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B. Bafandeh Mayvan , A. Rasoolzadegan , Z. Ghavidel Yazdi

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Highlights

- A comprehensive SMS on the design patterns to identify the related topics and detect trends and gaps.
- There are six main topics in the field of design patterns.
- Developing and Mining are the most active topics.
- Describe the demographics of design patterns research.
- Quantify the research load on the design patterns topics.

The state of the art on design patterns: a systematic mapping of the literature

B. Bafandeh Mayvan^a, A. Rasoolzadegan^{*,a}, Z. Ghavidel Yazdi^b

^aFaculty of Engineering, Ferdowsi University of Mashhad, Mashhad, Iran

^bE-Learning Center, Ferdowsi University of Mashhad, Mashhad, Iran

*Corresponding author: E-mail: rasoolzadegan@um.ac.ir

Abstract— Design patterns are widely used by software developers to build complex systems. Hence, they have been investigated by many researchers in recent decades. This leads to the emergence of various topics in the design patterns field. The objective of this paper is to present an overview of the research efforts on design patterns for those researchers who seek to enter this area. The main contributions are as follows: (a) identifying research topics in design patterns, (b) quantifying the research emphasis on each topic, and (c) describing the demographics of design patterns research. The last secondary study with similar goals in the design patterns field considers the Gang of Four design patterns only. However, the scope of the current study is all of the design patterns. Moreover, our review covers about six additional years and a larger number of publications and venues. In this systematic mapping study, a total of 2775 papers were identified as relevant, and 637 of them were included. According to the results, design patterns can be classified into six different research topics. As a consequence, it is concluded that Pattern Development, Pattern Mining, and Pattern Usage are the most active topics in the field of design patterns.

Keywords

Design patterns, Systematic mapping study, Systematic review

1 INTRODUCTION

Software patterns are solutions to recurring software problems. These solutions are the result of the experiences of experts and can be used over and over again (Gama et al. 1995). Software patterns can be categorized into different classes according to the software development phase. Implementation patterns, testing patterns, analysis patterns, and design patterns (DPs) are some examples of these classes (Hamza 2004).

DPs, such as Gang of Four (GoF), and security DPs, are an active field of research in software engineering (Zhang and Budgen 2012; Zhang and Budgen 2013; Ampatzoglou et al. 2013; Riaz et al. 2015). In recent decades, many articles have been published on DPs topics which contribute to enriching the literature of the field. Hence, performing a comprehensive review and identifying the related themes and detecting trends and gaps in each of them is crucial. In other words, we need a reference guide so that we can conduct an effective investigation into each of the DPs topics and take significant steps to improve and enhance them.

To review the studies carried out in a broad area such as DPs, an advanced search method should be applied. This method should be able to cover this vast area and at the same time it must be reliable, repeatable, impartial, rigorous, and the results should be traceable. Evidence-based software engineering (Dyba et al. 2005) has provided this method. Two well-known methodologies that are provided by evidence-based software engineering are systematic literature review (SLR) and systematic mapping study (SMS) (Kitchenham et al. 2011; Petersen et al. 2015). There are some differences between SLR and SMS (Kitchenham et al. 2010; Kitchenham et al. 2011; Petersen et al. 2015). In general, methodologies for searching and extracting data in SMS and SLR are alike, but data analysis approaches are different, and research questions in SMS are more general than SLR (Kitchenham et al. 2011; Petersen et al. 2015). This is because of the differences between the aim of SMS and SLR. The purpose of SMS is identifying research trend and classifying topics that exist in a research area while SLR tries to find the primary studies and subsequently, extract data from them to answer a

specific research question (Kitchenham et al. 2011). When we intend to identify the scope of a topic and classify the studies that exist in this scope, we should use the mapping study method. Therefore, SMS can provide general information on one topic, and it can be done as a pre-review, before SLR.

In the field of DPs, some secondary studies have reviewed the literature. Among these studies, the only similar work to ours is a systematic mapping study that published in 2013 (Ampatzoglou et al. 2013). However, the scope of our study is all the DPs that exist in the literature, while Ampatzoglou et al. (2013) only considered GoF DPs. Moreover, our paper covers about six additional years, and a larger number of publications and venues. The results show that more than 30% of articles have been carried out from 2010 onwards. These differences make this work substantially different and worth investigation. In the Related Works section, the comparison between our work and other secondary studies in the field has been conducted in detail.

In this paper, an SMS on the literature of DPs has been carried out. This study contributes into providing a taxonomy of the research topics related to DPs as well as a breakdown of papers in each topic. Moreover, the researchers, countries, and publication venues that are active in research related to DPs are identified. Determining the taxonomy and demographics of a particular research topic can provide a useful starting point for other researchers. Therefore, using results that are extracted from this study, we want to present a reference guide for those researchers who seek to enter the DPs field and need to identify research trends and gaps.

The rest of the paper is organized as follows: related works is presented in Section 2. In Section 3, the systematic mapping technique is described. In Section 4, according to the research questions, the results of the systematic map are presented and subsequently in Section 5, the results are discussed. In Section 6, the threats to validity are discussed. Finally, in Section 7, conclusions and future works are presented. Note, we have prepared a document called DPs-SM (Design Patterns-Supplementary Material) to present the details of our SMS. This supplementary material is available on the web¹. Throughout this paper, whenever it is needed, we will refer to this document.

2 RELATED WORKS

Searching on the DPs field, we found a total of four secondary studies that use a systematic method to review the literature (see Table 1). Secondary study replications are valuable because, whenever new evidence is published after the completion of a secondary study, we should update it (Felizardo et al. 2016). In Table 2 we made a comparison between our paper and the other secondary studies in the field. As seen, among these studies, the only work with the same goals is the work of Ampatzoglou et al. (2013). According to Ampatzoglou et al. (2013), topics that exist in the field of DPs are identified and classified. The context of our study is all the DPs that exist in the literature, while Ampatzoglou et al. (2013) only considered GoF DPs. As illustrated in Table 2, our paper compared to other existing works, covers a larger number of publications and venues. In this paper, we present complete results and analysis to those researchers who seek to enter the field of DPs. Hence, as mentioned before, the result of our work can be used as a reference guide. It should be noted that the second goal in the work of Ampatzoglou et al. (2013) is evaluating the effectiveness of GoF DPs on software quality, while this purpose is not considered in our study.

TABLE 1: SYSTEMATIC REVIEWS ON DPs FIELD

| No. | Title | Ref. |
|-----|---|---------------------------|
| 1 | How have we evaluated software pattern application? A systematic mapping study of research design practices | (Riaz et al. 2015) |
| 2 | Research state of the art on GoF design patterns: A mapping study | (Ampatzoglou et al. 2013) |
| 3 | A survey of experienced user perceptions about software design patterns | (Zhang and Budgen 2013) |
| 4 | What Do We Know about the Effectiveness of Software Design Patterns? | (Zhang and Budgen 2012) |

¹ <http://sqlab.um.ac.ir/images/219/files/SQLLabSM.pdf>

TABLE 2: COMPARISON BETWEEN OUR WORK AND OTHER REVIEWS

| Source | Review type | Number of primary studies | Number of considered journals, conferences, and workshops | Time interval | Scope | Goals |
|---------------------------|-------------|---------------------------|---|-----------------------|----------------------------------|---|
| (Riaz et al. 2015) | SMS | 30 | - | up to September 2014 | Software patterns research field | To define the research design of empirical studies which focus on applying software patterns involving human participants. |
| (Zhang and Budgen 2013) | SMS | 10 | - | up to the end of 2007 | GoF DPs research field | To recognize which patterns from the set cataloged by the GoF are considered to be useful and which ones are regarded as not being useful, and why this is so. |
| (Ampatzoglou et al. 2013) | SMS | 118 | 29 | Up to 2010 | GoF DPs research field | To present an overview of the research efforts on GoF DPs. |
| (Zhang and Budgen 2012) | SMS | 10 | - | up to the end of 2009 | GoF DPs research field | To identify how extensively, the DPs usage has been subjected to empirical study and what proof is available about how and when their usage can offer a useful mechanism for knowledge transfer about design. |
| Our study | SMS | 637 | 108 | Up to March 2016 | DPs research field | To provide an overview of the research efforts on DPs for those researchers who seek to enter this field. |

3 RESEARCH METHOD

The review process used in this paper (see Fig. 1) is based on the updated guidelines for performing SMS which is presented by Petersen et al. (2015). In the work of Petersen et al. (2015) the authors conducted an SMS on SMSs in software engineering. Moreover, they presented a set of updated guidelines by considering the lessons learned through their mapping study and the guidelines presented in the work of Kitchenham (2004), Arksey and O'Malley (2005), Biolchini et al. (2005), Kitchenham and Charters (2007), Petersen et al. (2008), and Budgen et al. (2008). In the following sub-sections, the details of our method are discussed.

3.1 Planning the mapping study

In this phase, all the protocols and strategies which are needed for conducting a mapping study should be specified. Below, these protocols and strategies are described.

3.1.1 Specifying the scope and research questions (RQs)

The most important part of a systematic review is specifying the questions we intend to answer in the review process. These questions determine our goals, and the process of reviewing will be progressed by responding to these questions.

This study has been conducted from Jun 2015 until March 2016 and so we considered the studies that have been published until March 2016. The main goal is to identify and categorize research topics that exist in the field of DPs. So, the scope of our research is all the studies which have been conducted in this field. Furthermore, we want to present a reference guide for those who want to be active in the DPs area. Therefore, the research questions have been adjusted to achieve this goal. In the following, the research questions of our mapping study are described.

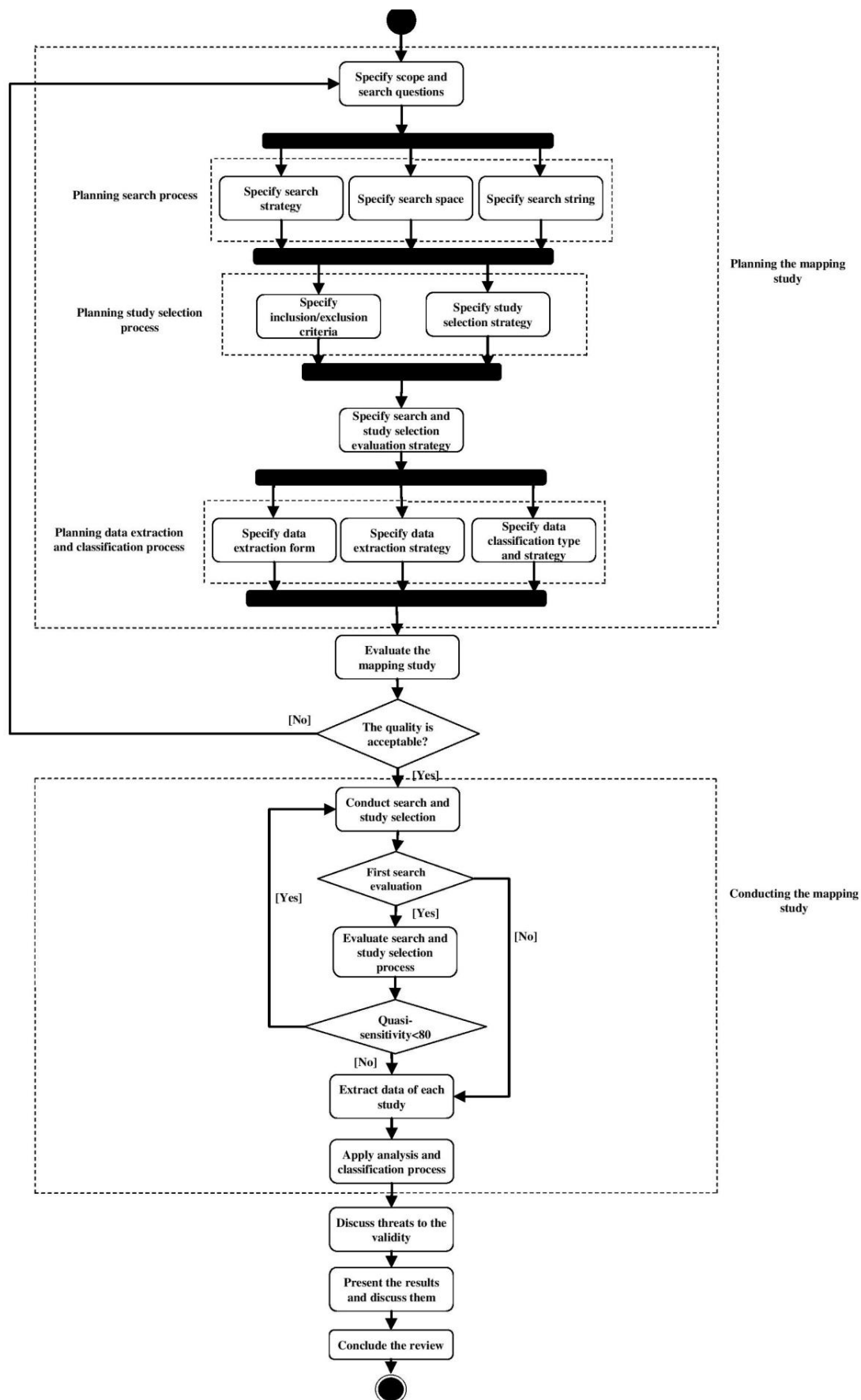


Fig. 1. The review process

RQ1: what are the core research topics in the field of DPs and how much emphasis has been given towards the field? Rational: by answering this question, we intend to meet the following goals: 1) finding out how attractive and important the research field of DPs has been for other scholars, how much work has been done in this area, and what has been the trend of the activity in this field, 2) identifying and classifying themes that exist in the DPs field (using the obtained taxonomy, researchers can explore existing topics and sub-topics in this field), and 3) identifying the trends and gaps in each topic.

RQ2: which countries, researchers, and venues have been more active in the area of DPs? Rational: by answering this question a useful starting point will be provided for other researchers who are interested in this field.

3.1.2 Planning the search process

After specifying scope and research questions, we defined all the protocols and decisions which are relevant to conducting the search process including specifying search strategy, search space, and search string. The descriptions are given below.

3.1.2.1 Specifying the search strategy

For conducting the search, at first, the search strategy should be specified. In this work, we used manual search and backward snowballing (Jalali and Wohlin 2012) for the identification of relevant studies. We should note some points: 1) before starting the process, the set of search spaces (which is, at first, an empty set and will gradually be completed as the search process progresses) should be defined. The members of this set are pairs of “search space” and “related timestamp”. 2) The activity of identifying the related journals, conferences or workshops of newly included papers is not necessary to be conducted after the manual search. Therefore, we have defined a flag named *S_Flag* which is set to one in the backward snowballing step and is set to zero in the second step of the process.

Fig. 2 shows all the steps in our search strategy. This strategy consists of five steps. The description of each step is as follows:

Step 1: at the first step, the initial set of papers should be selected. As described in Section 3.3.1, we reached this set by conducting an informal search.

Step 2: in this step, the related journal, conference or workshop of each included paper should be extracted and compared with members of the search space set. If there is any new journal, conference or workshop, the third step should be executed; otherwise, the fifth step of the search process will follow.

Step 3: the extracted journals, conferences or workshops with the related timestamp (current time) should be added to the search space set, and a manual search on them should be done based on the search string (in order to find more relevant papers).

Step 4: in this step, the study selection process (see Section 3.1.3.2) should be applied. Depending on whether a paper is included or not, and whether the included paper is the result of the backward snowballing step or not, we should end the process or move to step 2, or 5.

Step 5: at the last step, the backward snowballing, which is finding the relevant papers by investigating references of included papers, should be conducted (on those papers which have not been snowballed before). If any new paper is found, the search process continues from step 4. Otherwise, it ends.

Note: our search process has been done from Jun 2015 until March 2016. If during this time interval each search space had been examined only once, in some search spaces new articles which were published after the first manual search would have been ignored. This is a threat to the completeness of the included papers set. To remove this threat, in the third step of the search strategy, a timestamp for each included search space should be inserted. After finishing the search process, the timestamps will be checked. If there exists a case which is greater than or equal to six months passed, the related search space should be investigated again (since the timestamp, until the current time).

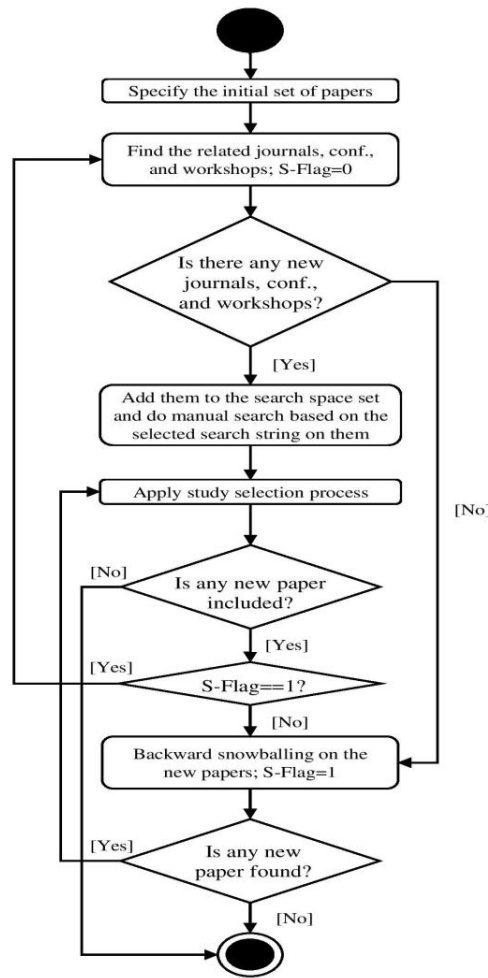


Fig. 2. Search strategy

3.1.2.2 Specifying the search space

According to the search strategy, at the starting point of the search process, the search space set (a set of journals, conferences, and workshops) is empty. After conducting an informal search, some search spaces will be added to the search space set (see Section 3.3.1). This set will be completed with the progress of the search process. In Appendix → Table C and D, the final search space set and related information are shown. More information can be found in DPs-SM → Chapter 1 → Tables 1-3 to 1-7.

3.1.2.3 Specifying the search string

According to the context of our mapping study which is software DPs, we chose “design pattern” as the search string and applied it in the title, abstract, and full text of the papers.

3.1.3 Planning the study selection process

For the study selection, two important tasks should be done. First, inclusion/ exclusion criteria should be specified and second, the strategy of study selection should be defined

3.1.3.1 Specifying the inclusion/exclusion criteria

For the identification of those primary studies that can answer our research questions, we should define two categories of criteria (called study selection criteria). The first category is the inclusion criteria (see Table 3). In the current mapping study, one inclusion criterion is defined. The second category is the exclusion criteria (see Table 4) which exclude those articles that are not desired. If an article has at least one of the exclusion criteria, it will be excluded. In other words, a paper will be included if the inclusion criterion is met and none of the

exclusion criteria is satisfied. Note, according to Table 4, the secondary studies should not be included. However, we considered these studies just to compare them with our study.

Here, the thresholds used for the exclusion criteria are obtained empirically. For selecting the appropriate threshold values, we considered two issues: 1) slight changes in these values should not make many changes in the number of excluded/ included papers and 2) threshold values should be selected in such a way that applying them does not exclude a lot of highly cited papers.

TABLE 3: INCLUSION CRITERIA

| No. | Description |
|-----|---|
| 1 | The focus of the paper is on the software DPs |

TABLE 4: EXCLUSION CRITERIA

| No. | Description |
|-----|---|
| 1 | The study relates to other patterns, not DPs, e.g. architectural patterns |
| 2 | If the study is a journal paper and the related journal is not indexed in the list of ISI journals |
| 3 | If the study is a journal paper and for the related journal ((<i>SJR</i> is not available) or ($SJR \leq 0.4$)) |
| 4 | If the study is a conference paper and for the related conference ($Qualis < B4$) and ($ERA < B$) and ($h5 - index < 10$) and ($Period < 10$) |
| 5 | The study is not a paper, e.g. it is a gray literature, conference cover, poster, etc. |
| 6 | The study is not a primary study, e.g. it is a survey, literature review, etc. |

3.1.3.2 Specifying the study selection strategy

To include relevant papers, we specified the study selection strategy which is shown in Fig. 3. This strategy consists of two evaluation stages. At the first stage, the paper should be evaluated by title, keywords, information of the publication venue, and abstract. At the second stage, the paper should be evaluated by full-text. After each stage, a decision should be made. Note that in each evaluation stage both inclusion and exclusion criteria should be considered. In each stage, meaningful terms and keywords of included papers should be highlighted. This is useful for the classification of these papers.

Each paper should be evaluated by two reviewers (first and third author) separately, and they should check their results with each other at the end. In Table 5, the decisions rules are defined. According to this table, nine states may occur. In the case of “uncertain” condition, one other reviewer (second author) should judge between them. Note, if there is still a disagreement, even after the judgment, the paper should be included.

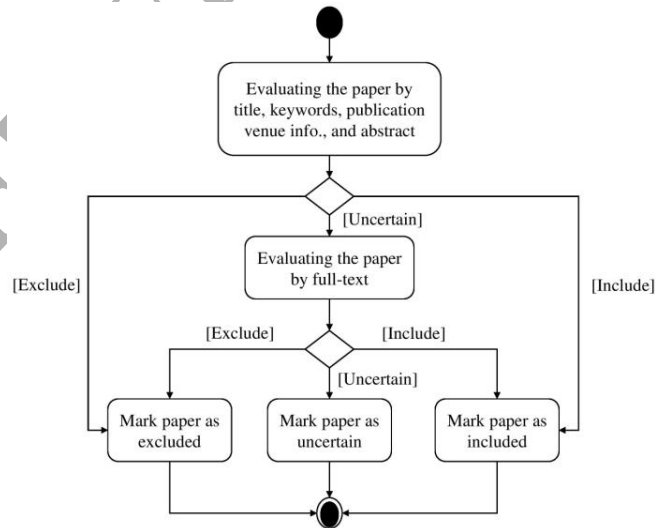


Fig. 3. Study selection strategy

TABLE 5: DECISIONS RULES

| STATE | INCLUDE | EXCLUDE | UNCERTAIN |
|-----------|-----------|-----------|-----------|
| Include | Include | Uncertain | Include |
| Exclude | Uncertain | Exclude | Exclude |
| Uncertain | Include | Exclude | Uncertain |

3.1.4 Specifying the search and the study selection evaluation strategy

Evaluating the search strategy can be done in two ways: 1) subjective evaluation (using the expert review), 2) objective evaluation (using the quantitative criteria). The subjective evaluation could be biased in terms of the expert opinion. Therefore, in this study, we used a quantitative criterion (quasi-sensitivity) to evaluate the search and the study selection process. “Sensitivity” is the proportion of the included studies for a given topic and can be calculated by the following equation:

$$\text{Sensitivity} = (\text{Number of included studies} / \text{Number of studies in a full set of studies}) * 100 \quad (1)$$

However, obtaining a full set of primary studies (gold standard) is almost impossible. So, we used the Quasi-Gold Standard (QGS) to obtain the sensitivity (Zhang et al. 2011). QGS is a set of known studies from key sources, which are recognized by the community in the subject. In this mapping study, to establish the QGS, we got help from eight members of the software quality lab².

The lab members identify some key researchers in the field of DPs, during the informal search from sources such as c2.wiki website, books, courses, and editor-in-chief of journals or conferences. Afterward, referring to web-pages of the key researchers and gathering their related papers (after applying the inclusion and exclusion criteria), the QGS was generated. In Appendix → Table E and Table F, the authors, web-pages, and extracted papers are shown. More information can be found in DPs-SM → Chapter 2 → Table 2-8.

After establishing the QGS, and calculating the quasi-sensitivity, we should compare the obtained value with a threshold. If the quasi-sensitivity was less than the predefined threshold, we should conduct the search and study selection again on the newly found papers in QGS. According to Zhang et al. (2011), it is suggested that an acceptable threshold should be between 70% and 80%. In this study, we chose 80% as the threshold.

3.1.5 Planning the data extraction and the classification process

To extract data from the included studies, we prepared data extraction forms. In Table 6, the items of these forms and the reason for considering each item is shown. Data extraction process was done in two stages. At first, we divided included papers into two sets, and the data extraction operation was performed by two reviewers (for each set, one reviewer). At the second stage, the results of each reviewer were checked and traced back by a third reviewer. If the third researcher found any inconsistencies, the issue was raised in the group meetings to reach an agreement.

TABLE 6: ITEMS OF DATA EXTRACTION FORM

| Item | Rational |
|--------------------|-----------------------------|
| Article name | For identifying the article |
| Authors name | For answering RQ2 |
| Year | For answering RQ1 |
| Venue | For answering RQ2 |
| Extracted keywords | For answering RQ1 |
| General concept | For answering RQ1 |
| Country | For answering RQ2 |

² [http:// s qlab.um.ac.ir/index.php?lang=en](http://s qlab.um.ac.ir/index.php?lang=en)

According to Petersen et al. (2015) the differences between general classification and topic dependent classification are distinguished. In this study, for the general classification, applied facets are the venue, year, and country. To achieve the research tree of the DPs field and identifying research topics, we applied keyword clustering which is a common method for topic dependent classification (see Section 3.3.4).

3.2 Evaluating the mapping study

To evaluate our mapping study, we used the evaluation rubrics presented by Petersen et al. (2015). In Table 7, the rubrics, the related actions which have been done in this study, and the evaluation degree are shown. According to the related actions, we assigned a degree (no description, minimal, partial, and full) to each rubric based on the requirements defined by Petersen et al. (2015). In the last column of Table 7, for each rubric, the ratio of the number of mapping studies with the same evaluation degree, to the total number of mapping studies investigated by Petersen et al. (2015) is shown. The evaluation results demonstrate that this mapping study has been conducted on the acceptable level of quality, compared with other studies investigated by Petersen et al. (2015). Note, if the quality was not acceptable, the planning phase should be revised (according to each rubric).

TABLE 7: EVALUATION RUBRICS

| Rubric | Actions | Evaluation degree | Evaluation degree of the mapping studies investigated by Petersen et al. (2015) |
|---|---|-------------------|---|
| Specifying scope and research questions | Need of the study, motivations, objectives and research questions are defined | partial | 100% partial |
| Specifying search strategy | Manual search and backward snowballing are used | minimal | About 40% no description, about 23% minimal, about 19% full |
| Evaluating search and study selection process | The quasi-gold standard is used to evaluate the search and selection process; an additional person is added to judge when disagreement occurs, and decision rules are taken | partial | About 44% no description, about 42% minimal, about 14% partial |
| Data extraction and classification | An additional person is added to trace back and check extracted data, two classification schemes (general classification and topic dependent classification) were used | minimal | About 10% no description, about 61% minimal, about 29% partial |
| Threats to validity | The threats to validity are discussed | full | About 14% no description, about 86% full |

3.3 Conducting the mapping study

After specifying the protocols and strategies of the mapping process, they should be applied in the conducting phase. The details are explained below.

3.3.1 Conducting the search and the study selection process

As mentioned before, to start the search process, the initial set of papers should be determined. After obtaining the initial set, the rest of the search process was performed according to the search and the selection strategies. The second author identified the initial set by performing the following steps. In the first step, an informal search was carried out to find the secondary studies which had been conducted in the field of DPs. The informal search was undertaken using 'Google Scholar' and the search term 'design pattern' combined with terms such as 'review', 'systematic review', 'systematic mapping study', 'systematic literature review', or 'survey'. Then, according to the study selection criteria (exclusion criteria (6)), some secondary studies were

selected (see Appendix →Table A). In the next step, by investigating the primary studies which had been considered by the secondary studies obtained from the previous step, 303 papers were identified as the candidate members of the initial set. Afterwards, by applying the selection process on the candidate members, 101 papers remained and formed the final initial set (see Appendix →Table B).

In general, by conducting the search process, 36 journals and 53 conferences (or workshops) were identified as the desired search spaces and a total of 1484 conference papers and 965 journal papers were identified as relevant papers. After applying the study selection strategy, 155 journal papers and 368 conference or workshop papers remained and were included. Note, in Appendix →Tables C, and D, the number of the relevant papers (before applying study selection process) and the number of the included papers (after applying study selection process) of each search space are shown.

3.3.2 Evaluating the search and the study selection process

In our study, we achieved the sensitivity of 79%. So, we conducted the search and study selection again on the newly found papers in QGS. In the QGS, there were 23 new papers which we did not include (because the venues of them were not considered in our search). We took these papers as the initial set and conducted the search strategy on them. Finally, 3 new journals and 16 new conferences were added to the search space set and subsequently 93 conference papers and 21 journal papers were added to our included set. In Appendix → Table F, data extracted for the evaluation phase are shown. More details of this phase are presented in DPs-SM → Chapter 2 → Table 2-8.

3.3.3 Data extraction

At this stage, according to the data extraction forms, useful data were extracted. As we mentioned earlier, the extraction has been conducted by two reviewers and checked by the third one. In the DPs-SM →Chapter 1 → Tables 1-8 to 1-11, the filled forms are available.

3.3.4 Analysis and classification

The data extracted in the previous step were analyzed and tabulated according to the related research question(s). For example, to answer the RQ1, the papers were tabulated based on the year and counted afterward. In Section 4, the results of this stage are visually illustrated.

As mentioned before, the main goal of an SMS is classifying the primary studies that have been included in the intended subject. In the current systematic mapping, using keyword clustering we classified those primary studies that have been included in the field of DPs. We applied the keyword clustering, as mentioned by Febrero et al. (2014) and Noyons et al. (2000), on the meaningful terms (keywords) which was extracted at the first step from the title, author's keywords, and abstract of the primary studies. These meaningful terms should reflect the purpose or contribution of the paper. Here, at first, about 1135 keywords and phrases were extracted as the meaningful terms. Then, we characterized the most frequent terms. We identified about 30 frequent terms which were repeated more than 10 times (see DPs-SM →Chapter 1 →Tables 1-11), and clustered them into 5 groups on the basis of their similar cognitive orientation. These groups were obtained by a hierarchical clustering algorithm with complete linkage on the keyword normalized co-occurrence matrix (Noyons et al. 2000). In the keyword co-occurrence matrix both the rows and the columns represent the keywords and each cell shows the number of times that the keywords corresponding to the row and the column of that cell appear together in a study (see DPs-SM →Chapter 1 →Tables 1-12). Then, based on the cosine index (see eq. (2)), we normalized the co-occurrence matrix.

$$\text{sim}(i, j) = \frac{\sum_{k=1}^n X_{ik}X_{kj}}{\sqrt{(\sum_{k=1}^n X_{ik}^2)(\sum_{k=1}^n X_{kj}^2)}}. \quad (2)$$

Where X_{ij} is the number of co-occurrences of keyword i with keyword j .

In the recalculated matrix, the similarity of keywords will be based on the cognitive orientation of two keywords in relation to all other keywords. Note, we determine the number of clusters empirically. We chose this number in such a way that the papers can be divided into balanced clusters (as much as possible). In the last step, a proper name for each cluster should be selected according to the most frequent keywords and the whole concept of the cluster (see Table 8).

By applying the above-mentioned method on the frequent keywords in the field of DPs, we identified the following research topics: 1- Pattern Development, 2- Pattern Usage, 3- Pattern Mining, 4- Quality Evaluation, and 5- Pattern Specification.

After specifying the main category, we specialized and divided these topics into some possible sub-topics. To do so, based on the authors' field experience, we considered a suitable discriminator for each topic. Then, each topic was divided based on the corresponding discriminator, and a complete classification was achieved. The details of each category and the related sub-categories are given in Section 4.

Finally, we mapped each paper to its corresponding category based on its extracted keywords. If in a particular paper any of the frequent keywords existed, the paper was mapped to the category to which the keywords belong. Otherwise, we considered the frequent keywords and found semantically similar keywords in the paper. Then, based on these similar keywords, we mapped the paper to its corresponding category. If a paper was found which could not be mapped to any of the categories, we mapped it to the Miscellaneous Issues category. Note that in some cases, according to the extracted keywords, a paper may belong to more than one category. These papers were judged, and the most related category was chosen.

TABLE 8: KEYWORDS AND RELATED CONCEPTS OF CATEGORIES

| Category | Keywords | Concept |
|-----------------------|--|--|
| Pattern Development | Name of a new pattern (e.g. OCO design pattern), Categorization/ Classification/ Cataloging, (Design) Pattern language(s), Pattern(s) Composition(s)/ Composition, (Software) Evolution | Any development in the field of DPs research |
| Pattern Usage | Using, (DP(s)) Applying/ Application | Designing domain-specific applications with patterns, presenting pattern-based methods, or Incorporating and applying DPs in the software design/ code |
| Pattern Mining | Detection, Recovery, Identification, Recognition | Finding instances of the pattern in the system code/ design. |
| Quality Evaluation | Quality, (Quality) Evaluation/ Measurement/ Assessment, Quality attributes (such as maintenance and reusability), (Evaluation by) Metric(s), (Evaluation by) Empirical/ Experimental (Methods) | Assessing the quality of the patterns or assessing the impact of applying DPs on the quality of the system |
| Pattern Specification | (Pattern) Specification/ Specifying, Formalism/ Formal (method(s)), Visualization/ Visual, Modeling Languages (such as UML), Verification/ Verifying | Using different methods and notations for describing the patterns |

4 RESULTS

In this section, the results are presented with respect to the research questions specified in Section 3.1.1. First, in Section 4.1 research topics and sub-topics that have been identified in this review, and frequency of papers are presented. Next, in Section 4.2, active countries, researchers, and venues in the field of DPs are provided.

4.1 Identifying the research topics and frequency of papers (RQ1)

In the late 1960s and early 70s, Christopher Alexander introduced the patterns concept in architecture (Najari et al. 2016). In 1993, it was suggested to forge a marriage of objects and patterns. Then, in 1995, the idea of patterns was adopted in object-oriented software development (c2.wiki 2016). In the same year, Gamma's book was released (Gamma et al. 1995). According to scholars, Gamma's book is the most effective activity to pick up the topic of DPs (Ampatzoglou et al. 2015). In Gamma's book, with the aim of solving some commonly-recurring design problems, 23 DPs are cataloged (Gamma et al. 1995).

According to the above-mentioned explanations, we considered the time interval starting from 1995. Fig. 4 illustrates the number of papers on DPs during the last two decades (from 1995 to 2015). Note, since we did not consider the full year of 2016 in our review, the number of the publications in 2016 is not presented in this figure (from the beginning of 2016 to March, only two papers were included). As seen in Fig. 4, from the total number of 637 papers including archival journal and conference articles, about 62% of articles (393 papers) have been published in the recent decade. Therefore, it can be concluded that similar to some old topics such as

software architectural decisions (Tofan et al. 2015) or trending topics such as technical debt (Li et al. 2015), DPs research is a hot topic and the attention to the subject is increasing.

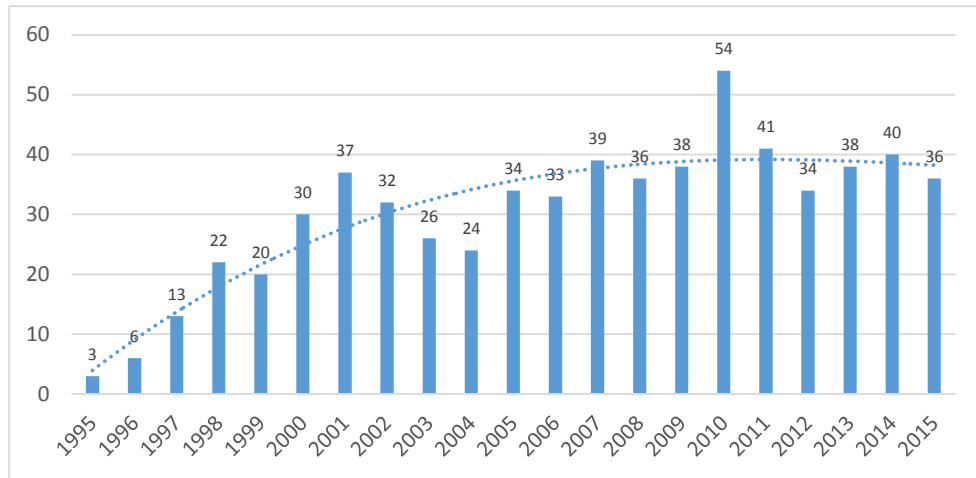


Fig. 4. Frequency of publications per year

For identifying the research topics, as mentioned in Section 3.3.4, we used the keyword clustering method. Extracting the keywords and meaningful terms of the primary studies and presenting the most repeated of them is a common and good practice in an SMS. In this mapping study, about 1135 keywords and phrases were extracted. Fig. 5, shows 30 most frequent of these keywords and phrases. As seen, “Security Patterns” (representative of words such as (Software) Security pattern(s), Security design pattern(s), or Security), “Object Orientation” (representative of words such as Object Orientation, or OO), and “Pattern Detection” (representative of words such as ((Design) pattern(s)) Detection, or Detecting) are the most frequent phrases in the literature of DPs.



Fig. 5. Common keywords and phrases in DPs field, drawn with <http://www.wordle.net/>

By applying the keyword clustering algorithm (see section 3.3.4), we obtained a classification which is shown in Fig. 6. The main categories of this classification are Pattern Development, Pattern Usage, Pattern Mining, Quality Evaluation, Pattern Specification, and Miscellaneous Issues. In Table 8, the extracted keywords that were useful for classification is shown. Below, the details of each category (topic) and sub-category (sub-topic) are given.

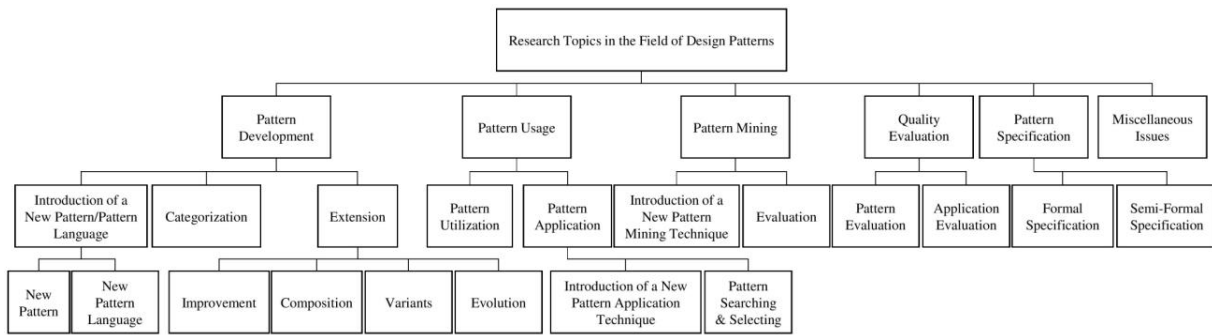


Fig. 6. DPs research tree

The Pattern Development category

Pattern Development category indicates any development in the field of DPs research, including:

- Introducing a new pattern or new pattern language. A pattern language is a collection of interrelated DPs that are carefully organized to characterize a design methodology. Note that a pattern language is more than only a catalog of patterns and the structure of the pattern language guides the user to design complex systems using the patterns (Massingill et al. 2001; Zhao et al. 2008; Pauwels et al. 2010; Hafiz 2013). “New pattern language” and “New pattern” sub-categories, refer to these definitions.
- Discussing pattern variants, pattern evolution, composing patterns or improving a specific pattern. Variability in patterns refers to the changes (in structure or behavior) that can occur inside of a DP when it is implemented while keeping the main parts of the pattern (Kim and Shen 2008). DPs embed some special ways for future changes. Evolution in DPs implies future changes in patterns during the evolution of the software (Schanz and Izurieta 2010; Griffith and Izurieta 2014; Rossi and Russo 2014). Pattern composition means assigning multiple elements of the pattern into overlapping sets of system classes (Dong 2002; Dong et al. 2007; Cacho et al. 2014). Pattern improvement indicates introducing an alternative for an existing pattern with the aim of overcoming its limitations (Lyon and Castellanos 2007; Fortuin 2010; Pati and Hill 2012). To cover these issues, the “Extension” sub-category which is divided into “Variants”, “Composition”, “Improvement”, and “Evolution” is defined.
- Categorizing existing DPs in various fields such as mobile applications (Nilsson 2009), security (Hafiz et al. 2007; Van-Hilst 2009), model transformation (Lano and Kolahdouz-Rahimi 2014), and ontology (Tsai et al. 2013). These issues are listed under the “Categorization” sub-category.

In Table 9, the most frequent keywords in “Pattern Development category” are shown. Term frequency for each keyword refers to the number of papers in which the keyword existed. As shown, the main keywords of the Pattern Development category are “(Software) Security pattern(s)/ Security design pattern(s)/ Security”, “Pattern(s) Composition(s)/ Composition”, “(Software) Architecture”, “(Software) Evolution”, “(Design) Pattern language(s)”, “Object Orientation/ OO”, and “Categorization/ Classification/ Cataloging”. As mentioned, one of the sub-topics in this class is introducing a new pattern or a new pattern language. High repetition of the phrase “Security pattern(s)” indicates that security is one of the most interesting topics in which researchers tend to introduce new pattern or pattern language.

TABLE 9: THE MOST FREQUENT KEYWORDS IN “PATTERN DEVELOPMENT” CATEGORY

| Keywords | Frequency |
|--|-----------|
| (Software) Security pattern(s)/ Security design pattern(s)/ Security | 31 |
| Pattern(s) Composition(s)/ Composition | 27 |
| (Software) Architecture | 23 |
| (Software) Evolution | 19 |
| (Design) Pattern language(s) | 16 |
| Object Orientation/ OO | 15 |
| Categorization/ Classification/ Cataloging | 12 |

The Pattern Specification category

The Pattern Specification category includes those papers which use different methods and notations for representing the patterns. There are various specification schemes which are proposed to complement the natural language description of the patterns. These schemes can be classified into two main groups:

- Formal specification schemes: specification of a program's properties by mathematically based techniques (formal languages) which are well understood. A formal language for DPs is a language with a precisely defined vocabulary, syntax, and semantics which aims to reduce the ambiguities by rigorously reasoning about the structural and behavioral aspects of patterns (Kim and Carrington 2009; Zhu and Bayley 2013).
- Semi-Formal specification schemes: specifying DPs with semi-formal languages. A semi-formal language is a language with a precisely defined vocabulary and syntax, but without a precisely defined semantics (Dong et al. 2007; Porras and Guéhéneuc 2010).

“Formalism/ Formal (method(s))”, “Unified Modeling Language (UML)”, and “(Pattern) Specification/ Specifying”, are the most repeated keywords in the Pattern Specification group (Table 10). This means that formal methods have been greatly considered by researchers in the field of specifying patterns and UML is the most attractive semi-formal model for visualizing DPs.

TABLE 10: THE MOST FREQUENT KEYWORDS IN “PATTERN SPECIFICATION” CATEGORY

| Keywords | Frequency |
|-------------------------------------|-----------|
| Formalism/ Formal (method(s)) | 32 |
| Unified Modeling Language (UML) | 22 |
| (Pattern) Specification/ Specifying | 17 |
| Object Orientation/ OO | 9 |
| Verification/ Verifying | 8 |
| Visualization/ Visual | 6 |

The Pattern Usage category

This category consists of the papers with the contribution of employing patterns in the software development process. This topic can be classified into two main classes:

- Pattern Utilization: presenting pattern-based methods or designing domain-specific applications with DPs. DPs can be used in various fields and applications such as security (Fernandez et al. 2013; Uzunov et al. 2015), CAD models (Bai et al. 2016), and object-oriented programming (Kienzle and Romanovsky 2002). Using DPs can help to standardize the design concepts, capture design experiences, reuse elegant and efficient solutions, and improve documentation and maintenance.
- Pattern Application: incorporating and applying DPs in the software design/ code. Papers in the “Introduction” subcategory try to assist the process of applying patterns using manual or automatic methods. However, the “Pattern Searching & Selecting” subcategory deals with the problem of finding a suitable DP to apply and solve a particular problem (Aliaksandr Birukou 2010). Searching patterns imply obtaining information about existing patterns in the literature and online repositories, and selecting patterns means choosing an appropriate pattern in the list which is obtained at the stage of searching patterns or is pre-defined (Aliaksandr Birukou 2010; Sarun and Weenawadee 2007; Zdun 2007; Hasheminejad and Jalili 2012).

According to Table 11, “(software) Security pattern(s)/ security design pattern(s)”, “(Software) Architecture”, “Object Orientation/ OO” are the most common keywords in this field. This shows that the security and the software architecture are areas in which DPs are most widely used.

TABLE 11: THE MOST FREQUENT KEYWORDS IN “PATTERN USAGE” CATEGORY

| Keywords | Frequency |
|--|-----------|
| (software) Security pattern(s)/ security design pattern(s) | 30 |
| (Software) Architecture | 14 |
| Object Orientation/ OO | 12 |
| Java | 10 |
| Using (design) pattern | 10 |
| (DP(s)) Applying/ Application | 10 |

The Quality Evaluation category

Whenever a designer or a developer employs a pattern, one of the most important concerns is the quality of the pattern and the effect of the pattern on the system after applying. The Quality Evaluation category includes those papers with the purpose of quality evaluation in the field of DPs. This topic can be classified into two main classes:

- Pattern evaluation: assessing the quality of the patterns (Halkidis et al. 2006; Ampatzoglou et al. 2011; Elish and Mohammed 2015).
- Application evaluation: assessing the impact of applying DPs on the quality of the software system (Jaafar et al. 2014; Scanniello et al. 2015; Ampatzoglou et al. 2015).

Assessing the pattern quality is a challenging task. Similarly, evaluating the effect of patterns on quality attributes is tough. As the current state of the art stands, evaluation of DPs has been performed through two main activities: 1) computing code metrics (quantitative methods), 2) using expert opinion (empirical methods) (Ampatzoglou et al. 2013). As expected, concerning Table 12, it is observed that “(Software) Quality/Qualitative analysis”, “Metric(s)”, “Empirical (study(s))”, and “(Controlled) Experiment” are frequent keywords in the studies that evaluate the quality of the patterns or the impact of applying them on system quality.

TABLE 12: THE MOST FREQUENT KEYWORDS IN “QUALITY EVALUATION” CATEGORY

| Keywords | Frequency |
|--|-----------|
| (Software) Quality/ Qualitative analysis | 33 |
| Metric(s) | 13 |
| Empirical (study(s)) | 13 |
| Object Orientation/ OO | 12 |
| (Controlled) Experiment | 9 |

The Pattern Mining category

Finding instances of the pattern in the systems source code or design is the purpose of the papers which were included in this category. Detection of DP motifs can provide a better glimpse to recognize the original design decisions. Hence, it is important in the process of refactoring, reengineering, and maintenance. Furthermore, it can be helpful for software quality measurement, program understanding, and improving software documentation. However, this is not a straightforward task. Papers which discuss the Pattern Mining field can be classified into two main groups:

- Introduction: Introducing a new method for the detection of DPs (Yu et al. 2015; Zaroni et al. 2015; Wen-Jin et al. 2015).
- Evaluation: Evaluating mining techniques for DPs (Bouassida et al. 2013; Ujhelyi et al. 2015).

Table 13 elucidates that the keywords used in the published papers on mining DPs are mostly “((Design) pattern(s)) Detection/ Detecting”, “Reverse engineering/ Re-engineering”, “((Design) pattern(s)) Recovery”, and “((Design) pattern(s)) Identification/ Identifying”. “Detection”, “Recovery”, and “Identification” are synonymous with the word “Mining”. DP Mining is a significant part of the reverse engineering process that can aid program comprehension. Hence, the “Reverse engineering” keyword is repeated commonly in the Pattern Mining studies.

TABLE 13: THE MOST FREQUENT KEYWORDS IN “PATTERN MINING” CATEGORY

| Keywords | Frequency |
|---|-----------|
| ((Design) pattern(s)) Detection/ Detecting | 64 |
| Reverse engineering/ Re-engineering | 36 |
| ((Design) pattern(s)) Recovery | 19 |
| ((Design) pattern(s)) Identification/ Identifying | 18 |
| Tool (Support) | 14 |
| Object Orientation/ OO | 12 |
| ((Design) pattern(s)) Recognition | 12 |
| Antipattern | 10 |

The Miscellaneous Issues category

This class includes studies that cannot be classified into any other previous topics (Ampatzoglou et al. 2013; Gaitani et al. 2015; Aljasser 2016). These studies typically discuss issues such as, refactoring, code smells & anti-patterns, and implementing patterns in a special language. Miscellaneous Issues cannot be regarded as individual topics because they reflect enormous heterogeneity, and they lack enough maturity.

Table 14 demonstrates that the most frequent keyword in the Miscellaneous Issues is “Refactoring”. Refactoring is the process of restructuring a software system in such a way that it improves the internal structure of the system without altering the external behavior of the code. Designs can be improved with patterns by applying sequences of design transformations, known as refactoring (Kerievsky 2005).

TABLE 14: THE MOST FREQUENT KEYWORDS IN “MISCELLANEOUS ISSUES” CATEGORY

| Keywords | Frequency |
|-------------------------|-----------|
| Refactoring | 20 |
| Object Orientation/ OO | 17 |
| (Software) Architecture | 8 |
| Tool (Support) | 8 |
| Reuse/ Reusability | 8 |

Fig. 7 depicts the percentage of publications for the diverse topics of DPs. As observed, most of the scholars have focused on Pattern Development, Pattern Mining, and Pattern Usage, while less consideration is given to Pattern Specification, and Quality Evaluation categories.

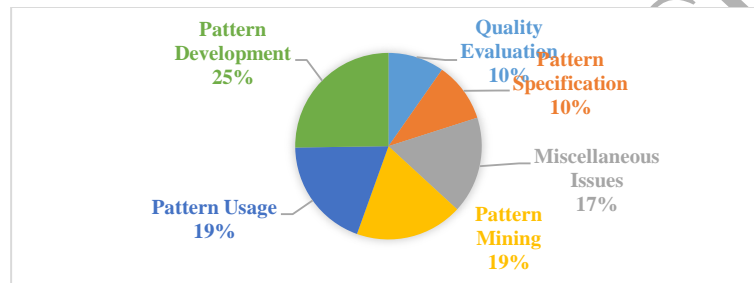


Fig. 7. Percentage of publications per topic

Table 15 has been presented to show the number of publications in different fields of DPs (as discussed in Fig. 7) for different years. It is observed that, in general, three branches of DPs including Pattern Development, Pattern Mining, and Pattern Usage had the highest growth in the number of publications during the recent years. Moreover, in this table, we have highlighted the most frequent categories for each year.

TABLE 15: EVOLUTION OF DPs TOPICS PUBLICATIONS OVER TIME

| | | Category | | | | | |
|---------------------------------|------|--------------------|-----------------------|----------------------|----------------|---------------|---------------------|
| | | Quality Evaluation | Pattern Specification | Miscellaneous Issues | Pattern Mining | Pattern Usage | Pattern Development |
| Number of publications per year | 1995 | 0 | 0 | 1 | 1 | 0 | 1 |
| | 1996 | 0 | 1 | 2 | 1 | 0 | 2 |
| | 1997 | 0 | 1 | 7 | 1 | 3 | 1 |
| | 1998 | 0 | 2 | 6 | 1 | 7 | 6 |
| | 1999 | 0 | 1 | 2 | 2 | 10 | 5 |
| | 2000 | 2 | 4 | 4 | 3 | 11 | 6 |
| | 2001 | 6 | 4 | 2 | 6 | 6 | 13 |
| | 2002 | 2 | 3 | 7 | 4 | 7 | 9 |
| | 2003 | 1 | 4 | 4 | 4 | 10 | 3 |
| | 2004 | 3 | 6 | 5 | 4 | 2 | 4 |
| | 2005 | 3 | 2 | 3 | 13 | 4 | 9 |
| | 2006 | 2 | 4 | 6 | 8 | 5 | 8 |
| | 2007 | 5 | 4 | 5 | 5 | 6 | 14 |
| | 2008 | 5 | 3 | 4 | 9 | 4 | 11 |
| | 2009 | 4 | 3 | 7 | 12 | 4 | 8 |
| | 2010 | 5 | 6 | 14 | 12 | 5 | 12 |
| | 2011 | 5 | 8 | 6 | 6 | 7 | 9 |
| | 2012 | 8 | 0 | 4 | 4 | 10 | 8 |
| | 2013 | 3 | 8 | 3 | 6 | 9 | 9 |
| | 2014 | 4 | 1 | 8 | 6 | 7 | 14 |
| | 2015 | 4 | 1 | 6 | 11 | 5 | 9 |

4.2 Identification of active countries, researchers, and venues

The results obtained from the data analysis for this research question are shown in the following figures and tables.

The geographical distribution of publications (GDP) for a particular topic is an indicator of the productivity of the research topic of individual countries and has become a field of interest. In Fig. 8, the geographical distribution of publications in the field of DPs from 1995 to March 2016 is shown. As seen, USA has the highest share (23%) from the total number of publications. Canada, Germany, and Italy stand in the next ranks after the USA. According to our inspection of the country rankings provided by SCImago Country Rank in 2016 (SCImago 2016), USA, China, UK, Germany, Japan, France, Canada, and Italy are the most active countries in the number of scientific articles respectively. Similarly, USA, Canada, Germany, Italy, UK, China, and France are among the countries with the highest number of publications in the field of DPs. However, as shown in Fig. 8, there are some countries such as Greece and Brazil which their activity level in the DPs field are beyond what was expected. Considering the affiliation and the nationality of communities, projects, pioneers, and renowned researchers in the field of DPs research which illustrated in DPs-SM →Chapter 2 →Tables 2-1 to 2-2 and Table 2-7 and DPs-SM →Chapter 3 →Tables 3-2, it can be concluded that there exists a strong relationship between them and the number of papers produced in each country.

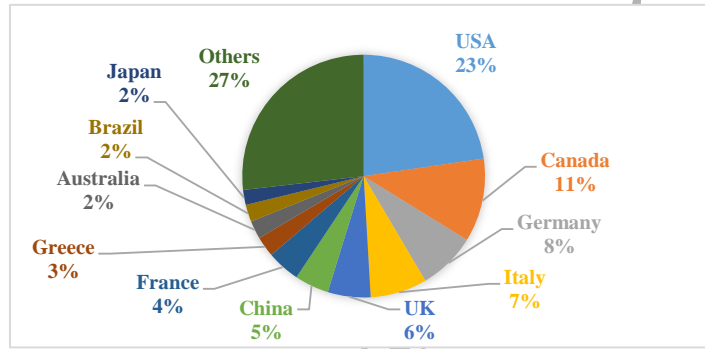


Fig. 8. Geographical distribution of publications

Identification of key scholars in a field of research can help those researchers who want to enter the research field. As mentioned before, from each included paper, we extracted the name of the authors. In total, 1078 authors were identified in the DPs field. In Table 16, ten most active researchers in the DPs field with their number of publications are presented. Moreover, in this table, we have highlighted the most important researcher per domain.

TABLE 16: TEN MOST ACTIVE RESEARCHERS IN DPs FIELD

| | Quality Evaluation | Pattern Specification | Miscellaneous Issues | Pattern Mining | Pattern Usage | Pattern Development | Total |
|---------------------------|--------------------|-----------------------|----------------------|----------------|---------------|---------------------|-------|
| Yann-Gaël Guéhéneuc | 7 | 2 | 2 | 20 | 3 | 2 | 36 |
| Jing Dong | 0 | 4 | 2 | 5 | 2 | 15 | 28 |
| Eduardo B. Fernández | 0 | 0 | 1 | 0 | 6 | 8 | 15 |
| Francesca Arcelli Fontana | 1 | 0 | 0 | 13 | 0 | 0 | 14 |
| Giuliano Antoniol | 2 | 0 | 2 | 6 | 0 | 2 | 12 |
| Dae-Kyoo Kim | 0 | 5 | 2 | 0 | 2 | 2 | 11 |
| Yajing Zhao | 0 | 1 | 2 | 4 | 0 | 4 | 11 |
| Apostolos Ampatzoglou | 8 | 0 | 1 | 0 | 1 | 0 | 10 |
| Giuseppe Di Lucca | 2 | 1 | 1 | 6 | 0 | 0 | 10 |
| Alexander Chatzigeorgiou | 6 | 0 | 0 | 1 | 1 | 1 | 9 |

Table 17 demonstrates the most popular conferences in the field of DPs. The International Conference on Pattern Languages of Programs (PLOP) has published the largest number of conference papers related to DPs. European Conference on Object-Oriented Programming (ECOOP), Asia-Pacific Software Engineering Conference (APSEC), International Conference on Software Engineering (ICSE), and OOPSLA stand in the next ranks after the PLOP.

TABLE 17: ACTIVE CONFERENCES IN DPs FIELD

| Name (or acronym) | Number of publications | Name (or acronym) | Number of publications | Name (or acronym) | Number of publications |
|-------------------|------------------------|-------------------|------------------------|-------------------|------------------------|
| PLoP | 51 | ICSOFT | 6 | ARES | 3 |
| ECOOP | 45 | SEW | 6 | HiPC | 3 |
| APSEC | 24 | SAC | 5 | PATTERNS | 3 |
| ICSE | 22 | QUATIC | 5 | CSEE&T | 2 |
| OOPSLA | 22 | DEXA | 5 | CSE | 2 |
| CSMR | 19 | CAiSE | 5 | SEFM | 2 |
| ASE | 18 | FASE | 5 | SysCon | 2 |
| WCRE/ SANER | 14 | ENASE | 5 | ICSC | 2 |
| TOOLS | 14 | SOSE | 4 | TASE | 2 |
| ICSME | 12 | ICPC | 4 | ICACTE | 2 |
| COMPSAC | 12 | MODELS/ UML | 4 | CiSE | 2 |
| EuroPLoP | 12 | PCI | 4 | SERP | 2 |
| ESEM | 10 | SNPD | 4 | EmbeddedCom | 1 |
| HICSS | 7 | ICECCS | 4 | SPLASH | 1 |
| IRI | 7 | CASCON | 3 | ASWEC | 1 |
| ICSEA | 7 | IJCAI | 3 | UKCI | 1 |
| ASEA | 7 | RE | 3 | SCAM | 1 |
| ICSESS | 7 | ECBS | 3 | ICIS | 1 |
| FSE | 6 | Mindtrek | 3 | DASC | 1 |
| SEKE | 6 | ICEIS | 3 | PASTE | 1 |
| ICQS | 6 | SERA | 3 | ICCES | 1 |
| STEP | 6 | swmetrics | 3 | IACC | 1 |

Table 18 represents the distribution of the publications in DPs topics over the 13 most active conferences in the field. For example, this table shows that in the pattern development category, 28.15 percent of the conference papers are published in the PLoP conference. In this table, we have highlighted the two most active conferences in each topic. Note that the row entitled "Others" includes the total percentage of participation of the other conferences.

TABLE 18: DISTRIBUTION OF DPs TOPICS PUBLICATIONS OVER ACTIVE CONFERENCES IN THE FIELD

| Topics Name | Pattern Development (%) | Pattern Usage (%) | Pattern Mining (%) | Quality Evaluation (%) | Pattern Specification (%) | Miscellaneous Issues (%) | Total (%) |
|----------------|-------------------------------|-------------------------|--------------------------|------------------------------|---------------------------------|--------------------------------|--------------|
| PLoP | 28.15 | 4.47 | 0 | 5.19 | 7.61 | 9.30 | 11.06 |
| ECOOP | 7.56 | 16.76 | 7.32 | 2.60 | 6.52 | 12.79 | 9.76 |
| APSEC | 2.10 | 6.70 | 2.44 | 5.19 | 7.61 | 9.30 | 5.21 |
| ICSE | 2.52 | 0 | 6.10 | 2.60 | 8.70 | 10.47 | 4.77 |
| OOPSLA | 3.78 | 11.73 | 0 | 5.19 | 0 | 5.81 | 4.77 |
| CSMR | 0.42 | 1.68 | 15.85 | 7.79 | 0 | 1.16 | 4.12 |
| ASE | 3.78 | 5.03 | 6.71 | 2.60 | 3.26 | 1.16 | 3.90 |
| WCRE/ SANER | 0 | 0 | 9.76 | 10.39 | 0 | 2.33 | 3.04 |
| TOOLS | 4.62 | 5.59 | 0.61 | 0 | 0 | 3.49 | 3.04 |
| ICSME | 1.26 | 0 | 7.32 | 5.19 | 1.09 | 2.33 | 2.60 |
| COMPSAC | 2.52 | 1.12 | 4.27 | 2.60 | 7.61 | 0 | 2.60 |
| EuroPLoP | 5.04 | 0 | 2.44 | 0 | 0 | 4.65 | 2.60 |
| ESEM | 4.20 | 0 | 0 | 10.39 | 0 | 1.16 | 2.17 |
| Others | 34.03 | 46.93 | 37.20 | 40.26 | 57.61 | 36.05 | 40.35 |
| Total | 100 | 100 | 100 | 100 | 100 | 100 | 100 |

In Table 19, the most popular journals in the field of DPs are shown. The Journal of Systems and Software has published the largest number of journal papers related to DPs. Journal of Object Technology, Software Practice and Experience, Software & Systems Modeling, and IEEE Transactions on Software Engineering stand in the next ranks after the Journal of Systems and Software.

TABLE 19: ACTIVE JOURNALS IN DPS FIELD

| Name | Number of publications | Name | Number of publications |
|----------------------|------------------------|-------------------------------|------------------------|
| J SYST SOFTWARE | 26 | ACM T SOFTW ENG METH | 2 |
| J OBJ TECHNOL | 15 | AUTOMAT SOFTW ENG | 2 |
| SOFTWARE PRACT EXPER | 14 | COMPUT LANG SYST STR | 2 |
| SOFTW SYST MODEL | 12 | INT J SOFTW TOOL TECHNOL TRAN | 2 |
| IEEE T SOFTWARE ENG | 11 | COMPUT EDUC | 2 |
| INFORM SOFTWARE TECH | 10 | COMPUT SECUR | 2 |
| SCI COMPUT PROGRAM | 9 | FORM ASP COMPUT | 2 |
| SOFTWARE QUAL J | 6 | INFORM SCIENCES | 2 |
| ADV ENG SOFTW | 5 | ACM T PROGR LANG SYS | 1 |
| EMPIR SOFTW ENG | 5 | APPL SOFT COMPUT | 1 |
| COMPUT J | 5 | COMPUT HUM BEHAV | 1 |
| COMPUT STAND INTER | 4 | GOV INFORM Q | 1 |
| IEEE Software | 4 | IEEE T DEPEND SECURE | 1 |
| IET Software | 4 | IEEE T POWER SYST | 1 |
| INTERNET RES | 3 | IEEE T SYST MAN CY A | 1 |
| Informatica | 3 | INNOV SYST SOFTW ENG | 1 |
| INT J SOFTW ENG KNOW | 3 | INTERACT COMPUT | 1 |
| J SOFTW EVOL PROC | 3 | MANAG INF SYST Q | 1 |
| J VISUAL LANG COMPUT | 3 | PATTERN ANAL APPL | 1 |
| REQUIR ENG | 3 | SECUR COMMUN NETW | 1 |

Table 20 represents the distribution of the publications in DPS topics over the 13 most active journals in the field. For example, this table shows that in the pattern development category, 14.81 percent of the journal papers are published in the Journal of Systems and Software. In this table, we have highlighted the most active journal in each topic. Note that the row entitled "Others" includes the total percentage of participation of the other journals.

TABLE 20: DISTRIBUTION OF DPS TOPICS PUBLICATIONS OVER ACTIVE JOURNALS IN THE FIELD

| Name | Topics | Pattern Development (%) | Pattern Usage (%) | Pattern Mining (%) | Quality Evaluation (%) | Pattern Specification (%) | Miscellaneous Issues (%) | Total (%) |
|----------------------|--------|-------------------------|-------------------|--------------------|------------------------|---------------------------|--------------------------|-----------|
| J SYST SOFTWARE | | 14.81 | 24.24 | 20 | 14 | 6.98 | 0 | 14.77 |
| J OBJ TECHNOL | | 12.35 | 1.52 | 8.57 | 0 | 16.28 | 14.29 | 8.52 |
| SOFTWARE PRACT EXPER | | 12.35 | 6.06 | 5.71 | 4 | 13.95 | 4.76 | 7.95 |
| SOFTW SYST MODEL | | 8.64 | 6.06 | 8.57 | 2 | 9.30 | 4.76 | 6.82 |
| IEEE T SOFTWARE ENG | | 4.94 | 0 | 7.14 | 16 | 11.63 | 0 | 6.25 |
| INFORM SOFTWARE TECH | | 2.47 | 3.03 | 5.71 | 20 | 0 | 4.76 | 5.68 |
| SCI COMPUT PROGRAM | | 0 | 6.06 | 2.86 | 0 | 9.30 | 19.05 | 5.11 |
| SOFTWARE QUAL J | | 9.88 | 0 | 2.86 | 0 | 0 | 4.76 | 3.41 |
| ADV ENG SOFTW | | 2.47 | 3.03 | 4.286 | 0 | 2.33 | 4.76 | 2.84 |
| EMPIR SOFTW ENG | | 2.47 | 0 | 0 | 12 | 4.65 | 0 | 2.84 |
| COMPUT J | | 2.47 | 3.03 | 0 | 0 | 0 | 14.29 | 2.84 |
| COMPUT STAND INTER | | 2.47 | 6.06 | 0 | 0 | 0 | 4.76 | 2.27 |
| IEEE Software | | 2.47 | 0 | 0 | 4 | 0 | 9.52 | 2.27 |
| Others | | 22.22 | 40.90 | 34.29 | 28 | 25.58 | 14.29 | 28.41 |
| Total | | 100 | 100 | 100 | 100 | 100 | 100 | 100 |

5 DISCUSSION

In this section, we have discussed and summarized the main achievements of our review with respect to the research questions specified in Section 3.1.1. In Section 5.1, we have summarized the current state of the art concerning DPs research. In Section 5.2 we have discussed the findings of the demographics of patterns research. Finally, in Section 5.3, we have determined the research emphasis on each topic.

5.1 Research topics on DPs

As mentioned before, the main goal of our study is to provide a taxonomy of the research topics related to DPs. Our results suggest six main topics on DPs research, namely (a) Pattern Development, (b) Pattern Usage, (c) Pattern Mining, (d) Quality Evaluation, (e) Pattern Specification, and (f) Miscellaneous Issues.

Our new research taxonomy, compared to the previous classification scheme in this area (Ampatzoglou et al. 2013), has one additional category titled “Pattern Development”. The main reason for this difference is the scope of our study which is all the DPs that exist in the literature, while Ampatzoglou et al. (2013) only considered GoF DPs. The Pattern Development category indicates any development in the field of DPs research, including (a) introducing a new pattern or new pattern language, (b) discussing pattern variants, pattern evolution, composing patterns, or improving a specific pattern, and (c) categorizing existing DPs in various fields and domains. Papers which are included in this category are not limited only to the GoF patterns.

5.2 Demographics of DPs research

As mentioned before, the attention to the subject of DPs is increasing (see Fig. 4). The variation of publications during different years can be measured by a polynomial trend line through the data. As illustrated in Fig. 4, rapid growth is found in the number of publications from 1995 to 2010, and after that, the gradient of the fitted curve tends to zero. It should be noted that for year 2010, a significant deviation is observed from the trend line. The reason behind the remarkable deviation could be attributed to the relatively high number of published papers in QUATIC and PLoP conferences proceedings. In 2010 ten papers were published in proceedings of these two international conferences. Similarly, a considerable number of conference papers in 1998, 2001, and 2007 has had a major effect on the deviation of data from the plotted trend line.

The results of Fig. 8 suggest that most publications come from wealthy countries. Considering the absolute numbers, USA and Canada seem to be the most productive countries. However, smaller affluent countries like Germany and Italy are more productive when the numbers are normalized to population or geographical distribution of the publication. The figure elucidates the considerable investment of developed countries in the field of DPs. On the other hand, it discloses the need for more investment by developing countries in the subject.

Table 16 demonstrates that the most active researcher in the DPs field is Yann-Gaël Guéhéneuc. He is the leader of the Ptidej (The Pattern Trace Identification, Detection, and Enhancement in Java) Team, which seeks to develop theories, methods, and tools, to evaluate and to enhance the quality of object-oriented programs. To achieve this goal, one of the research areas that the Ptidej team is focusing on is DPs. Useful information about the other active researchers in Table 16 is shown in in DPs-SM →Chapter 2 →Tables 2-7.

5.3 Research emphasis on each topic

As mentioned in section 4.1, the most popular topics of DPs research are Pattern Development, Pattern Mining, and Pattern Usage. Some conferences including PLoP, EuroPLoP, and OOPSLA are annually held on the DPs which have a special focus on the Pattern Development domain. This motivates the scholars to attend such credible conferences and as a result, the number of publications in this field is higher than other fields of DPs. In addition, in the Pattern Mining field, the lack of a comprehensive algorithm to detect the patterns with an acceptable accuracy encourages the researchers to improve the present algorithms continuously. Furthermore, as seen in DPs-SM →Chapter 3 →Table 3-1 there are various domains and technologies in which DPs can be used. Since practical studies are important in all fields of science and technology, the Pattern Usage branch is

no exception and it has also attracted the attention of scholars in the DPs field. These notes are the possible reasons for the higher number of publications in Pattern Development, Pattern Mining, and Pattern Usage branches compared to other fields.

6 THREATS TO VALIDITY

One of the main threats to systematic reviews is the problems that might arise during the search and the selection of the primary studies (problems which threaten the completeness of the included papers set). This threat arises from search and selection process. In this paper, we designed a search strategy which takes advantages of two search methods (manual search and snowballing). We conducted a manual search on the selected search spaces and completed our search by snowballing. So, our search strategy is reliable.

For selecting the primary studies, we designed a process in two phases. For the sake of reliability, two reviewers conducted the selection separately, and disagreements were resolved by decision rules and one other reviewer (see section 3.1.3.2). So, we have reduced the threats which may arise in the selection process (such as biases, misunderstandings, etc.).

After finishing the search process, 36 journals and 53 conferences or workshops were selected as the search spaces to find the primary studies which are in the form of paper. So, it is possible that some articles in other journals or conferences are ignored. For reducing this threat and checking the completeness of the included papers, we applied the search and selection evaluation. Our evaluation test set was generated by a separate team (for removing any biases). After applying the evaluation, 3 new journals and 16 new conferences were added to the search space set. However, as mentioned before, we selected the journals and conferences or workshops under consideration of the defined criteria (see section 3.1.3.1). So, in the current mapping study, a good set of journals and conferences or workshops is considered that can be used to find relevant papers with high quality. Furthermore, we selected “design pattern” term as the search string and searched this term in the title, abstract, and full-text of the papers (for manual search). We assumed that “design pattern” term exists in the full-text of most the papers that deal with DPs and according to the purpose of this study, it is not unexpected.

During the data extraction, some threats such as researcher biases and misunderstandings could appear. To remove these threats from our study, the data extraction forms were traced back and checked by another reviewer.

The other threat to validity is selecting a name for each category. As mentioned in Section 3.3.4, we chose a name for each category according to the most frequent keywords in it and its concept. For example, for the category of Pattern Mining, there were some keywords like “Detection”, “Mining”, and “Recovery”. Nevertheless, we chose “Pattern Mining” as the name of the category because it is more inclusive. However, for some categories, the selected name is not within the keywords of that category. Therefore, it is possible that there was a more appropriate term for naming a category which may be ignored. In these cases, we discussed the selected names (according to the concept and keywords) in our team to remove potential biases.

7 CONCLUSION AND FUTURE WORKS

In this paper, we conducted an SMS on the field of DPs to identify some key issues including: (a) topics and sub-topics, (b) frequency of publications in each topic (c) trends and gaps, (d) active countries, researchers, and venues, and (e) common keywords and phrases. So, a total of 2775 journal and conference papers were identified (during conducting the search process and the evaluation) and 637 papers were included. Then, the data necessary to answer the research questions were extracted, and the included papers were tabulated based on these data.

The results show that the DPs field is an active and attractive research topic and in recent decades, the trend of the publications in this field is increasing. Concerning the geographical distribution of publications, USA and Canada are the most active countries in this field.

The most important contribution of this paper is proposing a classification for the research topics in the field of DPs. As shown in Fig. 6, we presented a taxonomy which includes six classes: 1- Pattern Development, 2- Pattern Usage, 3- Pattern Mining, 4- Quality Evaluation, 5- Pattern Specification, and 6- Miscellaneous Issues.

Pattern Development, Pattern Mining, and Pattern Usage are the most active topics, while Pattern Evaluation and Pattern Specification attract less attention. So, future works should consider these gaps and trends. For example, proposing a systematic review on Pattern Development, Pattern Usage, or Pattern Mining can be a valuable endeavour. Moreover, the deficiency of research with the contribution of proposing a method

for the evaluation or specification of DPs is noticeable and more research is required in these topics. Concerning the active venues, PLoP and Journal of Systems and Software devoted the most publications. According to the results, publishing papers (with the focus on the DPs) in 39 ISI journals and 67 conferences with high quality indicates that DPs are an important and noteworthy field in software engineering.

APPENDIX

NOTE: IN THE FOLLOWING TABLES, DUE TO SPACE LIMITATIONS, ONLY INFORMATION ABOUT INCLUDED ITEMS ARE PROVIDED. SEE OUR SUPPLEMENTARY MATERIALS AVAILABLE IN THE WEB ([HTTP://SQLAB.UM.AC.IR/IMAGES/219/FILES/SQLLABSM.PDF](http://SQLAB.UM.AC.IR/IMAGES/219/FILES/SQLLABSM.PDF)) FOR MORE INFORMATION.

Table A: The Secondary Studies Used for Generating Initial Set of Our Systematic Mapping Study

| Param. ID | Secondary study | Research Type | Date |
|-----------|---|------------------------------|------|
| 1 | What Do We Know about the Effectiveness of Software Design Patterns? | Systematic Literature Review | 2012 |
| 2 | A survey of experienced user perceptions about software design patterns | Survey | 2013 |
| 3 | How have we evaluated software pattern application? A systematic mapping study of research design practices | Systematic Mapping Study | 2015 |
| 4 | A review of design pattern mining techniques | Review | 2009 |
| 5 | Research state of the art on GoF design patterns: A mapping study | Systematic Mapping Study | 2013 |
| 6 | Evaluation of Accuracy in Design Pattern Occurrence Detection | Survey | 2010 |
| 7 | Architecture and Design Pattern Discovery Techniques – A Review | Review | 2007 |
| 8 | A Survey of Existing Approaches for Pattern Search and Selection | Survey | 2010 |

Table B: The Initial Set of Our Systematic Mapping Study

| | Title | Ref. ID* | Journal/ Conference Name | Date |
|----|---|------------|--|------|
| 1 | The Factory Pattern in API Design: A Usability Evaluation | 1, 2, 3, 5 | International Conference on Software Engineering (ICSE) | 2007 |
| 2 | Do Maintainers Utilize Deployed Design Patterns Effectively? | 1, 2, 3, 5 | International Conference on Software Engineering (ICSE) | 2007 |
| 3 | A controlled experiment in maintenance comparing design patterns to simpler solutions | 1, 2, 3, 5 | IEEE Transactions on Software Engineering | 2001 |
| 4 | Two controlled experiments assessing the usefulness of design pattern documentation in program maintenance | 1, 2, 3, 5 | IEEE Transactions on Software Engineering | 2002 |
| 5 | A Controlled Experiment Comparing the Maintainability of Programs Designed with and without Design Patterns—A Replication in a Real Programming Environment | 1, 2, 3, 5 | Empirical Software Engineering | 2004 |
| 6 | Impact of the Visitor Pattern on Program Comprehension and Maintenance | 1, 3 | ACM/ IEEE International Symposium on Empirical Software Engineering and Measurement (ESEM) | 2009 |
| 7 | Cognitive learning efficiency through the use of design patterns in teaching | 3 | Computers & Education | 2010 |
| 8 | An empirical study on students' ability to comprehend design patterns | 3 | Computers & Education | 2008 |
| 9 | Documenting pattern use in java programs | 1, 2, 3, 5 | IEEE International Conference on Software Maintenance (ICSM) | 2002 |
| 10 | Human and program factors affecting the maintenance of programs with deployed design patterns | 3 | Information and Software Technology | 2012 |
| 11 | Evaluation of the Pattern-based method for Secure Development (PbSD): A controlled experiment | 3 | Information and Software Technology | 2012 |
| 12 | Distributed cognition in software design: An experimental investigation of the role of design patterns and collaboration | 3 | Management Information Systems Quarterly | 2014 |
| 13 | Instantiating and detecting design patterns: Putting bits and pieces together | 4, 5, 7, 8 | IEEE/ ACM International Conference on Automated Software Engineering (ASE) | 2001 |

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|----|--|------------|--|------|
| 14 | Relating expectations to automatically recovered design patterns | 4, 5, 7 | Working Conference on Reverse Engineering (WCRE) | 2002 |
| 15 | Mining design patterns from C++ source code | 4, 5, 6, 7 | International Conference on Software Maintenance and Evolution (ICSME) | 2003 |
| 16 | Automatic verification of Java design patterns | 4, 5, 7 | IEEE/ ACM International Conference on Automated Software Engineering (ASE) | 2001 |
| 17 | Design pattern recovery by visual language parsing | 4, 5, 6, 7 | Conference on Software Maintenance and Reengineering (CSMR) | 2005 |
| 18 | Case studies of visual language based design patterns recovery | 4, 5, 6, 7 | Conference on Software Maintenance and Reengineering (CSMR) | 2006 |
| 19 | A formal framework for design component contracts | 4 | The IEEE International Conference on Information Reuse and Integration (IRI) | 2003 |
| 20 | DP-Miner: Design pattern discovery using matrix | 4, 7 | Annual IEEE International Conference and Workshops on the Engineering of Computer Based Systems (ECBS) | 2007 |
| 21 | Design pattern detection by template matching | 4, 6 | ACM/ SIGAPP Symposium on Applied Computing (SAC) | 2008 |
| 22 | Compound record clustering algorithm for design pattern detection by decision tree learning | 4 | The IEEE International Conference on Information Reuse and Integration (IRI) | 2008 |
| 23 | Visualizing design patterns in their applications and compositions | 4, 5 | IEEE Transactions on Software Engineering | 2006 |
| 24 | Classification of design pattern traits | 4 | International Conference on Software Engineering and Knowledge Engineering (SEKE) | 2007 |
| 25 | Design pattern mining enhanced by machine learning | 4, 5, 7 | International Conference on Software Maintenance and Evolution (ICSME) | 2005 |
| 26 | Fingerprinting design patterns | 4, 5, 7 | Working Conference on Reverse Engineering (WCRE) | 2004 |
| 27 | A composite design-pattern identification technique | 4, 7 | Informatica | 2005 |
| 28 | Generating design pattern detectors from pattern specifications | 4, 7 | IEEE/ ACM International Conference on Automated Software Engineering (ASE) | 2003 |
| 29 | A practical pattern recovery approach based on both structural and behavioral analysis | 4, 5 | Journal of Systems and Software | 2005 |
| 30 | Efficient identification of design patterns with bit-vector algorithm | 4, 5, 6, 7 | Conference on Software Maintenance and Reengineering (CSMR) | 2006 |
| 31 | Pattern-based reverse-engineering of design components | 4, 5, 6, 7 | International Conference on Software Engineering (ICSE) | 1999 |
| 32 | Design recovery by automated search for structural design patterns in object-oriented software | 4, 5, 6, 7 | Working Conference on Reverse Engineering (WCRE) | 1996 |
| 33 | JBOORET: an automated tool to recover OO design and source models | 4, 7 | IEEE Computer Society International Conference on Computers, Software & Applications (COMPSAC) | 2001 |
| 34 | Towards pattern based design recovery | 4, 6, 7 | International Conference on Software Engineering (ICSE) | 2002 |
| 35 | Reverse engineering of design patterns from java source code | 4, 5, 6, 7 | IEEE/ ACM International Conference on Automated Software Engineering (ASE) | 2006 |

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|----|---|------------|--|------|
| 36 | SPQR: Flexible automated design pattern extraction from source code | 4, 6, 7 | IEEE/ ACM International Conference on Automated Software Engineering (ASE) | 2003 |
| 37 | Searching design patterns in source code | 4, 5, 7 | IEEE Computer Society International Conference on Computers, Software & Applications (COMPSAC) | 2005 |
| 38 | Object oriented design pattern inference | 4, 5, 7 | International Conference on Software Maintenance and Evolution (ICSME) | 1999 |
| 39 | Design Pattern Detection Using Similarity Scoring | 4, 5, 6, 7 | IEEE Transactions on Software Engineering | 2006 |
| 40 | Design pattern detection in Eiffel systems | 4, 5, 7 | Working Conference on Reverse Engineering (WCRE) | 2005 |
| 41 | A pattern-based approach to structural design composition | 5 | IEEE Computer Society International Conference on Computers, Software & Applications (COMPSAC) | 1999 |
| 42 | Evaluation of object-oriented design patterns in game development | 5 | Information and Software Technology | 2007 |
| 43 | Object-oriented design patterns recovery | 5 | Journal of Systems and Software | 2001 |
| 44 | Using metrics to identify design patterns in object-oriented software | 5 | International Software Metrics Symposium (swmetrics) | 1998 |
| 45 | Measuring and improving design patterns testability | 5 | International Software Metrics Symposium (swmetrics) | 2003 |
| 46 | Formal specification of the variants and behavioural features of design patterns | 5 | Journal of Systems and Software | 2010 |
| 47 | Specifying Behavioral Features of Design Patterns in First Order Logic | 5 | IEEE Computer Society International Conference on Computers, Software & Applications (COMPSAC) | 2008 |
| 48 | Design patterns and change proneness: An examination of five evolving systems | 5 | International Software Metrics Symposium (swmetrics) | 2003 |
| 49 | A model-driven framework for representing and applying design patterns | 5 | IEEE Computer Society International Conference on Computers, Software & Applications (COMPSAC) | 2007 |
| 50 | Automated refactoring to introduce design patterns | 5 | International Conference on Software Engineering (ICSE) | 2000 |
| 51 | Design pattern recovery through visual language parsing and source code analysis | 5 | Journal of Systems and Software | 2009 |
| 52 | A two phase approach to design pattern recovery | 5 | Conference on Software Maintenance and Reengineering (CSMR) | 2007 |
| 53 | Behavioral Pattern Identification through Visual Language Parsing and Code Instrumentation | 5 | Conference on Software Maintenance and Reengineering (CSMR) | 2009 |
| 54 | Improving Behavioral Design Pattern Detection through Model Checking | 5 | Conference on Software Maintenance and Reengineering (CSMR) | 2010 |
| 55 | An empirical study of the relationships between design pattern roles and class change proneness | 5 | International Conference on Software Maintenance and Evolution (ICSME) | 2008 |
| 56 | Precise specification and automatic application of design patterns | 5 | IEEE/ ACM International Conference on Automated Software Engineering (ASE) | 1997 |
| 57 | Static and dynamic structure in design patterns | 5 | International Conference on Software Engineering (ICSE) | 2002 |

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|----|--|------|--|------|
| 58 | A UML-based pattern specification technique | 5 | IEEE Transactions on Software Engineering | 2004 |
| 59 | Design Patterns and Change Proneness: A Replication Using Proprietary C# Software | 5 | Working Conference on Reverse Engineering (WCRE) | 2009 |
| 60 | DeMIMA: A Multilayered Approach for Design Pattern Identification | 5, 6 | IEEE Transactions on Software Engineering | 2008 |
| 61 | Architecture-centric software evolution by software metrics and design patterns | 5 | Conference on Software Maintenance and Reengineering (CSMR) | 2002 |
| 62 | Design pattern directed clustering for understanding open source code | 5 | The International Conference on Program Comprehension (ICPC) | 2009 |
| 63 | A quantitative approach for evaluating the quality of design patterns | 5 | Journal of Systems and Software | 2008 |
| 64 | The effects of design pattern application on metric scores | 5 | Journal of Systems and Software | 2001 |
| 65 | OO design patterns, design structure, and program changes: an industrial case study | 5 | International Conference on Software Maintenance and Evolution (ICSME) | 2001 |
| 66 | Identification of design motifs with pattern matching algorithms | 5 | Information and Software Technology | 2010 |
| 67 | Do Design Patterns Impact Software Quality Positively? | 5 | Conference on Software Maintenance and Reengineering (CSMR) | 2008 |
| 68 | Playing roles in design patterns: An empirical descriptive and analytic study | 5 | International Conference on Software Maintenance and Evolution (ICSME) | 2009 |
| 69 | A role-based meta-modeling approach to specifying design patterns | 5 | IEEE Computer Society International Conference on Computers, Software & Applications (COMPSAC) | 2003 |
| 70 | Standing on the shoulders of giants - A data fusion approach to design pattern detection | 5 | The International Conference on Program Comprehension (ICPC) | 2009 |
| 71 | Facilitating software extension with design patterns and Aspect-Oriented Programming | 5 | Journal of Systems and Software | 2008 |
| 72 | Generative design patterns | 5 | IEEE/ ACM International Conference on Automated Software Engineering (ASE) | 2002 |
| 73 | Deferring design pattern decisions and automating structural pattern changes using a design-pattern-based programming system | 5 | ACM Transactions on Programming Languages and Systems (TOPLAS) | 2009 |
| 74 | Precise modeling of design patterns in UML | 5 | International Conference on Software Engineering (ICSE) | 2004 |
| 75 | Coupling of design patterns: Common practices and their benefits | 5 | IEEE Computer Society International Conference on Computers, Software & Applications (COMPSAC) | 2001 |
| 76 | A declarative evolution framework for object-oriented design patterns | 5 | International Conference on Software Maintenance and Evolution (ICSME) | 2001 |
| 77 | Formalizing design patterns | 5 | International Conference on Software Engineering (ICSE) | 1998 |
| 78 | A static reference flow analysis to understand design pattern behavior | 5, 7 | Working Conference on Reverse Engineering (WCRE) | 2004 |
| 79 | An empirical study on the efficiency of different design pattern representations in UML class diagrams | 5 | Empirical Software Engineering | 2010 |
| 80 | Design pattern density defined | 5 | OOPSLA | 2009 |
| 81 | Design pattern recovery based on annotations | 5 | Advances in Engineering Software | 2010 |

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|-----|--|---|--|------|
| 82 | Evolution support by homogeneously documenting patterns, aspects and traces | 5 | Conference on Software Maintenance and Reengineering (CSMR) | 2002 |
| 83 | A controlled experiment for assessing the contribution of design pattern documentation on software maintenance | 5 | ACM/ IEEE International Symposium on Empirical Software Engineering and Measurement (ESEM) | 2010 |
| 84 | Object Oriented Design Pattern Decay: A Taxonomy | 5 | ACM/ IEEE International Symposium on Empirical Software Engineering and Measurement (ESEM) | 2010 |
| 85 | Responsibilities and rewards: Specifying design patterns | 5 | International Conference on Software Engineering (ICSE) | 2004 |
| 86 | On the role of design patterns in quality-driven re-engineering | 5 | Conference on Software Maintenance and Reengineering (CSMR) | 2002 |
| 87 | Defect frequency and design patterns: an empirical study of industrial code | 5 | IEEE Transactions on Software Engineering | 2004 |
| 88 | Assessment of Design Patterns during Software Reengineering: Lessons Learned from a Large Commercial Project | 5 | Conference on Software Maintenance and Reengineering (CSMR) | 2001 |
| 89 | Integration in component-based software development using design patterns | 5 | IEEE Computer Society International Conference on Computers, Software & Applications (COMPSAC) | 2000 |
| 90 | Tool Support for Design Pattern Recognition at Model Level | 5 | IEEE Computer Society International Conference on Computers, Software & Applications (COMPSAC) | 2009 |
| 91 | A transformational viewpoint on design patterns | 5 | IEEE/ ACM International Conference on Automated Software Engineering (ASE) | 2000 |
| 92 | An efficient tool for recovering Design Patterns from C++ Code | 6 | Journal of Object Technology | 2006 |
| 93 | Specialization patterns | 6 | IEEE/ ACM International Conference on Automated Software Engineering (ASE) | 2000 |
| 94 | Verifying Behavioral Correctness of Design Pattern Implementation | 6 | International Conference on Software Engineering and Knowledge Engineering (SEKE) | 2008 |
| 95 | A Non-Conservative Approach to Software Pattern Detection | 6 | The International Conference on Program Comprehension (ICPC) | 2007 |
| 96 | An approach for reverse engineering of design patterns | 6 | Software & Systems Modeling | 2005 |
| 97 | Towards a benchmark for evaluating design pattern miner tools | 6 | Conference on Software Maintenance and Reengineering (CSMR) | 2008 |
| 98 | From Non-Functional Requirements to Design through Patterns | 8 | Requirements Engineering | 2001 |
| 99 | From software architecture to design patterns: A case study of an NFR approach | 8 | International Conference on Software Engineering, Artificial Intelligence, Networking and Parallel/ Distributed Computing (SNPD) | 2005 |
| 100 | Selecting Security Patterns that Fulfill Security Requirements | 8 | International Requirements Engineering Conference (RE) | 2008 |
| 101 | Systematic pattern selection using pattern language grammars and design space analysis | 8 | Software Practice and Experience | 2007 |

*: The ref. ID for each paper in Table B refers to the ID of the papers in Table A which the intended paper is obtained from.

Table C: Information of the Related Journals

| | Journal Name | N1* | N2** | Coverage | SJR | Q (JCR 2014) | IF |
|----|---|-----|------|----------------------------|-------|----------------------|-------|
| 1 | Journal of Systems and Software | 151 | 26 | 1979-2015 | 1.38 | Q ₂ | 1.352 |
| 2 | Journal of Object Technology | 23 | 15 | 2002-2014 | 0.4 | Q ₃ (SJR) | N/ A |
| 3 | Software Practice and Experience | 111 | 14 | 1972-2015 | 0.96 | Q ₂ | 0.897 |
| 4 | Software & Systems Modeling | 29 | 12 | 2005-2014 | 0.83 | Q ₂ | 1.408 |
| 5 | IEEE Transactions on Software Engineering | 48 | 11 | 1975-2014 | 2.19 | Q ₁ | 1.614 |
| 6 | Information and Software Technology | 107 | 10 | 1987-2015 | 1.39 | Q ₂ | 1.046 |
| 7 | Science of Computer Programming | 52 | 9 | 1981-2015 | 0.8 | Q ₃ | 0.715 |
| 8 | Software Quality Journal | 25 | 6 | 1992-1999, 2001-2014 | 1.27 | Q ₂ | 1.143 |
| 9 | Computer Journal | 27 | 5 | 1967-2014 | 0.67 | Q ₁ (SJR) | 0.787 |
| 10 | Empirical Software Engineering | 36 | 5 | 1996-2015 | 1.566 | Q ₁ | 2.161 |
| 11 | Advances in Engineering Software | 28 | 5 | 1980-1985, 1992-2014 | 0.84 | Q ₂ | 1.402 |
| 12 | Computer Standards & Interfaces | 21 | 4 | 1985-2015 | 0.744 | Q ₃ | 0.879 |
| 13 | IEEE Software | 5 | 4 | 1984-2014 | 1.1 | Q ₂ | 1.053 |
| 14 | IET Software | 7 | 4 | 2007-2014 | 0.5 | Q ₂ | N/ A |
| 15 | Informatica | 9 | 3 | 1996-2014 | 0.42 | Q ₂ | 0.873 |
| 16 | International Journal of Software Engineering and Knowledge Engineering | 37 | 3 | 1996-2014 | 0.49 | Q ₄ | 0.362 |
| 17 | Internet Research | 5 | 3 | 1995-2014 | 1.08 | Q ₃ | 1.661 |
| 18 | Journal of Visual Languages and Computing | 15 | 3 | 1990-2015 | 0.56 | Q ₃ | 0.893 |
| 19 | Requirements Engineering | 13 | 3 | 1996, 1998-2002, 2005-2014 | 1.221 | Q ₃ | 0.882 |
| 20 | ACM Transactions on Software Engineering and Methodology | 24 | 2 | 1992-2014 | 1.51 | Q ₂ | 1.17 |
| 21 | Automated Software Engineering | 90 | 2 | 1994-2014 | 1.5 | Q ₁ | 1.733 |
| 22 | Computer Languages, Systems and Structures | 24 | 2 | 2002-2014 | 0.84 | Q ₄ | 0.44 |
| 23 | Computers & Education | 19 | 2 | 1976-2015 | 2.58 | Q ₁ | 2.56 |
| 24 | Computers & Security | 7 | 2 | 1982-2015 | 1.051 | Q ₂ | 1.031 |
| 25 | Formal Aspects of Computing | 7 | 2 | 1989-2014 | 1.31 | Q ₃ | 0.806 |
| 26 | Information Sciences | 5 | 2 | 1968-2014 | 3.29 | Q ₁ | 4.038 |
| 27 | International Journal on Software Tools for Technology Transfer | 19 | 2 | 1997-2014 | 0.81 | Q ₂ (SJR) | N/ A |
| 28 | Journal of Software: Evolution and Process | 16 | 3 | 2012-2014 | 0.570 | Q ₄ | 0.624 |
| 29 | ACM Transactions on Programming Languages and Systems (TOPLAS) | 17 | 1 | 1986-2014 | 2.575 | Q ₃ | 0.897 |
| 30 | Applied Soft Computing | 7 | 1 | 2001-2015 | 2.22 | Q ₁ | 2.81 |
| 31 | Computers in Human Behavior | 25 | 1 | 1985-2015 | 1.58 | Q ₁ | 2.694 |
| 32 | Government Information Quarterly | 1 | 1 | 1984-2014 | 1.203 | Q ₁ | 2.321 |
| 33 | IEEE Transactions on Dependable and Secure Computing | 2 | 1 | 2004-2014 | 1.874 | Q ₂ | 1.351 |
| 34 | IEEE Transactions on Power Systems | 2 | 1 | 1985-2015 | 3.01 | Q ₁ | 2.814 |
| 35 | IEEE Transactions on Systems | 2 | 1 | 2012-2014 | 1.21 | Q ₁ | 2.171 |
| 36 | Innovations in Systems and Software Engineering | 14 | 1 | 2005-2014 | 0.402 | Q ₃ | 1.168 |
| 37 | Interacting with Computers | 16 | 1 | 1989-2014 | 1.02 | Q ₂ | 1.268 |
| 38 | Management Information Systems Quarterly | 1 | 1 | 1980-2014 | 6.18 | Q ₁ | 2.062 |
| 39 | Pattern Analysis and Applications | 4 | 1 | 1998-2015 | 0.483 | Q ₄ | 0.646 |
| 40 | Security and Communication Networks | 5 | 1 | 2009-2015 | 0.449 | Q ₃ | 0.720 |

*N1: Number of papers in the first phase (Before applying the exclusion criteria)

**N2: Number of papers in the second phase (After applying the exclusion criteria)

Table D: Information of the Related Conferences and Workshops

| | Name | N1 | N2 | Rank | Period |
|---|--|----|----|------------------------|--------|
| 1 | The International Conference on Pattern Languages of Programs (PLoP) | 59 | 51 | B (ERA) B3 (Qualis) | 22nd |
| 2 | The European Conference on Pattern Languages of Programs (EuroPLoP) | 46 | 12 | B (ERA) | 21st |
| 3 | OOPSLA | 43 | 22 | A1 (Qualis) | 30th |

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|----|---|-----|----|---|------|
| | | | | A (ERA) 34 (h5-index) | |
| 4 | - ACM/ IEEE International Conference on Model Driven Engineering Languages and Systems (MODELS) - Unified Modeling Language (UML) | 80 | 4 | A2 (Qualis) B (ERA) 26 (h5-index) | 19th |
| 5 | - International Conference on Technology of Object-Oriented Languages and Systems (TOOLS) - International Conference on Objects, Models, Components, Patterns (TOOLS) - International Conference on Technology of Object-Oriented Languages (TOOLS) | 347 | 14 | B1 (Qualis) | 50th |
| 6 | - Working Conference on Reverse Engineering (WCRE) - Software Analysis, Evolution, and Reengineering (SANER) | 56 | 14 | A2 (Qualis) B (ERA) 21 (h5-index) | 23rd |
| 7 | ACM/ IEEE International Symposium on Empirical Software Engineering and Measurement (ESEM) | 22 | 10 | A (ERA) 22 (h5-index) | 10th |
| 8 | ACM/ SIGAPP Symposium on Applied Computing (SAC) | 17 | 5 | A1 (Qualis) B (ERA) 35 (h5-index) | 31st |
| 9 | Advanced Software Engineering & Its Applications (ASEA) | 16 | 7 | 14 (h5-index) | 9th |
| 10 | Annual Hawaii International Conference on System Sciences (HICSS) | 55 | 7 | A1 (Qualis) A (ERA) | 50th |
| 11 | Annual IEEE International Conference and Workshops on the Engineering of Computer Based Systems (ECBS) | 37 | 3 | B1 (Qualis) B (ERA) 13 (h5-index) | 20th |
| 12 | Annual IEEE International Systems Conference (SysCon) | 7 | 2 | C (ERA) 11 (h5-index) | 10th |
| 13 | Annual UK Workshop on Computational Intelligence (UKCI) | 3 | 1 | N/ A | 16th |
| 14 | Asia-Pacific Software Engineering Conference (APSEC) | 76 | 24 | C (ERA) 13 (h5-index) | 23rd |
| 15 | Australasian Software Engineering Conference (ASWEC) | 18 | 1 | B (ERA) | 24th |
| 16 | Conference of the Centre for Advanced Studies on Collaborative Research (CASCON) | 8 | 3 | B1 (Qualis) | 26th |
| 17 | Conference on Software Maintenance and Reengineering (CSMR) | 63 | 19 | A2 (Qualis) C (ERA) 23 (h5-index) | 18th |
| 18 | European Conference on Object-Oriented Programming (ECOOP) | 169 | 45 | A1 (Qualis) A (ERA) 25 (h5-index) | N/ A |
| 19 | Evaluation of Novel Approaches to Software Engineering (ENASE) | 10 | 5 | B4 (Qualis) B (ERA) 7 (h5-index) | 12th |
| 20 | High Performance Computing (HiPC) | 23 | 3 | B1 (Qualis) A (ERA) | N/ A |
| 21 | IEEE Computer Society International Conference on Computers, Software & Applications (COMPSAC) | 94 | 12 | A2 (Qualis) B (ERA) | 40th |
| 22 | IEEE Conference on Software Engineering Education and Training (CSEE&T) | 16 | 2 | C (ERA) 12 (h5-index) | 29th |
| 23 | IEEE International Advance Computing Conference (IACC) | 6 | 1 | 14 (h5-index) | 6th |
| 24 | IEEE International Conference on Computational Science and Engineering (CSE) | 28 | 2 | B4 (Qualis) 11 (h5-index) | 18th |
| 25 | IEEE International Conference on Computer Engineering and Systems (ICCES) | 5 | 1 | N/ A | 10th |
| 26 | IEEE International Conference on Embedded Computing (EmbeddedCom) | 1 | 1 | N/ A | 12th |
| 27 | IEEE International Workshop on Software Technology and Engineering Practice (STEP) | 13 | 6 | B3 (Qualis) | 13th |
| 28 | IEEE/ ACIS International Conference on Computer and Information Science (ICIS) | 29 | 1 | C (ERA) 11 (h5-index) | 15th |
| 29 | IEEE/ ACM International Conference on Automated Software Engineering (ASE) | 35 | 18 | A (ERA) 33 (h5-index) | 31st |
| 30 | International Academic Mindtrek Conference | 6 | 3 | 14 (h5-index) | 17th |
| 31 | International Conference on Advanced Computer Theory and Engineering (ICACTE) | 5 | 2 | 15 (h5-index) | 10th |

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|----|--|----|----|---|------|
| 32 | International Conference on Advanced Information Systems Engineering (CAiSE) | 9 | 5 | A2 (Qualis) A (ERA) 12 (h5-index) | 28th |
| 33 | International Conference on Availability, Reliability and Security (ARES) | 18 | 3 | B1 (Qualis) B (ERA) 19 (h5-index) | 11th |
| 34 | International Conference on Computational Intelligence and Software Engineering (CiSE) | 12 | 2 | C (ERA) 11 (h5-index) | 7th |
| 35 | International Conference on Coordination Models and Languages (Coordination) | 6 | 0 | A (ERA) | N/ A |
| 36 | International Conference on Dependable, Autonomic and Secure Computing (DASC) | 23 | 1 | B3 (Qualis) C (ERA) | 14th |
| 37 | International Conference on Engineering of Complex Computer Systems (ICECCS) | 26 | 4 | B1 (Qualis) A (ERA) 10 (h5-index) | 20th |
| 38 | International Conference on Enterprise Information Systems (ICEIS) | 30 | 3 | B1 (Qualis) C (ERA) 12 (h5-index) | 18th |
| 39 | International Conference on Fundamental Approaches to Software Engineering (FASE) | 10 | 5 | A2 (Qualis) B (ERA) | 19th |
| 40 | International Conference on Quality Software (ICQS) | 27 | 6 | B1 (Qualis) B (ERA) 15 (h5-index) | 18th |
| 41 | International Conference on Semantic Computing (ICSC) | 15 | 2 | B2 (Qualis) 18 (h5-index) | 10th |
| 42 | International Conference on Software Engineering (ICSE) | 68 | 22 | A1 (Qualis) A (ERA) | 39th |
| 43 | International Conference on Software Engineering Advances (ICSEA) | 30 | 7 | B3 (Qualis) C (ERA) | 10th |
| 44 | International Conference on Software Engineering and Applications (ICSOFT) | 50 | 6 | B4 (Qualis) B (ERA) | 11th |
| 45 | International Conference on Software Engineering and Formal Methods (SEFM) | 9 | 2 | B1 (Qualis) B (ERA) 16 (h5-index) | 14th |
| 46 | International Conference on Software Engineering and Knowledge Engineering (SEKE) | 53 | 6 | B1 (Qualis) B (ERA) 11 (h5-index) | 28th |
| 47 | International Conference on Software Engineering and Service Science (ICSESS) | 26 | 7 | 13 (h5-index) | 7th |
| 48 | International Conference on Software Engineering Research and Practice (SERP) | 18 | 2 | B2 (Qualis) | 14th |
| 49 | International Conference on Software Engineering Research, Management & Applications (SERA) | 17 | 3 | B3 (Qualis) C (ERA) 10 (h5-index) | 14th |
| 50 | International Conference on Software Engineering, Artificial Intelligence, Networking and Parallel/ Distributed Computing (SNPD) | 14 | 4 | C (ERA) | 17th |
| 51 | International Conference on Software Maintenance and Evolution (ICSME) | 13 | 12 | N/ A | 31st |
| 52 | International Conferences on Pervasive Patterns and Applications (PATTERNS) | 6 | 3 | N/ A | 8th |
| 53 | International Joint Conference on Artificial Intelligence (IJCAI) | 5 | 3 | A1 (Qualis) A (ERA) 43 (h5-index) | 25th |
| 54 | International Requirements Engineering Conference (RE) | 12 | 3 | 23 (h5-index) | 24th |
| 55 | International Software Metrics Symposium (swmetrics) | 6 | 3 | N/ A | 11th |
| 56 | International Symposium on Service-Oriented System Engineering (SOSE) | 5 | 4 | B2 (Qualis) | N/ A |
| 57 | International Symposium on the Foundations of Software Engineering (FSE) | 14 | 6 | A (ERA) | 24th |
| 58 | International Symposium on Theoretical Aspects of Software Engineering (TASE) | 8 | 2 | B3 (Qualis) C (ERA) | 10th |
| 59 | international working conference on source code analysis and manipulation (SCAM) | 20 | 1 | B3 (Qualis) C (ERA) 13 (h5-index) | 16th |
| 60 | International Workshop on Database and Expert Systems Applications (DEXA) | 35 | 5 | B1 (Qualis) B (ERA) 15 (h5-index) | 26th |

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|----|--|----|---|---|------|
| 61 | International Workshop on Security in Information Systems (WOSIS) | 1 | 0 | C (ERA) | 17th |
| 62 | Panhellenic Conference on Informatics (PCI) | 8 | 4 | 9 (h5-index) | 20th |
| 63 | SIGPLAN-SIGSOFT workshop on Program analysis for software tools and engineering (PASTE) | 3 | 1 | B (ERA) | 11th |
| 64 | Software Engineering Workshop (SEW) | 13 | 6 | B2 (Qualis) C (ERA) | 36th |
| 65 | The ACM SIGPLAN conference on Systems, Programming, Languages and Applications: Software for Humanity (SPLASH) | 1 | 1 | 12 (h5-index) | 30th |
| 66 | The IEEE International Conference on Information Reuse and Integration (IRI) | 30 | 7 | B2 (Qualis) 11 (h5-index) | 17th |
| 67 | The International Conference on Program Comprehension (ICPC) | 27 | 4 | A2 (Qualis) C (ERA) 22 (h5-index) | 23th |
| 68 | The International Conference on the Quality of Information and Communications Technology (QUATIC) | 12 | 5 | B4 (Qualis) | 10th |

Table E: Researchers

| Name | Country | Home Page | Name | Country | Home Page | Name | Country | Home Page |
|-----------------------|----------------------|--|----------------------------|---------|--|---------------------------|---------|---|
| Yann-Gaël Guéhéneuc | Canada - France |  | Hong Zhu | UK |  | Douglas C. Schmidt | USA |  |
| Marko Zanon | Italy |  | Nikolaos Tsantalis | Canada |  | Ian Bayley | UK |  |
| Jing Dong | USA |  | Giuliano (Giulio) Antoniol | Canada |  | Eduardo B. Fernández | USA |  |
| Ghulam Rasool | Pakistan |  | Giuseppe Di Lucca | Italy |  | Francesca Arcelli Fontana | Italy |  |
| Apostolos Ampatzoglou | Greece - Netherlands |  | Yajing Zhao | USA |  | Stefano Maggioni | Italy |  |
| Zhang Cheng | China |  | Patrick Mäder | Germany |  | | | |

Table F: Data Extracted for the Evaluation Phase

| Param. Name | Papers | Paper Info* |
|---------------------|--|-------------|
| Yann-Gaël Guéhéneuc | An empirical study of the relationships between design pattern roles and class change proneness | Existed |
| | Instantiating and detecting design patterns: Putting bits and pieces together | Existed |
| | Using design patterns and constraints to automate the detection and correction of inter-class design defects | Existed |
| | Do Design Patterns Impact Software Quality Positively? | Existed |
| | Evaluating the impact of design pattern and anti-pattern dependencies on changes and faults | Existed |
| | Mining the relationship between anti-patterns dependencies and fault-proneness | Existed |
| | Domain matters: bringing further evidence of the relationships among anti-patterns, application domains, and quality-related metrics in java mobile apps | Existed |
| | A Study on the Relation between Antipatterns and the Cost of Class Unit Testing | Existed |
| | Ptidej: A flexible reverse engineering tool suite | Existed |
| | Identification of design motifs with pattern matching algorithms | Existed |
| | Evaluating the use of design patterns during program comprehension—experimental setting | Existed |
| | DEQUALITE: building design-based software quality models | Existed |
| | Design Pattern Application: Pure-Generative Approach vs. Conservative-Generative Approach | Existed |
| | A Taxonomy and a First Study of Design Pattern Defects | Existed |
| | Playing roles in design patterns: An empirical descriptive and analytic study | Existed |
| | DeMIMA: A Multilayered Approach for Design Pattern Identification | Existed |
| | An exploratory study of the impact of anti-patterns on class change-and fault-proneness | Existed |
| | From a domain analysis to the specification and detection of code and design smells | Existed |
| | P-MARt: Pattern-like Micro Architecture Repository | Existed |
| | Improving design-pattern identification: a new approach and an exploratory study | Existed |
| | An empirical study on the efficiency of different design pattern representations in UML class diagrams | Existed |
| | Meta-modeling design patterns: Application to pattern detection and code synthesis | Included |
| | Using explanations for design-patterns identification | Included |
| | A domain analysis to specify design defects and generate detection algorithms | Included |
| | Ptidej: Promoting patterns with patterns | Included |

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|-----------------------|---|----------|
| | Design patterns: A round-trip | Included |
| | Correction of high-level design defects with refactorings | Included |
| | A reverse engineering tool for precise class diagrams | Included |
| Marko Zanoni | On applying machine learning techniques for design pattern detection | Existed |
| | DPB: A benchmark for design pattern detection tools | Existed |
| | Using design pattern clues to improve the precision of design pattern detection tools | Existed |
| | A tool for design pattern detection and software architecture reconstruction | Existed |
| | Pattern detection for conceptual schema recovery in data-intensive systems | Existed |
| Jing Dong | UML extensions for design pattern compositions | Existed |
| | Design pattern detection by template matching | Existed |
| | Pattern-based design evolution using graph transformation | Existed |
| | A pattern-based approach to structural design composition | Existed |
| | DP-Miner: Design pattern discovery using matrix | Existed |
| | Ensuring structure and behavior correctness in design composition | Existed |
| | A model transformation approach for design pattern evolutions | Existed |
| | Classification of design pattern traits | Existed |
| | Design pattern evolutions in QVT | Existed |
| | A behavioral analysis and verification approach to pattern-based design composition | Existed |
| | Visualizing design patterns in their applications and compositions | Existed |
| | Extending UML to Visualize Design Patterns in Class Diagrams | Existed |
| | Model Checking Security Pattern Compositions | Existed |
| | Evolving design patterns based on model transformation | Existed |
| | Automated verification of security pattern compositions | Existed |
| | Commutability of design pattern instantiation and integration | Existed |
| | A Matrix-Based Approach to Recovering Design Patterns | Existed |
| | A Classification of Design Pattern Evolutions | Existed |
| | Verifying Behavioral Correctness of Design Pattern Implementation | Existed |
| | A formal framework for design component contracts | Existed |
| | XSLT-based evolutions and analyses of design patterns | Existed |
| | On instantiation and integration commutability of design pattern | Included |
| | Service oriented evolutions and analyses of design patterns | Included |
| | A Transformational Approach to Structural Design Assessment and Change | Included |
| Ghulam Rasool | Design pattern recovery based on annotations | Existed |
| | Towards A Catalogue of Design Patterns Variants | Existed |
| | Flexible design pattern detection based on feature types | Existed |
| Apostolos Ampatzoglou | A methodology to assess the impact of design patterns on software quality | Existed |
| | An empirical investigation on the reusability of design patterns and software packages | Existed |
| | Building and mining a repository of design pattern instances: Practical and research benefits | Existed |
| | The Effect of GoF Design Patterns on Stability: A Case Study | Existed |
| | Evaluation of object-oriented design patterns in game development | Existed |
| | An Empirical Study on Design Pattern Usage on Open-Source Software | Included |
| | An empirical investigation on the impact of design pattern application on computer game defects | Included |
| | Design Pattern Alternatives: What to do when a GoF pattern fails | Included |
| | Investigating the use of object-oriented design patterns in open-source software: A case study | Included |
| Zhang Cheng | A comparative study on the effectiveness of patterns in software libraries and standalone applications | Included |
| | Using a follow-on survey to investigate why use of the visitor, singleton and facade design patterns is controversial | Existed |
| | Merged Request: A New Design Pattern for Enhancing the Performance of Concurrent Access | included |
| Hong Zhu | Formal specification of the variants and behavioural features of design patterns | Existed |
| | Formalizing Design Patterns in Predicate Logic | Existed |
| | An algebra of design patterns | Existed |
| | On the Composition of Design Patterns | Existed |
| | Tool Support for Design Pattern Recognition at Model Level | Existed |
| | A formal language for the expression of pattern compositions | Existed |
| | Specifying Behavioral Features of Design Patterns in First Order Logic | Existed |
| Nikolaos | On the Composability of Design Patterns | Existed |
| | Design pattern detection using similarity scoring | Existed |

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|----------------------------|---|-----------|
| Tsantalis | An empirical study on students' ability to comprehend design patterns | Existed |
| | Architectural Risk Analysis of Software Systems Based on Security Patterns | Existed |
| | A Novel Approach to Automated Design Pattern Detection | Included |
| Giuliano (Giulio) Antoniol | Using metrics to identify design patterns in object-oriented software | Existed |
| | Object-oriented design patterns recovery | Existed |
| | An empirical study of the relationships between design pattern roles and class change proneness | Duplicate |
| | DeMIMA: A Multilayered Approach for Design Pattern Identification | Duplicate |
| | Inference of object-oriented design patterns | Existed |
| | Playing roles in design patterns: An empirical descriptive and analytic study | Duplicate |
| | An exploratory study of the impact of anti-patterns on class change-and fault-proneness | Duplicate |
| | A Study on the Relation between Antipatterns and the Cost of Class Unit Testing | Duplicate |
| | Linguistic anti-patterns: what they are and how developers perceive them | Existed |
| | Sub-graph mining: identifying micro-architectures in evolving object-oriented software | Existed |
| Giuseppe Di Lucca | Recovering Interaction Design Patterns in Web Applications | Existed |
| | Integrating Model Driven and Model Checking to Mine Design Patterns | Existed |
| | Declarative design pattern-based development using aspect oriented programming | Existed |
| | An Aspect-Oriented Framework for Flexible Design Pattern-based Development | Existed |
| | Design pattern detection using a DSL-driven graph matching approach | Existed |
| | Mining Design Patterns in Object-Oriented Systems by a Model-Driven Approach | Existed |
| | A model-driven graph-matching approach for design pattern detection | Existed |
| | Improving Design Patterns Modularity Using Aspect Orientation | Existed |
| | Improving design pattern quality using aspect orientation | Existed |
| | Model-driven detection of Design Patterns | Existed |
| Yajing Zhao | Design pattern detection by template matching | Duplicate |
| | DP-Miner: Design pattern discovery using matrix | Duplicate |
| | Model Checking Security Pattern Compositions | Duplicate |
| | Automated verification of security pattern compositions | Duplicate |
| | A Matrix-Based Approach to Recovering Design Patterns | Duplicate |
| | Verifying Behavioral Correctness of Design Pattern Implementation | Duplicate |
| | XSLT-based evolutions and analyses of design patterns | Duplicate |
| | On instantiation and integration commutability of design pattern | Duplicate |
| Patrick Mäder | Design pattern recovery based on annotations | Duplicate |
| | Flexible design pattern detection based on feature types | Duplicate |
| | Pattern-based auto-completion of UML modeling activities | Existed |
| | Variability points and design Pattern Usage in architectural tactics | Included |
| Douglas C. Schmidt | Leader/followers-a design pattern for efficient multi-threaded event demultiplexing and dispatching | Existed |
| | Virtual component: a design pattern for memory-constrained embedded applications | Existed |
| | Applying patterns to improve the performance of fault-tolerant CORBA | Included |
| Ian Bayley | Formal specification of the variants and behavioural features of design patterns | Duplicate |
| | Formalizing Design Patterns in Predicate Logic | Duplicate |
| | On the Composition of Design Patterns | Duplicate |
| | Tool Support for Design Pattern Recognition at Model Level | Duplicate |
| | A formal language for the expression of pattern compositions | Duplicate |
| | Specifying Behavioral Features of Design Patterns in First Order Logic | Duplicate |
| | On the Composability of Design Patterns | Duplicate |
| Eduardo B. Fernández | Enterprise security pattern: a new type of security pattern | Existed |
| | Enterprise security pattern: a model-driven architecture instance | Existed |
| | Security patterns and requirements for Internet-based applications | Included |
| | Analysis of Application of Security Patterns to Build Secure Systems | Included |
| Francesca Arcelli Fontana | A tool for design pattern detection and software architecture reconstruction | Duplicate |
| | DPB: A benchmark for design pattern detection tools | Duplicate |
| | Using design pattern clues to improve the precision of design pattern detection tools | Duplicate |
| | On applying machine learning techniques for design pattern detection | Duplicate |
| | Metrics and antipatterns for software quality evaluation | Included |
| Stefano Maggioni | Understanding the relevance of micro-structures for design patterns detection | Existed |
| | Using design pattern clues to improve the precision of design pattern detection tools | Duplicate |
| | Metrics and antipatterns for software quality evaluation | Duplicate |

* Existed: papers in the overlap between the QGS and the set of included papers.

Included: new found papers which should be included.

Duplicate: Papers which are considered before (common between two authors in the table).

REFERENCES

- Aljasser, K.: Implementing design patterns as parametric aspects using ParaAJ: The case of the singleton, observer, and decorator design patterns. *Computer Languages, Systems & Structures* 45, 1-15 (2016)
- Ampatzoglou, A., Charalampidou, S., Stamelos, I.: Research state of the art on GoF design patterns: A mapping study. *Journal of Systems and Software* 86(7), 1945-1964 (2013)
- Ampatzoglou, A., Kritikos, A., Kakarontzas, G., Stamelos, I.: An empirical investigation on the reusability of design patterns and software packages. *Journal of Systems and Software* 84(12), 2265-2283 (2011)
- Ampatzoglou, A., Chatzigeorgiou, A., Charalampidou, S., Avgeriou, P.: The Effect of GoF Design Patterns on Stability: A Case Study. *IEEE Transactions on Software Engineering* 41(8), 781-802 (2015)
- Ampatzoglou, A., Michou, O., Stamelos, I.: Building and mining a repository of design pattern instances: Practical and research benefits. *Entertainment Computing* 4(2), 131-142 (2013)
- Arksey, O'Malley, L.: Scoping studies: towards a methodological framework. *International Journal of Social Research Methodology* 8(1), 19-32 (2005)
- Bai, J., Luo, H., Qin, F.: Design pattern modeling and extraction for CAD models. *Advances in Engineering* 93, 30-43 (2016)
- Biolchini J., Mian, P. G., Natali, A. C., Travassos, G. H.: Systematic review in software engineering. Technical report ES67905, University of Rio de Janeiro (2005)
- Blewitt, A., Bundy, A., Stark, I.: Automatic verification of Java design patterns. In: *Proceedings of 16th Annual International Conference on Automated Software Engineering*, pp. 324-327. IEEE, California (2001)
- Bouassida, N., Ben-Abdallah, H., Issaoui, I.: Evaluation of an automated multi-phase approach for patterns discovery. *International Journal of Software Engineering and Knowledge Engineering* 23(10), 1367-1398 (2013)
- Budgen, D., Turner, M., Brereton, P., Kitchenham, B.: Using mapping studies in software engineering. In: *Proceedings of the 20th Annual Meeting of the Psychology of Programming Interest Group*, pp. 195-204. Lancaster University, Lancaster (2008)
- C2 Wiki: Design Patterns, <http://c2.com/cgi/wiki?DesignPatterns> (accessed September 17, 2016)
- Cacho, N., Sant'anna, C., Figueiredo, E., Dantas, F., Garcia, A., Batista, T.: Blending design patterns with aspects: A quantitative study. *Journal of Systems and Software* 98, 117-139 (2014)
- Dong, J.: UML Extensions for Design Pattern Compositions. *Journal of Object Technology* 1(5), 151-163 (2002)
- Dong, J., Alencar, P., Cowan, D., Yang, S.: Composing pattern-based components and verifying correctness. *Journal of Systems and Software* 80(11), 1755-1769 (2007)
- Dong, J., Yang, S., Zhang, K.: Visualizing design patterns in their applications and compositions. *IEEE Transactions on Software Engineering* 33(7), 433-453 (2007)
- Dong, J., Alencar, P. S., Cowan, D. D.: A behavioral analysis and verification approach to pattern-based design composition. *Software and Systems Modeling* 3(4), 262-272 (2004)
- Dyba, T., Kitchenham, B. A., Jørgensen, M.: Evidence-Based Software Engineering for Practitioners. *IEEE Software* 22(1), 58-65 (2005)
- Elish, M. O., Mohammed, M. A.: Quantitative analysis of fault density in design patterns: An empirical study. *Information and Software Technology* 66, 58-72 (2015)
- Febrero, F., Calero, C., Moraga, M.: A Systematic Mapping Study of Software Reliability Modeling. *Information and Software Technology* 56(8), 839-849 (2014)
- Felizardo, K. R., Mendes, E., Kalinowski, M., Souza, E. F., Vijaykumar, N. L.: Using Forward Snowballing to update Systematic Reviews in Software Engineering. *International Symposium on Empirical Software Engineering and Measurement (ESEM)*, (2016)
- Fernandez, E. B., La Red, D. L., Peláez, J. I.: A conceptual approach to secure electronic elections based on patterns. *Government Information Quarterly* 30(1), 64-73 (2013)
- Fortuin, H.: A Modern, Compact Implementation of the Parameterized Factory Design Pattern. *Journal of Object Technology* 9(1), 57-63 (2010)
- Gaitani, M. A. G., Zafeiris, V. E., Diamantidis, N., Giakoumakis, E. A.: Automated refactoring to the Null Object design pattern. *Information and Software Technology* 59(C), 33-52 (2015)
- Gamma, E., Helms, R., Johnson, R., Vlissides, J.: *Design Patterns: Elements of Reusable Object-Oriented Software*. Addison-Wesley, USA (1995)
- Griffith, I., Izurieta, C.: Design pattern decay: the case for class grime. In: *Proceedings of the 8th ACM/ IEEE International Symposium on Empirical Software Engineering and Measurement*, pp. 1-4. ACM, Torino (2014)
- Hafiz, M., Adamczyk, P., Johnson, R.: Organizing Security Patterns. *IEEE Software* 24(4), 52-60 (2007)
- Hafiz, M.: A pattern language for developing privacy enhancing technologies. *Software: Practice and Experience* 43(7), 769-787 (2013).
- Halkidis, S. T., Chatzigeorgiou, A., Stephanides, G.: A qualitative analysis of software security patterns. *Computers & Security* 25(5),

379-392 (2006)

- Hamza, H. S.: Improving analysis patterns reuse: an ontological approach. In *Proceedings of Ontologies as Software Engineering Artifacts Workshop*, pp. 24-28. OOPSLA, Vancouver (2004)
- Hasheminejad, S. M. H., Jalili, S.: Design patterns selection: An automatic two-phase method. *Journal of Systems and Software* 85, 408-424 (2012)
- Jaafar, F., Guéhéneuc, Y. G., Hamel, S., Khomh, F., Zulkernine, M.: Evaluating the impact of design pattern and anti-pattern dependencies on changes and faults. *Empirical Software Engineering* 21(3), 896-931 (2016)
- Jalali, S., Wohlin, C.: Systematic literature studies: database searches vs. backward snowballing. In: *Proceedings of the ACM-IEEE international symposium on Empirical software engineering and measurement*, pp. 29-38. ACM, Lund (2012)
- Kerievsky, J.: *Refactoring to patterns*. Addison-Wesley Professional, USA (2005)
- Kienzle, J., Romanovsky, A.: Framework based on design patterns for providing persistence in object-oriented programming languages. *IEEE Proceedings-Software* 149(3), 77-85 (2002).
- Kim, D., Shen, W.: Evaluating pattern conformance of UML models: a divide-and-conquer approach and case studies. *Software Quality Journal* 16(3), 329-359 (2008)
- Kim, S. K., Carrington, D.: A formalism to describe design patterns based on role concepts. *Formal Aspects of Computing* 21, 397-420 (2009)
- Kitchenham, B. A.: Procedures for performing systematic reviews. Technical Report TR/ SE-0401 and NICTA Technical Report 040001T.1, Keele University (2004)
- Kitchenham, B. A., Pretorius, R., Budgen, D., Brereton, O. P., Turner, M., Niazi, M., Linkman, S.: Systematic literature reviews in software engineering—A tertiary study. *Information and Software Technology* 52(8), 792-805 (2010)
- Kitchenham, B. A., Budgen, D., Brereton, O.P.: Using Mapping Studies as the Basis for Further Research—A Participant- Observer Case Study. *Information and Software Technology*, special section from EASE 53(4), 638-651 (2011)
- Kitchenham, B. A., Charters, S.: *Guidelines for performing Systematic Literature Reviews in Software Engineering*. Version 2.3, EBSE Technical Report EBSE-2007-01, Keele University and University of Durham (2007)
- Lano, K., Kolahdouz-Rahimi, S.: Model-transformation design patterns. *IEEE Transaction on Software Engineering* 40(12), 1224-1259 (2014)
- Li, Z., Paris, A., Peng, L.: A systematic mapping study on technical debt and its management. *Journal of Systems and Software* 101, 193-220 (2015).
- Lyon, D., Castellanos, F.: The Parametric Singleton Design Pattern. *Journal of Object and Technology* 6(3), 13-23 (2007)
- Massingill, B. L., Mattson, T. G., Sanders, B. A.: Parallel programming with a pattern language. *International Journal on Software Tools for Technology Transfer* 3(2), 217-234 (2001).
- Najari, A., Dubois, S., Barth, M., Sonntag, M.: From Altshuller to Alexander: Towards a Bridge between Architects and Engineers. *Procedia CIRP* 39, 119-124 (2016).
- Nilsson, E.: Design patterns for user interface for mobile applications. *Advances in Engineering Software* 40(12), 1318-1328 (2009)
- Noyons, C.M.E., Buter, K.R., van Raan, F.J.A., Schwechheimer, H., Winterhager, M., Weingart, P.: *The Role of Europe in World-Wide Science and Technology. Monitoring and Evaluation in a Context of Global Competition*, (2000).
- Pati, T., Hill, J.: A survey report of enhancements to the visitor software design pattern. *Software: Practice and Experience* 44(6), 699-733 (2012)
- Pauwels, S., Hübscher, C., Bargas-Avila, J., Opwis, K.: Building an interaction design pattern language: A case study. *Computers in Human Behavior* 26(3), 452-463 (2010)
- Petersen, K., Vakkalanka, S., Kuzniarz, L.: Guidelines for conducting systematic mapping studies in software engineering: An update. *Information and Software Technology* 64, 1-18 (2015)
- Petersen, K., Feldt, R., Mujtaba, S., Mattsson, M.: Systematic mapping studies in software engineering. In: *12th International Conference on Evaluation and Assessment in Software Engineering*, pp. 68-77. University of Bari, Bari (2008)
- Porras, G. C., Guéhéneuc, Y. G.: An empirical study on the efficiency of different design pattern representations in UML class diagrams. *Empirical Software Engineering* 15(5), 493-522 (2010)
- Riaz, M., Breaux, T., Williams, L.: How have we evaluated software pattern application? A systematic mapping study of research design practices. *Information and Software Technology* 65, 14-38 (2015)
- Rossi, B., Russo, B.: Evolution of design patterns: a replication study. In: *Proceedings of the 8th ACM/ IEEE International Symposium on Empirical Software Engineering and Measurement*, pp. 38-42. ACM, Torino (2014)
- Sarun, I., Weenawadee, M.: Retrieving model for design patterns. *ECTI Transactions on Computer and Information Technology* 3(1), 51-55 (2007)
- Scanniello, G., Gravino, C., Risi, M., Tortora, G., Doderio, G.: Documenting design-pattern instances: a family of experiments on source-code comprehensibility. *ACM Transactions on Software Engineering and Methodology* 24(3), 1-35 (2015)
- Schanz, T., Izurieta, C.: Object oriented design pattern decay: a taxonomy. In: *Proceedings of the 2010 ACM-IEEE International Symposium on Empirical Software Engineering and Measurement*, pp. 1-8. ACM, Bolzano-Bozen (2010)
- SCImago Journal and Country Rank. <http://www.scimagojr.com> (accessed August 31, 2016)
- Tofan, D., Galster, M., Aygeriou, P., Schuitema, W.: Past and future of software architectural decisions—A systematic mapping study. *Information and Software Technology* 56(8), 850-872 (2014).
- Tsai, W. T., Wu, B., Jin, Z., Huang, Y., Li, W.: Ontology patterns for service-oriented software development. *Software: Practice and Experience* 43(7), 867-883 (2013)
- Ujhelyi, Z., Szőke, G., Horváth, A., Csizsár, N. I., Vidács, L., Varró, D., et al.: Performance comparison of query-based techniques for

- anti-pattern detection. *Information and Software Technology* 65, 147-165 (2015)
- Uzunov, A. V., Fernandez, E. B., Falkner, K.: ASE: a comprehensive pattern-driven security methodology for distributed systems. *Computer Standards & Interfaces* 41, 112-137 (2015)
- Van-Hilst, M., Fernandez, E. B., Braz, F.: A multi-dimensional classification for users of security patterns. *Journal of Research and Practice in Information Technology* 41(2), 89-98 (2009)
- Wen-Jin, L., Ju-long, P., Kang-Jian, W.: Research on Detecting Design Pattern Variants from Source Code Based on Constraints. *International Journal of Hybrid Information Technology* 8(5), 63-72 (2015)
- Yu, D., Zhang, Y., Chen, Z.: A comprehensive approach to the recovery of design pattern instances based on sub-patterns and method signatures. *Journal of Systems and Software* 103, 1-16 (2015)
- Zanoni, M., Fontana, F. A., Stella, F.: On applying machine learning techniques for design pattern detection. *Journal of Systems and Software* 103, 102-117 (2015)
- Zdun, U.: Systematic pattern selection using pattern language grammars and design space analysis. *Software-Practice and Experience* 37(9), 983-1016 (2007)
- Zhang, C., Budgen, D.: What Do We Know about the Effectiveness of Software Design Patterns? *IEEE Transactions on Software Engineering* 38(5), 1213-1231 (2012)
- Zhang, C., Budgen, D.: A survey of experienced user perceptions about software design patterns. *Information and Software Technology* 55(5), 822-835 (2013)
- Zhang, H., Babar, M.A., Tell, P.: Identifying relevant studies in software engineering. *Information and Software Technology* 53(6), 625-637 (2011)
- Zhao, L., et al.: A pattern language for designing e-business architecture. *Journal of Systems and Software* 81(8), 1272-1287 (2008)
- Zhu, H., Bayley, I.: An algebra of design patterns. *ACM Transactions on Software Engineering and Methodology* 22(3), 1-35 (2013)

Abbas Rasoolzadegan has received his B.Sc. degree in Software Engineering from Aeronautical University, Tehran, Iran, in 2004. He has also received M.Sc. and Ph.D. degrees in Software Engineering from Amirkabir University of Technology, Tehran, Iran, respectively in 2007 and 2013. He is currently an Assistant Professor with the Computer Engineering Department of Ferdowsi University of Mashhad. His main research focus is on software quality engineering, especially in terms of design patterns and refactoring. For more details see the SQLab homepage: <http://sqlab.um.ac.ir>.

Bahareh Bafandeh Mayvan is currently Ph.D. candidate in software engineering at Ferdowsi University of Mashhad (FUM). She received her B.Sc. degree in computer engineering from FUM in 2010 and her M.Sc. degree in computer engineering from University of Tehran in 2014. Her current research efforts include software quality engineering, graph theory, design patterns, and image processing.

Zahra Ghavidel Yazdi is master student in software engineering at Ferdowsi University of Mashhad (FUM). She received her B.Sc. degree in Computer Engineering from FUM and she is currently working on software quality engineering at Software Quality Lab (SQL) in FUM.