TQPropRefiner: Interactive Comprehension and Refinement of Specifications on Transient Software Quality Properties

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Abstract. Microservice-based systems are exposed to transient behavior caused, for example, by (frequent) deployments, failures, or self-adaption. The potential complexity of transient behavior scenarios makes specifying flawless transient behavior requirements challenging. Still, the required approaches and tooling to comprehend transient behavior and refine the requirements are lacking.
This paper aims to address this gap by providing a structured interactive approach that assists software architects in comprehending transient behavior and refining requirements. The prototypically implemented TQPropRefiner allows specifying transient behavior requirements using Property Specification Patterns (PSP). Then, TQPropRefiner uses runtime verification to evaluate requirement satisfaction on time-series data, e.g., from Chaos Experiments. TQPropRefiner visualizes the system's behavior and requirement satisfaction to foster comprehension. Based on the gathered insights, users can refine their requirements. In particular, TQPropRefiner currently supports refining timing constraints and simple predicates. Finally, we evaluated the feasibility and practical applicability of our early approach in a qualitative user study with five industry experts. All participants could interpret the results, and four solved the refinement task successfully. Despite currently limited support of PSP and refinement strategies, the preliminary results indicate that the approach can facilitate understanding transient behavior requirements among software architects and assist in the refinement process. Thus, our work is a first step toward facilitating the comprehension of transient behavior and refinement of requirements.

Keywords: Transient Behavior · Requirements · Comprehension · Refinement · Property Specification Patterns.

1 Introduction

In the last decade, major software companies have tended to deploy large applications in the cloud as small (micro-)services and benefited from greater

agility, reduced complexity, and more effective application scaling in cloud environments [27]. Due to their flexibility, microservice-based software systems are suitable for operating under frequent changes, e.g., load peaks, autoscaling, (re-)deployments, or failures. Changes in a software system usually temporarily affect the quality properties of a software system, e.g., response times increase due to a service failure. The term *transient behavior* denotes the system's behavior during the phase in which the system is not in a steady state. While it is theoretically possible to minimize transient behavior, it is practically infeasible as, for example, costly overprovisioning of resources would be necessary. Furthermore, external and unexpected events like load peaks and service failures can hardly be avoided. Thus, in practice, transient behavior is often accepted.

In an interview with experienced software engineers [4], we previously investigated whether transient behavior should be specified. Most experts stated it makes sense to specify requirements regarding transient behavior for critical systems explicitly. In such cases, it is important to make quality requirements and expectations regarding transient behavior explicit and to (in-)validate them [12]. For example, a too-long service recovery time may lead to customer frustration. Furthermore, disproving the expectation of the reaction time of an autoscaler can indicate severe problems in the system design and configuration.

However, flawlessly specifying transient behavior is challenging. This is due to the complexity involved in the changes triggering transient behavior and the dynamic nature of transient behavior. When eliciting resilience scenarios in previous work [16], we found that software architects were interested in validating that their resilience mechanisms proved helpful when transient behavior occurs, e.g., "autoscaling will be helpful". One challenge is that specifying exact parameter values involves a lot of uncertainty among software architects, i.e., they often do not know whether their overall specification is feasible. Another challenge is that user feedback must be considered to decide what transient behavior is acceptable. Thus, learning from validating and refining the requirements is necessary. Approaches like Chaos Engineering [2] — building hypotheses and experimenting on the system to (in-)validate them — tackle this problem through an iterative refinement process. However, they are unspecific in guiding comprehension and refinement with strategies and methods. Furthermore, as shown in previous work [4], there is a general lack of proper tooling to address transient behavior.

This paper presents our approach to comprehension of transient behavior and refinement of transient behavior requirements, which is an elemental part of our envisioned approach for continuous specification, verification, and refinement of resilience scenarios [14]. Thus, the presented approach aims at software architects of (business-)critical systems who want to increase confidence in their system's response to transient behavior. For single transient behavior occurrences of interest, our approach aims to help software architects decide whether and to what degree transient behavior requirements must be weakened or strengthened in cases where the initial specification turns out to be flawed or is reconsidered in the light of new information.

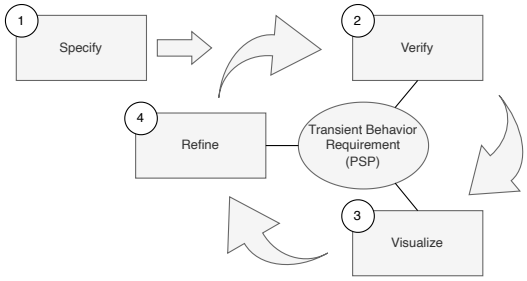


Fig. 1: Simplified overview of TQPropRefiner's refinement process.

The general process of our approach is depicted in Figure 1. As a formalism for specifying requirements, we use Property Specification Patterns (PSP) [1] to transform human-readable Structured English Grammar (SEG) specifications into testable Metric Temporal Logic (MTL) [23] formulas. TQPropRefiner — the early prototypical implementation of our approach — guides software architects through the three steps of (i) specifying transient behavior requirements using PSP, (ii) verifying the requirements against runtime data using runtime verification [25], (iii) presenting the requirement satisfaction using visualizations, and (iv) refining the requirements by altering time constraints or thresholds in simple predicates. Regarding refinement, our approach assists in finding satisfaction thresholds for both satisfied and unsatisfied requirements.

We conducted an expert user study with five industry participants to gather early feedback on our approach and TQPropRefiner, despite limitations in the supported PSP and refinement strategies. The participants had to solve two tasks regarding comprehension and refinement capabilities of TQPropRefiner, answer a questionnaire, and participate in an interview. The participants were able to solve the tasks, and their answers indicate that our approach was easy to use. We implemented several suggestions by the participants, e.g., alignment of the shown visualizations and initial integration with monitoring systems. However, further improvements are necessary for use in practice, e.g., closer integration with monitoring systems and persistence of specified requirements. Furthermore, the time constraint refinement needs more explanation.

In summary, the contributions of this paper comprise:

- An approach and tool (TQPropRefiner) that fosters comprehension of transient behavior to facilitate specification and refinement of transient behavior requirements. We make TQPropRefiner publicly available [7].
- Our vision and initial concept of refining transient behavior requirements. In particular, the implementation of time constraint and predicate threshold refinement strategies.
- The evaluation of our approach regarding feasibility and practicability in an expert user study. We provide the used documents and (anonymized) results as part of the supplementary material [13].

The remainder of this paper is structured as follows. Section 2 introduces the foundations used in this work, i.e., transient behavior and PSP. Next, Section 3 discusses the most relevant related works. Section 4 introduces our concept and the TQPropRefiner prototype, while Section 5 presents and discusses its evaluation by an expert user study. Finally, Section 6 summarizes this work.

2 Background

We first introduce Transient Behavior (see Section 2.1), for which we aim to acquire specifications. Then, we outline Property Specification Patterns (see Section 2.2), which we use as a formalism for our specifications.

2.1 Transient Behavior

Microservice-based software systems are usually complex and interdependent. Changes, e.g., failures, deployments, or self-adaptation, in one or more services may cause a system to transition from one steady state to another. This shift of states is described by the term transient behavior [5]. The concept of transient behavior originates from the field of electrical engineering. Within the state-space system model, there are two kinds of behavior: steady-state and transient. By performing transient analysis, it is possible to gain insight into the time-varying behavior of a system's Quality of Service (QoS) [28].

Since transient behavior is not focused on particular quality attributes and change types, it subsumes more specific concepts dealing with dynamic system behavior, e.g., survivability [18], elasticity [19], and resilience [24]. The quality of a system can be specified by quality requirements containing metrics such as response times. To identify occurrences of transient behavior, the actual QoS function of an underlying metric can be compared against the expected QoS [5]. Beck et al. [5] use Service-Level Objective (SLO) violations as indicators for transient behavior.

2.2 Property Specification Patterns

Transferring software system requirements to mathematical formulas to evaluate its quality can be challenging due to pragmatic barriers. To overcome this obstacle, Dwyer et al. [11] developed Property Specification Patterns (PSP) to specify temporal logic formulas for recurring requirement scenarios. A PSP represents a generalized depiction of a frequently occurring requirement that governs the allowable sequences of events and states in a finite-state model of a system. Dwyer et al. [11] introduce the two pattern categories *order patterns* and *occurrence patterns*. Each pattern also has a scope, which defines an interval during the program execution in which the pattern must remain valid [11]. The scope is established by specifying the pattern's starting and ending state/event. Five different scopes exist: *Global*, *Before*, *After*, *Between*, and *After-Until*.

The initial PSP version is qualitative, i.e., it does not consider time constraints. To address this limitation, Konrad and Cheng [22] introduced Real-Time Specification Patterns. They describe these patterns as *quantitative* as they allow for quantitative reasoning about time. Such PSP can be mapped to MTL, among others, as done in this work. Autili et al. [1] further extend and align the available qualitative and quantitative patterns.

An example of an instance of the qualitative Response pattern is: *Globally, if {response time high} then in response {instance increase} eventually holds within 5 seconds*. In this example, *response time high* and *instance increase* are predicates, i.e., they evaluate to either true or false at specific points in time. The *5 seconds* is the time constraint on how fast the autoscaler must react.

3 Related Work

To our knowledge, only a limited number of approaches and tools holistically focus on specifying and comprehending transient behavior and refining transient behavior requirements.

The Property Specification Pattern Wizard (PSPWizard) [26,1] aims to simplify the selection and creation of PSP by providing a graphical user interface to construct supported patterns. A mapping generator allows the translation of the specified pattern into various target logics. The specification is not the core contribution of our approach, so we mostly reuse the concept of the PSPWizard. We further extend it by adding capabilities to specify predicates and visualize the satisfaction of predicates for the imported runtime data.

The Transient Behavior Verifier (TBV) [15] is a tool that provides an Application Programming Interface (API) for verifying transient behavior occurrences specified as PSP or MTL on monitoring data. The requirement satisfaction is visualized using a multi-line graph for the relevant metrics and colors to indicate requirement satisfaction over time. In our approach, we reuse TBV for its verification capabilities. Further, we reuse the visualization concept to show requirement satisfaction. However, we further extend the concept by also visualizing the satisfaction of the predicates involved in the requirement.

Hoxha et al. [20] developed VISPEC, a graphical tool for eliciting MTL requirements. VISPEC utilizes a graphical formalism automatically translated to MTL to assist non-experts in creating and visualizing formal specifications. Therefore, users can easily specify requirements without requiring training in formal logic. In that regard, we share the comprehension and visualization of temporal logic on runtime data. Nevertheless, VISPEC is focused on (initial) specification, while we focus on refinement of requirements. Furthermore, VISPEC uses an MTL-based graphical formalism in the specification process, while we use PSP and internally translate to MTL. Finally, our approach has a stronger focus on visualizing the satisfaction of requirements instead of supporting the specification.

The TransVis [5] approach assists software architects and DevOps engineers in specifying and evaluating transient behavior occurrences in their microservice

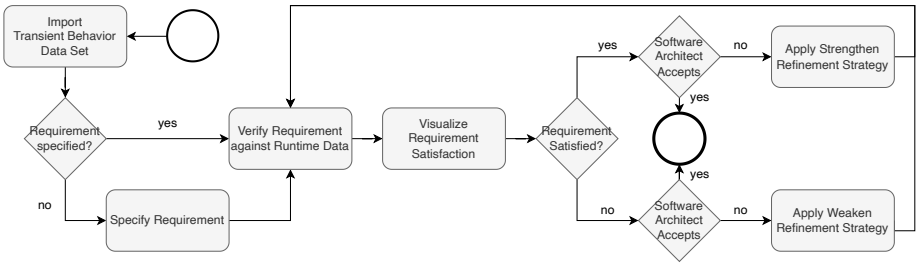


Fig. 2: Flowchart of the approach

systems. The tool displays the architecture of the assessed system and visualizes transient behavior in a graph. The user can interact with the tool via a chatbot, allowing for specifying simple requirements. The TransVis approach is based on the resilience triangle model from Bruneau et al. [8] in which transient behavior is characterized by the three indicators: initial loss of quality, time to recovery, and loss of resilience. Consequently, the specifications and visualizations are built specifically for these metrics, and there is no refinement assistance beyond visual comprehension. In contrast, we do not rely on the resilience triangle model and focus on requirement refinement.

4 Approach and TQPropRefiner

First, we outline the general concept (see Section 4.1) of our approach before we go into detail on the implemented refinement strategies (see Section 4.2). Next, we sketch our approach's intended usage and tool landscape and present how we implemented our concept into TQPropRefiner (see Section 4.4). Note that, due to space constraints, we only present the final version of the approach that incorporates improvements suggested by participants of the qualitative user study (see Section 5).

4.1 Concept

The approach presented in the following is designed to assist software architects in comprehending and refining quality requirements in the context of transient behavior occurrences. Our underlying assumption is that transient behavior occurrences have been successfully identified, and data for a specified instance of transient behavior can be provided. Thus, our approach does not provide support for identifying transient behavior occurrences beyond visual inspection.

Our general approach is depicted in Figure 2. First, data from a detected transient behavior occurrence has to be imported. If not already available, an initial transient behavior requirement has to be specified. We use PSP as a formalism for these requirements since they are understandable to humans but also formal enough to be testable [10]. This property of TQPropRefiner is exploited

in the next step, where we use runtime verification [25] to determine the satisfaction of (parts of) the requirement. Next, we visualize the runtime data and requirement satisfaction. Thus, software architects can easily decide whether the overall requirement is satisfied. Further, the software architect can consider the additional information to decide whether changes to the requirement are necessary, i.e., either because the specified requirement did not reflect the initial intention or new insights changed the expectation. A satisfied requirement can be strengthened to reflect new confidence in the system's capabilities. Vice versa, an unsatisfied requirement can be weakened to reflect the insight that the system behavior was actually good enough.

4.2 Refinement Strategies

We introduce the concept of *refinement strategies* to transform a requirement into a refined one. Besides the actual transformation, a refinement strategy has the properties (i) *type*, (ii) *target*, and (iii) *assistance*. The *type* describes whether the strategy aims to strengthen or weaken (or both) a requirement. The *target* specifies which part of the PSP the transformation affects, i.e., the overall pattern, scope, predicate, or time bound. Finally, *assistance* describes whether the strategy actively assists the software architect in making a decision or whether it just shows the software architect the effects of already applied decisions. In this work, we focus on active assistance and implemented two active refinement strategies, which we aim to extend in future work:

- **RS1: Compute Satisfying Time Constraint**
  (*type*: weaken/strengthen, *target*: time bound, *assistance*: active)
  The approach computes the threshold for the time bound so that the overall pattern is only just satisfied. Depending on whether the pattern was satisfied before, the specification is weakened or strengthened by applying the suggestion.
- **RS2: Test Predicate Threshold Values**
  (*type*: weaken/strengthen, *target*: predicate, *assistance*: active)
  For a simple predicate that involves a static threshold, e.g., *response_time* lesser than 100 ms, the approach evaluates the overall pattern satisfaction for all the available values of the predicate thresholds. The results are presented to the user, who can then select a value and, by doing so, weaken or strengthen the specification.

4.3 Envisioned Usage

TQPropRefiner is intended to be part of a process for continuous specification, verification, and refinement of resilience scenarios focusing on transient behavior as described in previous work [14]. This process is particularly useful in settings where software architects are insecure regarding the behavior and capabilities of their system regarding transient behavior. During experimentation, they can gather feedback and knowledge reflected by the increased quantity and quality

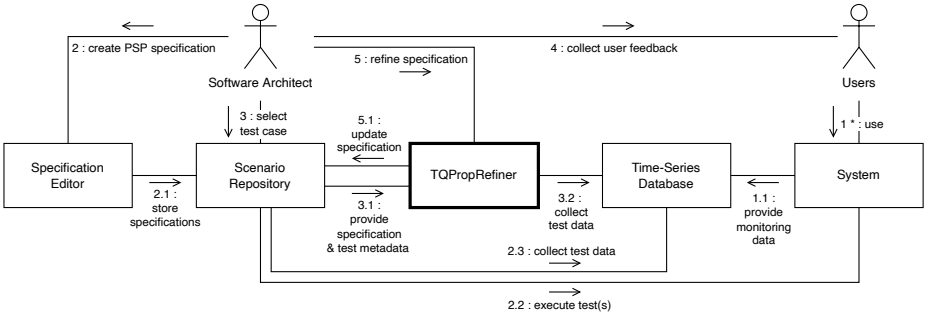


Fig. 3: Communication diagram of the envisioned technical landscape and usage

of scenarios. In our case, quality refers to the confidence of the software architect that a specified scenario makes sense. TQPropRefiner specifically aims to help software architects gain knowledge and reflect it in the specification through refinement strategies. Figure 3 depicts a simplified perspective on the role of TQPropRefiner as part of this vision and its interactions with users and other tools in practical settings.

We assume the system under test is instrumented and monitored so that monitoring data can be provided to state-of-the-art monitoring systems, e.g., Prometheus[3]. In previous works [16,4], we identified software architects as the ideal users of our approach since they possess knowledge about the system domain and system's usage as well as the applied software architecture and implemented resilience mechanisms. Therefore, they are most capable of identifying and specifying a relevant *stimulus* that leads to transient behavior and the intended *response* of the system, which both can be expressed using PSP, e.g., through specification editors as the PSPWizard [26]. The stimulus and response are the essential parts of quality scenarios as described by Bass et al. [3]. The software architects can then persist the initial scenarios in a scenario repository. Since a stimulus is specified, it can be applied to the system as part of resilience tests, and the scenario repository can collect the monitoring data associated with the tests. Note that other methods can be used instead of resilience tests at runtime to gather test data as long as the data is persisted in a time-series database by the monitoring system.

Using the scenario repository, the software architect can select a test case of interest for a scenario. The software architect can utilize scenario satisfaction and visualization approaches, e.g., Grafana dashboards[4], to decide whether a scenario and test case are interesting enough to enter the refinement phase. The specification and test metadata are then sent to TQPropRefiner, which collects the required monitoring data from the time-series database. Currently, TQPropRefiner contains a prototypical implementation for collecting the monitoring data from a Prometheus database. Before and during the refinement process,

[3] https://prometheus.io/
[4] https://grafana.com/

the software architect is assumed to collect user feedback as the basis for the refinement decisions, particularly whether specifications or the system must be modified. When the software architect applies refinement strategies, TQPropRefiner has to update the specification at the scenario repository to persist the newly gained knowledge.

Note that to allow an early evaluation of the approach, the first version of TQPropRefiner is deliberately designed to be useable as a standalone tool, i.e., without requiring external tools like the specification editor, scenario repository, or time-series database. However, in future work, we aim to incrementally integrate the approach into the described process and tool landscape.

4.4 TQPropRefiner

Figure 4 shows the TQPropRefiner prototype in a state where (1) a data set (see DS_2 in Section 5) has been imported, (2) the *Response* PSP has been selected, and (3) an initial requirement (see T_2 in Section 5) has been entered. The tool guides the software architect through the three-step process of importing monitoring data, selecting a PSP, and specifying & refining the requirement. Each step can be accessed via the stepper component (see Figure 4 (A)).

Data Import The first step is to import a Comma-separated values (CSV) file containing time series data of monitored metrics, e.g., from a chaos experiment. Alternatively, the user can retrieve monitoring data directly from a Prometheus database by specifying the time interval of interest. The imported data is displayed in a table where each row represents the monitored data for each time unit, and the columns show the metrics.

Specification In step two, the software architect is asked to select a PSP as starting point for the initial specification. The selection is based on the pattern hierarchy introduced by Dwyer et al. [11] and the PSPWizard [26]. The software architect defines a scope, chooses a category (see Section 2.2), and finally picks a PSP. To provide additional context, the selected pattern is presented in the SEG as described by Autili et al. [1] and represented in a target logic of choice. However, only MTL is currently supported, and the pattern catalog is limited to three pattern variants: The *Response* pattern with the *Global* scope, and the *Universality* and *Absence* patterns with the *After* scope. We plan to add additional target logics and extend the supported patterns in the future.

The final step involves specifying the initial requirement and its refinement, as shown in Figure 4. To provide an intuitive specification process, the selected pattern is displayed as a SEG (see Figure 4 (C)). Each predicate of the pattern can be specified individually (see Figure 4 (C2) & (C4)). A predicate is specified by providing (1) a meaningful name, (2) selecting a measurement source (metric), which is populated from the imported data set, (3) selecting an operator, and (4) specifying a numeric comparison value. Currently, TQPropRefiner supports

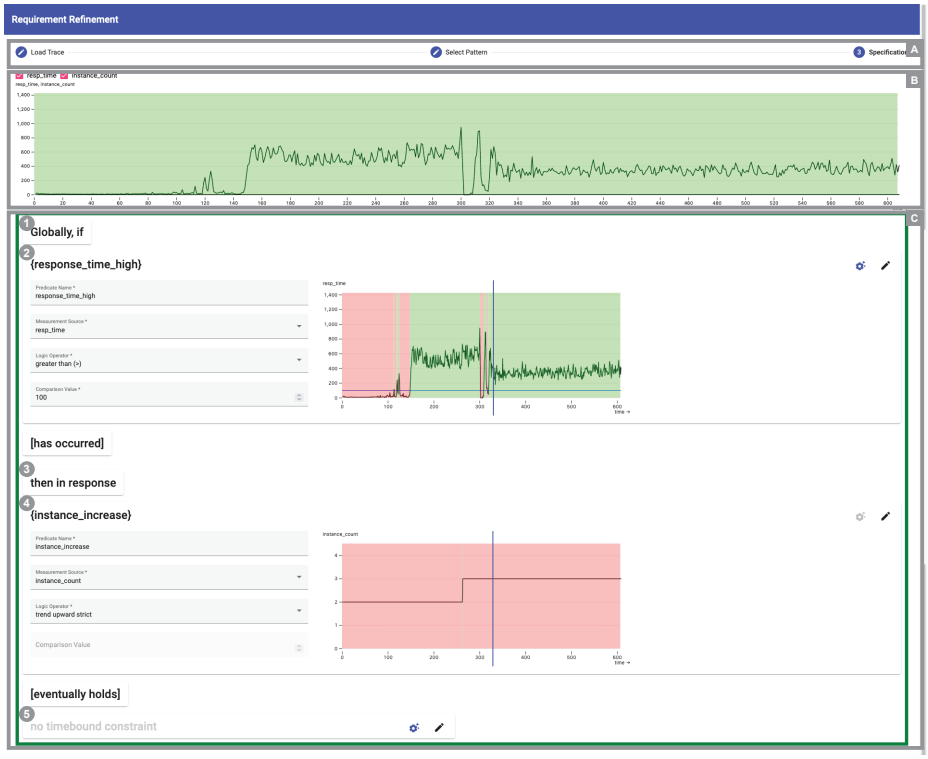


Fig. 4: TQPropRefiner showing (A) the step selection, (B) the pattern evaluation graph, and (C) the requirement specification & refinement

the same operators as TBV [15], which has to interpret these inputs. The supported operators contain basic relational operators ($<, \leq, =, \geq, >$) and (strict) upward and downward trends. While currently limited by the available operators provided by TBV, we plan to further extend the supported operators to reflect more complex and realistic use cases.

Comprehension For verifying the PSP against the provided data set, TQPropRefiner uses the Transient Behavior Verifier [15]. We host an instance and access it via its API. The overall evaluation of the pattern is displayed in the graph at the top (see Figure 4 (B)). An all-green graph indicates the satisfaction of the entered requirement, while a red segment marks the moment the requirement is violated. The pattern evaluation result is also visualized by a green or red rectangle around the pattern (see Figure 4 (C)).

The predicates are individually verified against the provided data set, and the results are visualized in graphs. The time is represented on the X-axes, and the Y-axes represent the metrics. A selected metric is displayed in a black line chart, and the comparison value is a blue horizontal line. The time-dependent

evaluation of the predicate is visualized by green segments for intervals the predicate is satisfied and red segments for unsatisfied intervals. In Figure 4 (C4), the specification of the *instance_ increase* predicate is shown, which is defined as *instance_ count* is strictly increasing. The time-dependent evaluation of the predicate is visualized to the right in the graph. As specified, the interval is mostly marked red, while the point in time the instance count is increased to three is marked green.

Refinement To refine the pattern specification, the software architect can tweak its predicates. TQPropRefiner provides the passive refinement strategy of updating the visualization for the selected predicate and the overall pattern. This aims to facilitate a better comprehension of how changing one or more parameters affects the satisfaction of (parts of) the requirement.

For specifying and refining the time constraints, TQPropRefiner provides the implementation of two active refinement strategies (see gear symbol in Figure 4 (C2) & (C5)). The tool performs a binary search based on the available predicate specifications to test potential time constraints. The resulting time-dependent verification result is displayed to the user showing for which time constraint intervals the pattern is satisfied following the same color coding we use for predicates. For predicates with relational operators, the tool can evaluate the pattern satisfaction for all comparison values between the minimum and maximum values of the dataset. The tool then displays all tested values and the corresponding evaluation results indicated by red or green colors. The user can then click on a value to set it as the comparison value. Currently, these are the only two implemented refinement strategies. However, we plan to add more sophisticated strategies in future versions of TQPropRefiner, particularly ones that simultaneously modify multiple predicates.

Implementation & Technologies TQPropRefiner has been implemented using the Angular[5] framework in conjunction with the Angular Material UI component library. Our prototype sends requests to an instance of the TBV [15] tool in order to verify the PSP specifications. The code for the prototype is publicly available [7]. The modeling of PSP has been adopted from the PSP-Wizard [26]. We migrated the code of selected patterns to TypeScript classes, as the PSPWizard is implemented in Java.

5 Evaluation

To evaluate our approach's comprehension and refinement capabilities and practical applicability, we conducted a qualitative user study with five industry experts. We provided the experts with two tasks that needed to be solved using the prototype and asked them to evaluate their experience afterward. We investigate the following research questions:

[5] https://angular.io/

- **RQ1:** To what extent can our approach facilitate comprehension of transient behavior occurrences among practitioners?
- **RQ2:** To what extent can our approach assist practitioners in refining requirements?
- **RQ3:** How can the approach be improved to assist practitioners in addressing practical challenges?

In the following, the provide details on our method, the provided tasks, the study execution, the results, and the discussion of the results and our method.

5.1 Method

We decided on a qualitative evaluation for two reasons. Firstly, the research questions focus on usability and improving an early concept and prototype. We argue that this can be best achieved by promoting a dialog with the study participants. This perception is supported by Greenberg & Buxton [17], who suggest that quantitative study designs could be detrimental in evaluating new ideas, particularly during prototype design, as they may limit expert feedback. Secondly, the complexity and the specialization of the covered topic lead to the practical barrier of finding enough participants to conduct a representative study.

We designed the expert user study not to exceed 1 hour and conducted it with each participant individually. In total, we gathered five participants, three working in a software company from the taxes domain and two working in a consulting and development company focusing on Application Performance Monitoring (APM). The participation did not demand any prior preparation.

Note that Section 4 describes the state of the prototype after the evaluation. The version used in the evaluation was less advanced, in particular, it only supported refinement strategy RS1 and only relational operators in predicates. The evaluation results led to further improvements in the tooling.

5.2 Tasks

To solve the tasks, the participants received access to a hosted version of TQProp-Refiner. We also provided two CSV files containing time-series data from two chaos experiments conducted by Frank et al. [15] with Chaos Toolkit (CTK) [9]. The first data set (DS_1) provided originates from *Chaos Experiment 1*, in which an injected fault caused a service instance to crash, leading to a response times increase. The second data set (DS_2) is from *Chaos Experiment 2*, in which the workload suddenly increases, and the implemented autoscaler is required to spawn an additional service instance.

Each task demands participants to go through four steps using TQProp-Refiner. Firstly, each participant was asked to select a specific data set from a chaos experiment. Secondly, a suggested PSP from the pattern catalog needed to be selected. Thirdly, a given (initial) specification had to be entered by specifying the predicates of the selected PSP. Fourthly, a question on the requirement needed to be answered. Answering the questions may require the refinement of

Table 1: Context and SLO, initial requirement, and question for the two tasks

Task 1 (T_1): Service Failure	**Task 2 (T_2): Load Peak**
Data Set 1 (DS_1)	Data Set 2 (DS_2)
– According to the SLO, response times may not exceed 150 time units – In the exceptional case of only 1 service being available, a response time of up to 400 time units is tolerated – In the experiment, 1 of in total 2 service instances has been terminated	– Response times may not exceed 100 time units. – In case the system is unable to satisfy the performance requirement, the number of instances should be increased – In the experiment, due to a load peak, service instances are scaled from 2 to 3
After {instances are smaller than 2}, it is never the case that {response times exceed 400 time units}.	*Globally, if {response times exceed 100 time units} then in response {the instance count increases to 3}.*
Is the requirement fulfilled?	How long did the system take to scale to 3 service instances?

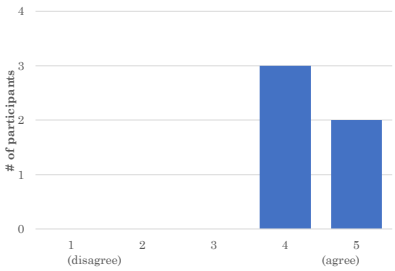
the initial specification. For each task, the participants have been provided with context information containing (i) the SLO of the underlying system defined by stakeholders, (ii) an initial specification, and (iii) a question as shown in Table 1.

We designed Task 1 (T_1) to evaluate to which degree participants are able to enter a given requirement specification and correctly interpret the verification result without any necessary refinement. Thus, T_1 is designed to address RQ1. Task 2 (T_2) aims to evaluate to which degree participants can refine a given specification to examine a related requirement question. The answer to this question had to be derived from refining the time constraint of the selected specification. Therefore, T_2 addresses RQ1 and RQ2. To address RQ3, we conducted an interview with the participant to discuss potential improvements and required developments for practical use.

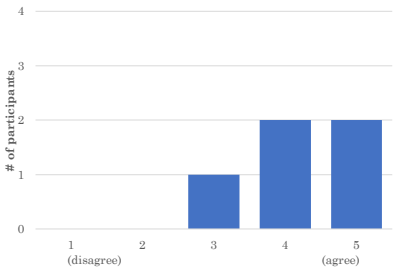
5.3 Execution

We conducted the evaluation online, with participants sharing their screens during the entire study. At the beginning of the session, we explained the study procedure. Afterward, we provided a link to a Google Form containing all information necessary for the study participation. This included seven questions on the participants' background knowledge, the two tasks to solve using TQProp-Refiner, and 20 questions. The study host was present to answer potential questions from participants but did not actively intervene while the participants were going through the information on the Google Form.

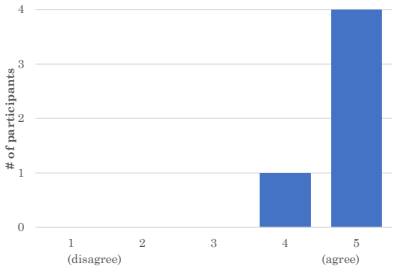
After solving the given tasks, we asked each participant to evaluate their experience concerning feasibility, usability, practical applicability, and potential improvements. To evaluate the prototype's feasibility, we asked the participants



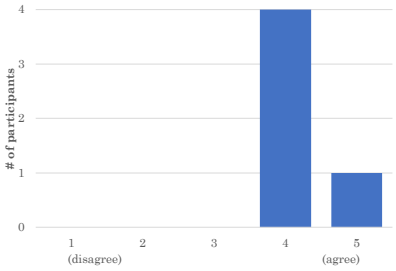
(a) ... easy to interpret the initial evaluation of a single predicate.



(b) ... easy to interpret the initial property evaluation.



(c) ...easy to refine single predicate.



(d) ... easy to refine the property.

Fig. 5: Answers by the study participants for selected questions. It was...

to rate their interaction with the tool on a Likert scale (one to five, one: strongly disagree; five: strongly agree). We based our useability questions on the System Usability Scale (SUS) [6] method. Finally, we gathered practical applicability evaluation and potential improvement suggestions using qualitative questions as well as a discussion between the participant and the session host.

5.4 Results

RQ1 No participant encountered problems entering the given specification into TQPropRefiner. Interpreting the evaluation result of a single predicate as well as the overall property was perceived as easy by all participants, who rated the comprehensibility for both with a median value of 4 out of 5. Additionally, all five participants were able to solve the tasks correctly.

During the specification process, we observed that specifying a time constraint was not intuitive for some participants and, therefore, may require additional explanation within the tooling. Consequently, the answers to the ten SUS questions indicate that the tool overall was generally perceived as easy to use with a low entry barrier.

RQ2 All participants perceived the refinement of a single predicate as simple and rated it as easy with a 5 out of 5 median value. Refining the overall property was perceived as more difficult but was still rated with a median value of 4 out of 5. As part of the qualitative evaluation, we asked the participants whether they would have been able to solve the given task without TQPropRefiner. Two participants answered yes (they would just use the data visualization and manual inspection), two with no, and one with maybe. Also according to the results, T_2 has been solved correctly by four of the five participants. The wrong answer was due to the challenges of correctly interpreting the time constraint in the context of the overall pattern. However, the existence and the functionality of the tool's time constraint refinement feature were not intuitive to the participants, i.e., they did not understand the feature solely by seeing the gear icon. The refinement needs better presentation and explanation in future versions of TQPropRefiner.

RQ3 In open feedback, participants stated various ideas and requirements for potential production use of TQPropRefiner. Multiple participants pointed out that comprehensibility could be increased by horizontally aligning the predicate graphs. In the used version of TQPropRefiner, the two predicate graphs were not aligned, which made identifying dependencies between various metrics difficult. As depicted in Figure 4 (C2) & (C4), we have aligned the graphs and provided a blue line that highlights the same point in time for all predicate graphs.

One participant elaborated that importing time series data as CSV files would be infeasible in production environments. Instead, an API integration of standard monitoring systems for trace import is required. Based on the suggestion, we have implemented a database connection that obtains monitoring data directly from a Prometheus database. For the question of whether the participants would frequently use the tool, the answers varied. Some participants agreed, but others pointed out that this depends on the precondition that they face tasks in their jobs where a tool like this would be beneficial.

Finally, participants provided some general potential improvements, e.g., adding a feature to save and load specifications, adding support for time units, providing additional explanations on the color coding, and improving the tool's responsive design.

5.5 Discussion

The findings of RQ1 and RQ2 indicate that our approach is able to assist practitioners in comprehending and refining transient behavior requirements. The participants were able to enter a given specification, interpret verification results, and refine requirements. The tool's usability was perceived positively, and has a low entry barrier. This is supported by the fact that the participants (mostly) solved the given tasks using the tool. Still, our approach must be improved, extended, and evaluated in a more exhaustive user study and applied to more complex use cases. To avoid the influence of useability issues on the result of potential quantitative evaluations in the future, we also have to improve features

that are considered not intuitive by the participants, i.e., the time refinement and the color coding.

5.6 Threats to Validity

As a result of the evaluation, we have identified three validity concerns. Firstly, the group of participants was small and lacked heterogeneity. The five participants were employed at only two companies; some had similar expertise. Including software engineers without an APM background might have negatively impacted the results. Nevertheless, the number of (heterogenous) participants in qualitative studies is less critical. Studies with low (1 to 5) numbers of participants are not uncommon, according to Isenberg et al. [21].

Secondly, the tasks were designed specifically for the data sets we used for the evaluation. Since this data originates from academic experiments, they are not representative of the scenarios practitioners face in their production environments. Despite these concerns, we assume that the qualitative feedback we have received will be a first step in extending our early-stage prototype toward handling real-world challenges in the future.

Thirdly, some participants stated they could have solved the given tasks without TQPropRefiner. Thus, we must thoroughly investigate whether the comprehension and refinement of the requirement were facilitated due to using the tool, e.g., by comparing solutions obtained with and without TQPropRefiner.

6 Conclusion

This paper introduced our approach and tool TQPropRefiner for supporting software architects in comprehending transient behavior and refining requirements. In an expert user study, the participants were able to solve two tasks and confirmed the ease of use — providing evidence that our approach is a valuable step toward the interactive refinement of transient behavior requirements.

In future work, we aim to significantly extend the supported PSP, add support for more sophisticated predicates, and add more refinement strategies. In particular, we plan to support composed predicates and predicates on time intervals. We also plan to further integrate TQPropRefiner into our process for specifying, verifying, and refining resilience scenarios. Further, we aim to evaluate the approach in more realistic use cases and make the necessary improvements suggested by the participants, e.g., further improve monitoring integration and making the refinement features more intuitive to the users.

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[6] https://research.spec.org/devopswg

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