based requirements
1257 engineering: the AMDiRE approach, *Requirements Engineering 20*
1258 (2015) 405–434.
- 1259 [55] A. Morali, R. J. Wieringa, Risk-based confidentiality requirements spec-
1260 ification for outsourced IT systems, in: *Proceedings International Re-*
1261 *quirements Engineering Conference*, IEEE Computer Society, 2010, pp.
1262 199–208.
- 1263 [56] T. O. A. Lehtinen, M. Mäntylä, J. Vanhanen, Development and evalua-
1264 tion of a lightweight root cause analysis method (ARCA method) - field
1265 studies at four software companies, *Information and Software Technol-*
1266 *ogy 53* (2011) 1045–1061.
- 1267 [57] E. Bjarnason, H. Sharp, B. Regnell, Improving requirements-test align-
1268 ment by prescribing practices that mitigate communication gaps, *Em-*
1269 *pirical Software Engineering 24* (2019) 2364–2409.
- 1270 [58] C. R. Gumiran, J. M. Gumiran, Applying design science research in the
1271 development of human resource record management system with pre-
1272 dictive analysis through pointing system, in: *Proceedings International*
1273 *Conference on Software and Computer Applications*, ACM, 2019, pp.
1274 243–247.
- 1275 [59] P. Pickerill, H. J. Jungen, M. Ochodek, M. Mackowiak, M. Staron,
1276 PHANTOM: curating GitHub for engineered software projects using
1277 time-series clustering, *Empirical Software Engineering 25* (2020) 2897–
1278 2929.
- 1279 [60] E. Bjarnason, K. Smolander, E. Engström, P. Runeson, A theory of dis-
1280 tances in software development, *Information and Software Technology*
1281 *70* (2016) 204–219.

- 1282 [61] K. Lewin, Action research and minority problems, *Journal of Social*
1283 *Issues* 2 (1946) 34–46.
- 1284 [62] G. I. Susman, R. D. Evered, An assessment of the scientific merits of
1285 action research, *Administrative Science Quarterly* 23 (1978) 582–603.
- 1286 [63] I. Chein, S. W. Cook, J. Harding, The field of action research, *American*
1287 *Psychologist* 3 (1948) 43–50.
- 1288 [64] T. Wood-Harper, Research methods in information systems: Using
1289 action research, in: E. Mumford, R. A. Hirschheim, G. Fitzgerald,
1290 T. Wood-Harper (Eds.), *Research Methods in Information Systems*, El-
1291 *sevier Science Publishers B.V., North-Holland*, 1985, pp. 161–180.
- 1292 [65] P. S. M. dos Santos, G. H. Travassos, Action research can swing the
1293 balance in experimental software engineering, in: M. V. Zelkowitz (Ed.),
1294 *Advances in Computers*, volume 83, Elsevier, 2011, pp. 205–276.
- 1295 [66] R. J. Wieringa, A. Morali, Technical action research as a validation
1296 method in information systems design science, in: *Proceedings Design*
1297 *Science Research in Information Systems. Advances in Theory and Prac-*
1298 *tice*, Springer, Berlin, Heidelberg, 2012, pp. 220–238.
- 1299 [67] P. Järvinen, Action research is similar to design science, *Quality &*
1300 *Quantity* 41 (2007) 37–54.
- 1301 [68] S. Kemmis, R. McTaggart, *The Action Research Planner*, Action re-
1302 *search and the critical analysis of pedagogy*, Deakin University, 1988.
- 1303 [69] C. Andersson, P. Runeson, A spiral process model for case studies on
1304 software quality monitoring - Method and metrics, *Software Process*
1305 *Improvement and Practice* 12 (2007) 125–140.
- 1306 [70] B. W. Boehm, A spiral model of software development and enhance-
1307 ment, *IEEE Computer* 21 (1988) 61–72.
- 1308 [71] R. L. Baskerville, Investigating information systems with action re-
1309 search, *Communications of the Association for Information Systems*
1310 2:19 (1999) 2–31.

- 1311 [72] C. Wohlin, D. Smite, N. B. Moe, A general theory of software engi-
1312 neering: Balancing human, social and organizational capitals, *Journal*
1313 *of Systems and Software* 109 (2015) 229–242.
- 1314 [73] K. Petersen, C. Gencel, N. Asghari, D. Baca, S. Betz, Action research as
1315 a model for industry-academia collaboration in the software engineering
1316 context, in: *Proceedings International Workshop on Long-Term Indus-*
1317 *trial Collaboration on Software Engineering*, ACM, 2014, pp. 55–62.
- 1318 [74] V. Garousi, M. Borg, M. Oivo, Practical relevance of software engineer-
1319 ing research: synthesizing the community’s voice, *Empirical Software*
1320 *Engineering* 25 (2020) 1687–1754.
- 1321 [75] J. C. Carver, R. Prikładnicki, Industry–academia collaboration in soft-
1322 ware engineering, *IEEE Software* 35 (2018) 120–124.
- 1323 [76] C. B. Seaman, Qualitative methods in empirical studies of software
1324 engineering, *IEEE Transactions on Software Engineering* 25 (1999) 557–
1325 572.
- 1326 [77] J. E. Hannay, D. I. K. Sjøberg, T. Dybå, A systematic review of theory
1327 use in software engineering experiments, *IEEE Transactions on Software*
1328 *Engineering* 33 (2007) 87–107.
- 1329 [78] K. Stol, B. Fitzgerald, Theory-oriented software engineering, *Science of*
1330 *Computer Programming* 101 (2015) 79–98.
- 1331 [79] M. Staron, M. Ochodek, W. Meding, O. Söder, Using machine learning
1332 to identify code fragments for manual review, in: *Proceedings Euromicro*
1333 *Conference on Software Engineering and Advanced Applications*, IEEE,
1334 2020, pp. 513–516.
- 1335 [80] M. Ochodek, R. Hebig, W. Meding, G. Frost, M. Staron, Recognizing
1336 lines of code violating company-specific coding guidelines using machine
1337 learning, *Empirical Software Engineering* 25 (2020) 220–265.
- 1338 [81] M. Choras, T. Springer, R. Kozik, L. López, S. Martínez-Fernández,
1339 P. Ram, P. Rodríguez, X. Franch, Measuring and improving agile pro-
1340 cesses in a small-size software development company, *IEEE Access* 8
1341 (2020) 78452–78466.

- 1342 [82] M. Razavian, P. Lago, A lean and mean strategy: a data migration
1343 industrial study, *Journal of Software: Evolution and Process* 26 (2014)
1344 141–171.
- 1345 [83] A. Ananjeva, J. S. Persson, A. Bruun, Integrating UX work with agile
1346 development through user stories: An action research study in a small
1347 software company, *Journal of Systems and Software* 170 (2020) 110785.
- 1348 [84] T. Gorschek, P. Garre, S. Larsson, C. Wohlin, A model for technology
1349 transfer in practice, *IEEE Software* 23 (2006) 88–95.
- 1350 [85] N. B. Ali, K. Petersen, C. Wohlin, A systematic literature review on the
1351 industrial use of software process simulation, *Journal of Systems and
1352 Software* 97 (2014) 65–85.
- 1353 [86] T. Gorschek, P. Garre, S. Larsson, C. Wohlin, Industry evaluation of
1354 the requirements abstraction model, *Requirements Engineering Journal*
1355 12 (2007) 163–190.
- 1356 [87] V. Garousi, R. Özkan, A. Betin-Can, Multi-objective regression test se-
1357 lection in practice: An empirical study in the defense software industry,
1358 *Information and Software Technology* 103 (2018) 40–54.
- 1359 [88] F. G. de Oliveira Neto, A. Ahmad, O. Leifler, K. Sandahl, E. Enoiu,
1360 Improving continuous integration with similarity-based test case selec-
1361 tion, in: *Proceedings International Workshop on Automation of Soft-
1362 ware Test*, ACM, 2018, pp. 39–45.
- 1363 [89] R. Torkar, P. Minoves, J. Garrigós, Adopting free/libre/open source
1364 software practices, techniques and methods for industrial use, *Journal
1365 of the Association for Information Systems* 12 (2011) 88–122.
- 1366 [90] M. Borg, K. Wnuk, B. Regnell, P. Runeson, Supporting change impact
1367 analysis using a recommendation system: An industrial case study in a
1368 safety-critical context, *IEEE Transactions on Software Engineering* 43
1369 (2017) 675–700.
- 1370 [91] L. Briand, D. Falessi, S. Nejati, M. Sabetzadeh, T. Yue, Research-
1371 based innovation: A tale of three projects in model-driven engineering,

- 1372 in: R. B. France, J. Kazmeier, R. Brey, C. Atkinson (Eds.), Proceed-
1373 ings Model Driven Engineering Languages and Systems, Springer Berlin
1374 Heidelberg, 2012, pp. 793–809.
- 1375 [92] A. Pochyly, T. Kubela, M. Kozak, P. Cihak, Robotic vision for bin-
1376 picking applications of various objects, in: Proceedings International
1377 Symposium on Robotics) and German Conference on Robotics), pp. 1–
1378 5.
- 1379 [93] D. Méndez Fernández, J.-H. Passoth, Empirical software engineering:
1380 From discipline to interdiscipline, *Journal of Systems and Software* 148
1381 (2019) 170–179.

1382 **Appendix A: DRM - Design Research Methodology**

1383 This appendix provides an overview and discussion of the Design Re-
1384 search Methodology (DRM). Furthermore, DRM is compared with the three
1385 research methodologies presented in the main article, i.e. Design Science
1386 Methodology (DSM), Action Research (AR) and the Technology Transfer
1387 Research Methodology (TTRM).

1388 DRM is provided as an add-on here based on that we view software engi-
1389 neering as an engineering discipline. Thus, we looked at research methodolo-
1390 gies in other engineering disciplines. The research methodology that stood
1391 out when looking at the literature and discussing research methodologies
1392 with engineering colleagues was the Design Research Methodology (DRM).
1393 Hence, it was included among the methodologies analyzed and compared.
1394 However, due to space constraints and the limited use of DRM in software
1395 engineering, we provide it as complementary material.

1396 *A1. Overview of Design Research Methodology*

1397 Blessing and Chakrabarti present the Design Research Methodology (DRM)
1398 for research on various kinds of design of products [1]. The design research
1399 methodology is design-oriented but is grounded in engineering and particu-
1400 lar product design, development and innovation. Blessing and Chakrabarti
1401 point to three issues in design research: “i) a lack of overview of existing
1402 research, ii) a lack of use of the research in practice, and iii) a lack of scien-
1403 tific rigor.” According to Blessing and Chakrabarti [1], the main objective
1404 of DRM is to address the lack of scientific rigor. They believe that address-
1405 ing the issue concerning scientific rigor will also contribute to addressing the
1406 two other issues. The book by Blessing and Chakrabarti [1] is classified as
1407 a book in mechanical engineering by the publisher. Design of products is
1408 defined as “those activities that actually generate and develop a product
1409 from a need, product idea or technology to the full documentation needed to
1410 realize the product and to fulfill the perceived needs of the user and other
1411 stakeholders.” [1]. Three questions define the overall aims:

- 1412 • What do we mean by a successful product?
- 1413 • How is a successful (or unsuccessful) product created?
- 1414 • How do we improve the chances of being successful?

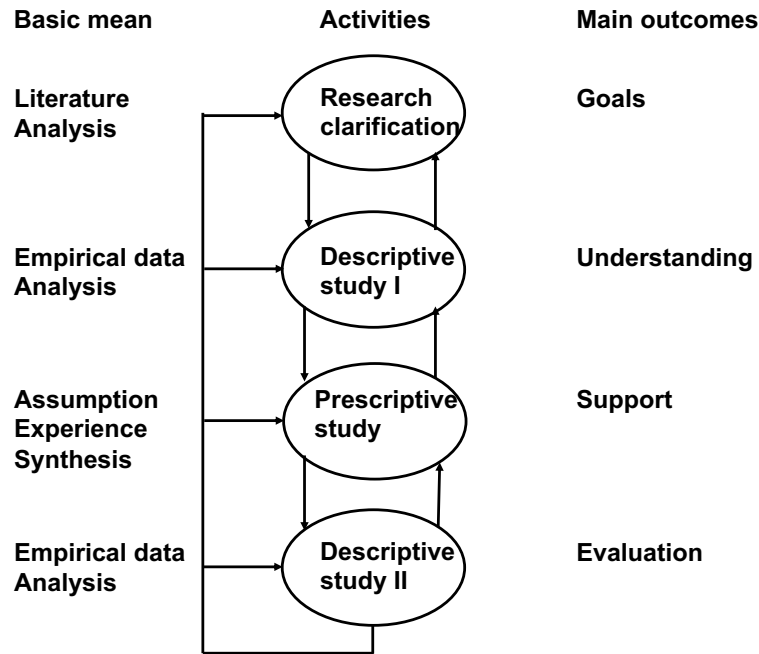


Figure 8: DRM adapted from the book by Blessing and Chakrabarti [1].

1415 The design research methodology is iterative over four stages 1) Research
 1416 Clarification for the setting goals, 2) Descriptive Study I to increase the
 1417 understanding of the research challenge, 3) Prescriptive Study for supporting
 1418 the product design, and 4) Descriptive Study II for evaluation of the outcome.
 1419 The stages with the basic means to obtain the outcomes in each stage and
 1420 the primary outcomes are illustrated in Figure 8.

1421 Furthermore, three types of studies are defined: *review-based*, *comprehen-*
 1422 *sive* and *initial*. The review-based study focuses on conducting a literature
 1423 review. The comprehensive study includes both a literature review and a
 1424 study where the researchers produce results, for example, an empirical study.
 1425 From a usage point of view, the initial study closes a research project and
 1426 is focused on illustrating the consequences of the findings and preparing the
 1427 findings for use by others. Thus, the word “initial” refers to the initial appli-
 1428 cation of the solution and not the initial research. The research clarification
 1429 stage is typically conducted as a review-based study. The other stages could
 1430 be of different types. Overall, Blessing and Chakrabarti [1] describe seven
 1431 types of design of research projects where the four stages are conducted in

1432 different ways using the three types of studies. The seven types of design are
 1433 listed in Table 2.

Table 2: The seven design types in DRM.

Research clarification	Descriptive study I	Prescriptive study	Descriptive study II
1. Review-based	Comprehensive		
2. Review-based	Comprehensive	Initial	
3. Review-based	Review-based	Comprehensive	Initial
4. Review-based	Review-based	Review-based Initial/ Comprehensive	Comprehensive
5. Review-based	Comprehensive	Comprehensive	Initial
6. Review-based	Review-based	Comprehensive	Comprehensive
7. Review-based	Comprehensive	Comprehensive	Comprehensive

1434 The rows in Table 2 should be interpreted as follows:

- 1435 • Design types 1-3 and 5 are conducted from left to right without itera-
 1436 tions.
- 1437 • Design type 4 includes an iteration from the Comprehensive study con-
 1438 ducted in the Descriptive study II activity to the Descriptive study
 1439 when either an Initial or Comprehensive study is undertaken. It is
 1440 then followed by revisiting the Descriptive study II stage.
- 1441 • Design types 6 and 7 includes more iterations. From the Comprehen-
 1442 sive study in the Descriptive study II stage, we may go back to either
 1443 Descriptive study I or the Prescriptive study stage and then continue
 1444 with the following stages and iterate until no further improvements of
 1445 the solution are envisioned.

1446 DRM includes many alternatives with its four stages and three study
 1447 types, particularly when including the possibility of iterations. Motivations
 1448 for the seven design types and further information about the use of DRM are
 1449 provided in Blessing and Chakrabarti [1].

1450 Blessing and Chakrabarti [1] describe how the first four design types
 1451 of research projects in Figure 8 are particularly suitable for PhD projects.
 1452 Based on their experience, types 2 and 3 are the most common. Design types
 1453 5 and 6 include two comprehensive studies, and based on their experience, it
 1454 is most often a too large undertaking for a PhD project. Even if the aim is
 1455 types 5 and 6, they mostly end up being of type 2 or type 3. Type 7 includes

1456 three comprehensive studies, which may be more suitable for a research team
1457 than for an individual researcher or when the scope is very specific.

1458 Furthermore, Blessing and Chakrabarti [1] also introduce two types of
1459 models: the *reference model* and the *impact model*. The reference model is
1460 intended to represent the current state, i.e. before conducting the research,
1461 while the impact model illustrates the desired state after the research. Both
1462 models are revised as the understanding of the research context increases and
1463 the solution is evolving.

1464 In summary, the design research methodology involves a combination of
1465 stages, different types of studies, including combining them in different ways,
1466 and models to capture the state of the situation both before and after the
1467 research.

1468 *A2. DRM for industry–academia collaboration in software engineering*

1469 The Design Research Methodology is a methodology for a research project
1470 rather than a methodology for a research study. Blessing and Chakrabarti [1]
1471 discuss, for example, the use of the research methodology for a PhD student
1472 and hence outlining the research work during the PhD studies. Blessing
1473 and Chakrabarti [1] highlight the lack of use of research in practice (see
1474 Section A.1). Thus, their standpoint is that DRM is well suited to be used
1475 in industry–academia collaborative research. DRM is easily mapped to the
1476 general research cycle for engineering in Figure 2. Hence, it is straightforward
1477 to map it to the describe–solve–practice activities used in the main article.
1478 DRM starts with setting the goals and creating an understanding of the
1479 problem at hand, as shown in Figure 8, which is well-aligned with describing
1480 the current situation. It is followed by a prescriptive study (support), which
1481 concerns the development of a solution, which relates to solve. Finally, the
1482 solution is evaluated, which maps directly to the general problem-solving
1483 cycle.

1484 Blessing and Chakrabarti [1] compare DRM with a DRM predecessor by
1485 Duffy and Andreasen [2] and to the soft systems methodology introduced by
1486 Checkland [3]. The latter is described as action research by Blessing and
1487 Chakrabarti. The main difference, according to them, is the focus of action
1488 research in being on-site evaluation, which results in more local solutions vs
1489 providing more general solutions using DRM.

1490 From a software engineering perspective, DRM may be applied as de-
1491 scribed by Blessing and Chakrabarti [1]. However, it does require that solu-
1492 tions, to a large extent, can be evaluated in the research environment. The

1493 main reason being that the objective is to provide more general solutions,
1494 as highlighted by Blessing and Chakrabarti [1] when comparing to the soft
1495 systems methodology [3].

1496 In many cases, this may be challenging in software engineering, where
1497 improvements often relate to the software development process. Given that
1498 DRM primarily was developed for product design, there is a need to consider
1499 how it is best applied in software engineering, particularly in research con-
1500 ducted in close collaboration between industry and academia. In a software
1501 engineering context, new research solutions will inevitably interact with other
1502 parts of the processes, methods and tools used in practice. Consequently, the
1503 effect of new research solutions most often need to be evaluated in a broader
1504 and more realistic context than what can be done in the research environment
1505 as such.

1506 The application of DRM in software engineering is limited so far. A search
1507 on Google Scholar resulted in identifying only one paper. It was a paper by
1508 Eklund and Bosch on open software ecosystems for embedded systems [4].
1509 Each of the four stages in DRM is addressed in separate sections in the paper
1510 by Eklund and Bosch [1].

1511 In addition to being used on its own in software engineering, DRM may
1512 potentially be combined with other research methodologies for research stud-
1513 ies. This is further elaborated in Section 7 in the main article, where the
1514 different research methodologies are compared, and possibilities for combing
1515 research methodologies are discussed.

1516 *A3. Comparison of Design Research Methodology*

1517 This section is best read together with Section 7 on comparing the re-
1518 search methodologies in the main article.

1519 The primary objective of DRM is as follows:

- 1520 • Design Research Methodology

1521 The design research methodology emerged from a need to make en-
1522 gineering research more scientific. It is product-oriented, which may
1523 be interpreted as having the design of artifacts as its primary objec-
1524 tive. The methodology is focused on general solutions developed by
1525 conducting several studies with different objectives.

1526 DRM is suitable if the primary objective is a general solution to a research
1527 problem, although being identified in a collaborative effort between industry

	DSM	AR	TTM/TTRM	DRM
<i>Origin</i>	Multiple (via IS)	Social science (via IS)	Software engineering	Mechanical engineering
<i>Main outcome</i>	Design knowledge	Change	Knowledge transfer	Engineering knowledge
<i>Roles</i>	Knowledge vs. change	Integrated action team	Knowledge vs. change	Knowledge vs. change
<i>Driver of literature search</i>	Problem and solution	Diagnosing	State-of-the-art study	Separate or part of problem/solution depending on design type
<i>Learning</i>	Problem and solution theory	Theory as secondary output	Lessons learned	Lessons learned

Table 3: Summary of the comparison between the four research methodologies.

1528 and academia. DRM is particularly suitable if the research contains a series of
1529 studies leading to the general research outcome. In this situation, the design
1530 research methodology may be a good starting point. The main outcome may
1531 be product design knowledge or extended to other types of design.

1532 Table 3 is copied from the main article to simplify the understanding of
1533 DRM in relation to Design Science Methodologies, Action Research and the
1534 Technology Transfer Research Methodology.

1535 Concerning the table, the following specific comments concerning DRM
1536 are provided.

- 1537 • Origin – DRM is an engineering methodology for research on design of
1538 products, primarily in mechanical engineering [1]. While the principles
1539 may apply to any kind of engineering, the mechanical context colors
1540 the methodology.
- 1541 • Main outcome – DSM and DRM both produce design knowledge, i.e.
1542 how to design artifacts and products, respectively.
- 1543 • Roles – DRM address the collaboration between research and prac-
1544 tice, as it aims to produce. As AR and TTM/TTRM, DRM makes a
1545 separation in that a joint team, mostly led by researchers, derive the
1546 knowledge, while the practitioners have the ultimate responsibility for
1547 the change, based on the derived knowledge.
- 1548 • Driver of literature search – Similarly to DSM, DRM, which comes
1549 in different configurations (i.e. design types which are described in
1550 Table 2) opens for “review-based” studies, either as a separate study
1551 to clarify the research needs or as a part of a comprehensive study.

1552 • Learning – DRM explicitly proposes three different publication units:
1553 1) problem identification for practitioners, 2) lab experiments, and 3)
1554 case studies for academics. As for TTM/TTRM, DRM is directed
1555 towards supporting engineering, lessons learned are documented, al-
1556 though it is not prescribed to be expressed in terms of theory.

1557 Finally, it is worth noting that DRM is a framework for a research project,
1558 and thus activities are defined at a level where a research study is an activity.

1559 **References**

- 1560 1. L. T. M. Blessing, A. Chakrabarti, DRM, a Design Research Method-
1561 ology, Springer Publishing Company, Incorporated, 1st edition, 2009.
- 1562 2. A. H. B. Duffy, M. M. Andreasen, Enhancing the evolution of design
1563 science, in: V. Hubka (Ed.), Proceedings of the 10th International
1564 Conference on Engineering Design (ICED), Heurista, Zurich, Switzer-
1565 land,1995, pp. 29–35.
- 1566 3. P. Checkland, Systems Thinking, Systems Practice, John Wiley and
1567 Sons Ltd., Chichester, UK, 1981.
- 1568 4. U. Eklund, J. Bosch, Architecture for embedded open software ecosys-
1569 tems, Journal of Systems and Software 92 (2014) 128–142.