

Enriching Model Execution with Feedback to Support Testing of Semantic Conformance between Models and Requirements

Design and Evaluation of Feedback Automation Architecture

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Abstract: Model Driven Development (MDD) has traditionally been used to support model transformations and code generation. While plenty of techniques and tools are available to support modeling and transformations, tool support for checking the model quality in terms of *semantic conformance* with respect to the domain requirements is largely absent. In this work we present a model verification and validation approach based on *model-driven feedback* generation in a model-to-code transformation. The transformation is achieved using a single click. The generated output of the transformation is a compiled code which is achieved by a single click. This also serves as a *rapid prototyping* instrument that allows *simulating* a model (the terms prototyping and simulation are thus used interchangeably in the paper). The proposed feedback incorporation method in the generated prototype allows linking event execution in the generated code to its causes in the model used as input for the generation. The goal of the feedback is twofold: (1) to assist a modeler in validating semantic conformance of a model with respect to a domain to be engineered; (2) to support the learning perspective of less experienced modelers (such as students or junior analysts in their early career) by allowing them to detect modeling errors that result from the misinterpreted use of modeling language constructs. Within this work we focus on conceptual and platform independent models (PIM) that make use of two prominent UML diagrams – a *class diagram* (for modeling the structure of a system) and multiple interacting *statecharts* (for modeling a system’s dynamic behavior). The tool has been used in the context of teaching a requirements analysis and modeling course at KU Leuven. The proposed feedback generation technique has been constantly validated by means of “usability” evaluations, and demonstrates a high level of self-reported utility of the feedback. Additionally, the findings of our experimental studies also show a significant positive impact of feedback-enabled rapid prototyping method on semantic validation capabilities of novices. Despite our focus on specific diagramming techniques, the principles of the approach presented in this work can be used to support educational feedback automation for a broader spectrum of diagram types in the context of MDD and simulation.

1 INTRODUCTION

The software development process involves the translation of information from one form to another (e.g. from customer needs to requirements, to architecture, to design and to code). Because this process is human-based, mistakes are likely to occur during the *translation steps* (Walia and Carver, 2009). The vision of Model Driven Development (MDD) of software introduces automation in the software development process, which results in reduced human intervention. MDD is a development

methodology that uses models, meta-models, and automated model transformations to achieve automated code generation (Stahl et al., 2006). Despite the variety of tools for modeling and code generation, tool support for verifying and validating the semantic conformance of models (i.e. the quality of transformation input) with requirements is largely lacking. Conformance mismatch can result from errors in different steps of a process: modeling, model-to-model transformation, or model-to-code transformation. In this work, we target at errors resulting from a *semantic mismatch* that occur

during the modeling process which are caused by reasons such as misunderstanding of requirements, misinterpreting modeling constructs, lack of domain experience of a human modeler, etc. In related research this type of validity issues are referred to as *semantic validity*. The semantic validity of a model is an important aspect of model quality, which refers to the level to which the statements in a model reflect the real world domain in a valid and complete way (Lindland et al., 1994). Validation of a model quality involves many different dimensions related to physical artefacts and knowledge artefacts (Nelson et al., 2012). Because semantic quality cannot be directly assessed but needs to be assessed by a human, it has to go through the knowledge layer, which therefore results in a complex cognitive process involving other quality types. On the knowledge side, assessing semantic quality requires an appropriate level of domain knowledge, model knowledge, language knowledge and representation knowledge (Nelson et al., 2012), hence requiring view quality (understanding the domain), pedagogical quality (understanding the modeling concepts), linguistic quality (understanding the graphical notation) and pragmatic quality (understanding a model) (Nelson et al., 2012). In particular, pragmatic quality captures the extent to which the stakeholder completely and accurately understands the statements in the representation that are relevant to them.

In this work we propose a novel MDD approach that embeds a feedback generation mechanism into a model-to-code transformation to achieve a feedback-enabled transformation output. By enabling a fully functional output the method also serves as a rapid prototyping and simulation instrument. This allows assessing the generated prototype (simulation results) with respect to the desired outcome. In case of a semantic mismatch the desired outcome can be achieved through a trial and error correction process by means of modification, regeneration and verification loops. The goal of the incorporated feedback in the simulation loop is to facilitate the process of verification of semantic validity of the model provided as a transformation input. The feedback is generated as an explanation to error messages when testing and validating a model. The errors include event execution failures that result from constraint violations, which are regarded as invalid actions from the domain perspective. We make use of two type of feedback formats: (1) explanation of the causes for the errors (constraint violations) represented in textual format and (2) graphical visualization that links the execution

results to their causes in a model. We further present a template-based model driven development technique for realization of such feedback.

For a modeling language we opted for UML as it is the current standard widely used in the research and industry. The diagramming tool we used is JMermaid, a tool built based on MERODE methodology (Snoeck, 2014). The tool uses a combination of two prominent UML diagramming techniques: a class diagram and statecharts (also called finite state machines). The output of the modeling tool is an executable platform independent domain model (PIM) that is readily transformable to code using a one click MDD-based code generation approach (Sedrakyan and Snoeck, 2013b) which makes it particularly suitable for the goals of this work. Our choice of the diagramming techniques is motivated by the fact that *class diagram* and *statecharts* are both in the kernel of “essential” UML (i.e. diagrams that are highly used) with the highest usability ranks by practitioners and educators from software industry and academic field (Erickson and Siau, 2007). Furthermore these are also among the top used diagrams present in the context of educational material such as books, tools, courses and tutorials (with percentages of 100% (class diagram) and over 96% (statecharts) (Reggio et al., 2013). Because of their high cognitive and structural complexity (Cruz-Lemus et al., 2008; Cruz-Lemus et al., 2010) both techniques are also among the most complex diagramming techniques: UML class diagram ranks the highest in complexity among the structural diagrams (Siau and Cao, 2001) followed by statecharts among the dynamic diagrams (Carbone and Santucci, 2002; Cruz-Lemus et al., 2009; Cruz-Lemus et al., 2007; Genero et al., 2003).

While our previous papers focused on presenting the results of assessing the effectiveness of the feedback-enabled prototype (output of the PIM-to-code transformation simulation tool) with respect to its capability of affecting semantic validation process of models (Sedrakyan and Snoeck, 2012; 2013a; 2014a; 2014b; 2015; Sedrakyan et al., 2014), in this work we present the principles for setting up the automated feedback during the model-to-code transformation process. The research question addressed in this paper is: “*What is required to set up an automated simulation feedback that facilitates the testing of the semantic validity of a model and how can such feedback be (technically) realized ?*”

This paper describes the architectural design of the feedback automation method. The resulting artefact was evaluated by means of yearly

evaluations of self-reported “usability”. Besides this self-reported utility, the utility of the automated feedback approach also has been evaluated through experimental studies. Aggregated results of 6 empirical/experimental studies in the context of two master-level courses from two different study programs at KU Leuven (Sedrakyan et al., 2014) are briefly presented.

The results presented in this paper contribute to the research on 1. model-driven development with respect to its applicability to feedback generation, 2. simulation theory with respect to addressing the difficulties in interpretation of simulation results (Banks, 1999). Furthermore, not many studies can be found in the domain of feedback automation. In the context of education the results contribute to the research on 3. automation methods for (learning process-oriented) feedback which is in turn intertwined with self-regulative learning. Despite our focus on specific diagramming techniques, the approach presented in this work can be applied/enhanced to support feedback automation for a broader spectrum of diagram types. The technique can also be used to support a teaching/learning context for courses that use modeling. This may include courses such as system architecture and design, databases, software engineering, prototyping and testing of requirements, model driven development, etc.

2 METHODOLOGY

The feedback is realized using MDD technique. The

approach was built following the principles of Design Science in Information Systems research which proposes two main guidelines 1. building and 2. (re)evaluating novel artefacts to help understanding and solving knowledge problems (Hevner et al., 2004). We first present the required components and the architectural design for building feedback. We then propose a template-based model driven development technique for realization of the proposed feedback.

To test and evaluate the proposed design with respect to its subjective perceptions of usability by users (perceived easiness of use, perceived utility, preference and satisfaction) yearly evaluations were performed. Ease of use and usefulness are widespread and validated acceptance beliefs from the Technology Acceptance Model (Davis, 1989; Davis et al., 1989; Venkatesh et al., 2003), referring to the required effort to interact with a technology and its efficiency and effectiveness respectively. We used the concept of preference as another success dimension, as proposed by (Hsu and Lu, 2007) and (Bourgonjon et al., 2010). Preference is defined as “the positive and preferred choice for the continued use of simulation tool in the classroom”. User satisfaction is another key success measure that has been defined as the feelings and attitudes that stem from aggregating all the efforts and benefits that an end user receives from using an system (Ives et al., 1983; Wixom and Todd, 2005). Thereto a questionnaire was used including three questions per measurable dimension, each of which measured with a six-position Likert-type scale. The impact of pro-social behavior (Mitchell and Jolley, 2012) was isolated by ensuring the anonymity of participants,

Table 1: Examples of model elements used to construct feedback for class diagram and statecharts.

Diagram	Constraint type	Error type	Explanation & model properties
Class diagram	Cardinality of minimum 1	Create-event execution failure	an <i>object of type A</i> is attempted to be <i>created</i> without choosing an <i>object of type B</i> it is associated with
	Cardinality of maximum 1	Create-event execution failure	an <i>object of type A</i> is attempted to be <i>created</i> for which an <i>object of type B</i> associated with a <i>cardinality of max 1</i> is chosen which already has been assigned <i>another instance of an object of type A</i>
	Referential integrity for creation dependency	Create-event execution failure	an <i>object</i> is attempted to be <i>created</i> before the <i>objects it refers to</i> were created
	Referential integrity for restricted delete	End-event execution failure	an <i>object</i> is attempted to be <i>ended</i> before its <i>“living” referring objects</i> (objects that did not reach the final state of their lifecycle) are ended
Statechart	Sequence constraint	Event execution failure	an <i>event</i> is attempted to be executed for an <i>object</i> whose <i>state</i> does not enable a <i>transition for that event</i>

i.e. not disclosing any identifiable information in the questionnaire. Reliability and validity of the acceptance measures were assessed by factor analysis using SPSS.

3 WHAT IS REQUIRED TO SET UP A MODEL-DRIVEN FEEDBACK?

In this chapter we present the architectural design of the automated feedback approach. Thereto we identify the model elements used to set up a model-driven feedback. According to (Nelson et al., 2012), in the conceptual modeling quality framework each framework element can be considered as a set of statements. Model quality is assessed by comparing two such sets, goals being completeness and validity. For semantic quality, completeness is achieved if the physical representation (the model) contains all the statements of the domain, and validity is achieved if what is true or false according to the model is respectively also true or false according to the domain rules.

Model simulation can be used to assess model completeness by simply verifying the presence of desired functionality in the prototype. Assessing the validity of the model requires verifying the truthfulness of a statement in the prototype. In other words, if something should be allowed according to domain rules, then this should be allowed according to the model as well, and if something is forbidden according to domain rules, then a corresponding constraint should be included in the model. To verify validity, a modeler needs to define test scenarios and define an oracle (desired outcome) for each scenario according to the domain rules. The results of the execution of the test scenario are compared to the oracle to determine the semantic correspondence between model and domain. While novice modelers seem at ease with using a fast prototyping approach for the verification of model completeness, we witnessed that novice modelers have difficulties in understanding why a test scenario fails and relating the cause of the failure to model constructs.

Test scenario failure finds its origins in constraint violation. For example, if a course can be attributed to at most one teacher, then assigning a second teacher to a course will result in a constraint violation and a failed test scenario. Therefore, the first step in our architectural design includes the identification of the *constraints* that are supported by a *diagram type*. Next, the typology of errors with

respect to the *constraint types* are specified. We also need to identify the *diagram properties* that take part in those constraints. The *error type* can be described as a constraint violation scenario. The error type contains a reference to the violated constraint type and also encapsulates the properties that *participate* in the context of the event execution and those that *cause* the error (execution failure). Figure 1 below depicts the generic meta-model on how error types are related to the corresponding model elements.

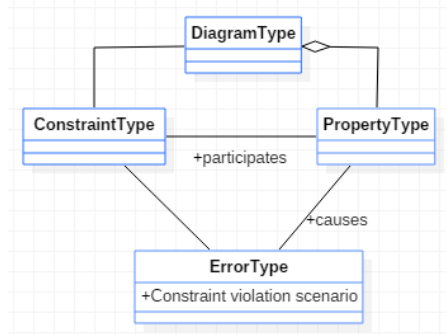


Figure 1: Model-elements used for a feedback.

As mentioned earlier in this paper we realize our approach in the context of one specific type of models, namely, conceptual models, that combine structural and behavioral aspects of a system. The modeling approach uses a combination of a class diagram (to realize the structural aspects) and multiple interacting statecharts (to support a system’s dynamics). In the class diagram, constraints are captured as cardinality constraints (mandatory one, maximum one) and referential integrity constraints (creation dependency and restricted delete). In the case of a statechart, constraints are captured as sequence constraints. For each of these constraints, a corresponding error type and explanations used for feedback can be constructed as shown in Table 1. Explanations include model properties (underlined in column “Explanation & model properties”).

4 HOW THE APPROACH CAN BE REALIZED: INCLUSION AND GENERATION OF FEEDBACK

The feedback generation mechanism is handled by inclusion of a feedback generation package in the output of the model-to-code transformation and is illustrated by the conceptual model shown in Figure

2. This package is responsible for 1. capturing the execution errors (failures) and mapping them with corresponding causes; 2. identifying the causing model properties as well as those being involved/affected; 3. matching the causes with relevant feedback template for a textual feedback; 4. generating feedback dialogs with the textual explanation and 5. further extending the textual explanation with its graphical visualization. In the model-to-code transformation the event execution process is supported by the event handler which is responsible for the transaction logic specified by a model. The role of the event handler is to check the success and failure scenarios according to pre-conditions specified in a diagram type. Constraint support is realized by means of the pre-condition checks. If the pre-condition checks are successful the transactions are further executed. Error messages are generated in case of failed precondition checks. The model-to-code transformation is presented in our previous work (Sedrakyan and Snoeck, 2013b) and, as it is not the core subject of this paper, the transformation process therefore will not be covered in detail. We will however refer to some aspects of the model-to-code transformations that are relevant for feedback generation. This includes the notion of a parser and Data Access Objects (DAO) in the generated transformation. DAOs provide a simplified access to model properties stored in a database layer of the transformed code (e.g. key-value maps containing a collection of object properties such as a name, collections of attributes, events, dependencies, states, etc.) which are also

used for feedback purposes. These properties are constructed during the transformation process using a parser and Apache Velocity Templates (<http://velocity.apache.org/>) and are accessible in the final code. In the generated application the execution failures are implemented as exceptions. The exception handler contains the cause of the exception such as a reference to the corresponding constraint type along with the model properties involved in the constraint violation in a lightweight data-interchange format (comma separated string). The exception handler identifies the exception type and in case a model related execution failure is detected (there can be code related exceptions too) further links to the corresponding error processor responsible for model related errors. The error processor further derives the necessary properties error message data stream, converts them into appropriate formats and forwards to the feedback processor. The feedback processor uses a feedback template to provide a textual explanation on the corresponding parts of the diagram along with the properties of a diagram causing the execution failure as well as those being involved/affected. Sample textual feedback templates are presented in Figure 3 and Figure 4.

Using the model parser the coordinates of model properties from the GUI model of a diagram are passed to a 2D graphics object. The parser is used to access any other model properties that are required to provide a hint for a possible correction scenario (e.g. if an event execution fails due to an object state, the state(s) in which the execution is allowed

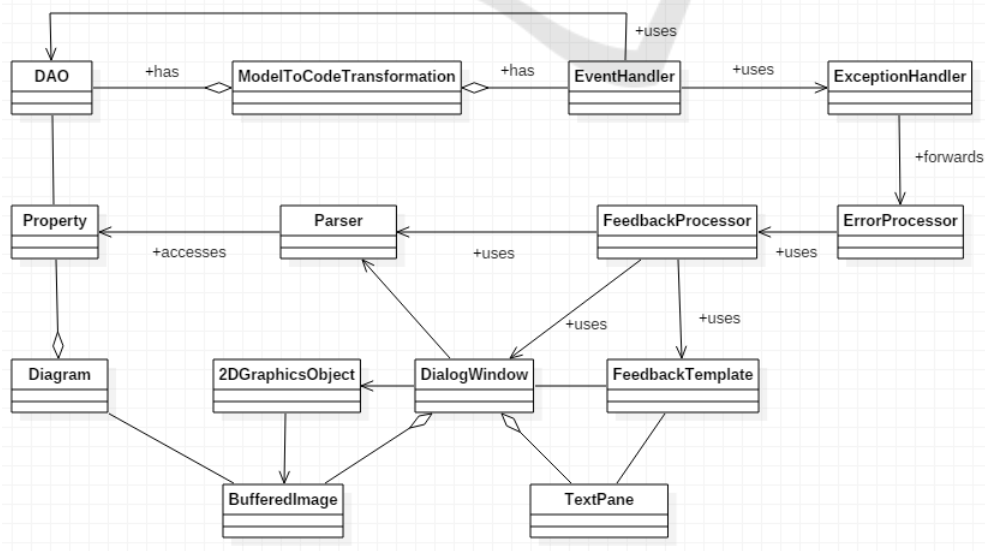


Figure 2: Feedback generation model.

```
feedbackText = "The FSM (statechart) of " + objectName + " puts a constraint on "
+ transitionEventName + ". The current state of " + objectName
+ " is " + objectStateName + ". In the state " + objectStateName
+ " there is no transition enabled for the business event "
+ transitionEventName + ". Look at the FSM to find which "
+ "business events are allowed in this state or find the "
+ " state(s) at which you can execute the business event "
+ transitionEventName + ".";
```

Figure 3: Sample textual feedback template for a sequence constraint violation.

```
feedbackText = "You already have one instance of "
+ objectType + " and according to the " + diagramType
+ " you cannot create a second instance of "
+ objectType + " because of the cardinality constraint"
+ " of maximum 1.";
```

Figure 4: Sample textual feedback template for a cardinality constraint violation.

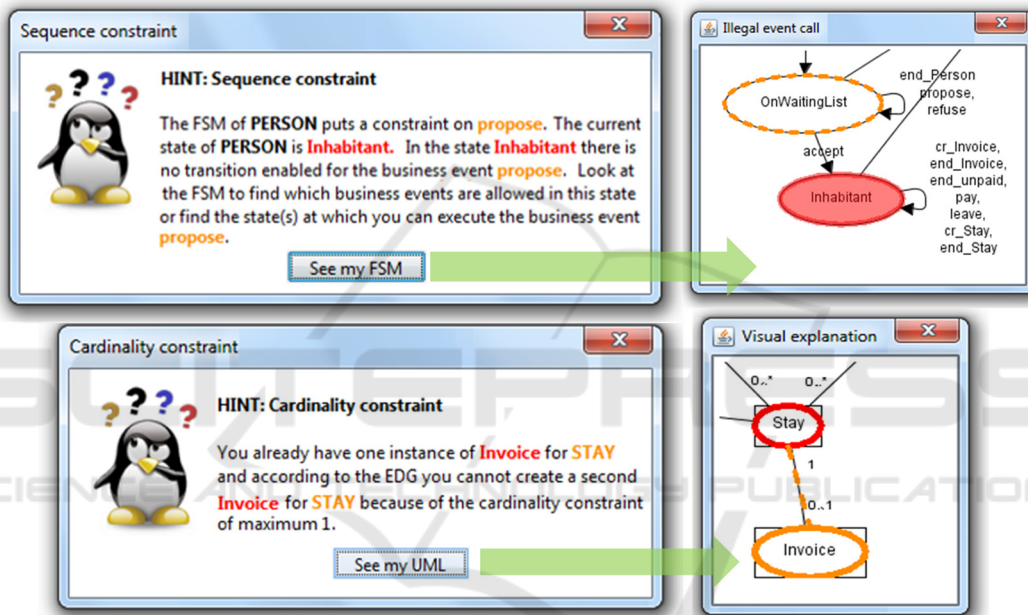


Figure 5: Sample generated textual and graphical feedback for a UML class diagram and a finite state machine (FSM).

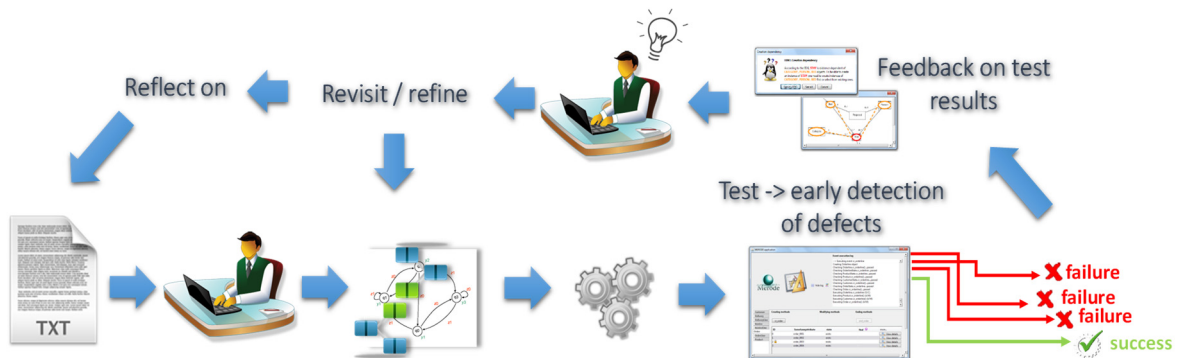


Figure 6: Positioning of the feedback in the modeling and validation process.

are used to construct a hint). The 2D graphics object is used to access the coordinate, color and font management system of the buffered image (an image

with an accessible buffer of image data) of a diagram. This allows to highlight the parts of the diagram that contains the constraint that causes the

error as well as to visualize the suggested hints for the correction of the error. The color scheme is consistent with the textual feedback which makes it easier to trace between the textual explanation and its graphical visualization. Sample generated textual and corresponding graphical feedback is presented in Figure 5.

The architecture of the proposed realization model also allows the feedback generation package to be easily plugged in/out in the final output. The exception handler can serve as a (dis)connection gate.

5 LOCATING THE FEEDBACK IN THE SEMANTIC VALIDATION PROCESS

In terms of positioning the proposed feedback technique with respect to the modeling and semantic validation process, the following sequence is implied (see Figure 6): the user starts with analyzing a textual description of requirements. S/he will then transform the requirements into a conceptual model containing both the static and dynamic representations of a system. At any step during the modeling process the user can simulate the model by means of prototype generation. The prototype is then used to test a model in terms of its semantic conformance with the requirements. The model is revisited/refined if semantic errors are detected. The feedback is intended to facilitate the interpretation of the causes of the detected errors. Such repetitive trial/error loops will also allow to reflect on the requirements in terms of detection of ambiguous, missing or contradictory requirements.

6 ASSESSING THE FEEDBACK DESIGN

User acceptance of the feedback-enabled model-to-code transformation tool was repeatedly evaluated in the course of several years of usage. The students found the tool useful and preferred its use (mean scores above 4.5 in six-position Likert-type scale). User satisfaction, preference, perceived usefulness and perceived ease of use were evaluated resulting respectively on average of 4.77, 4.78, 4.78 and 4.68 (with Cronbach Alpha above 0.84 and factor loadings per item above 0.86). The highest score in the anonymous evaluations was attributed by

students to the incorporated feedback in the prototype (5.58 on average). Additionally, the effectiveness of the incorporated feedback in the context of code generation (simulation) and its use in the process of semantic validation of models was experimentally evaluated. The findings of six empirical experimental studies (N = 201) showed a significant positive impact of the inclusion of the feedback on the semantic validation process of novices resulting in the average magnitude of effect of 2.33 out of 8 for validating the structural consistency (class diagram) and 4 out of 8 for validating the behavioral consistency (statecharts) and the consistency of behavioral aspects with the structural view of a system (contradicting constraints). The reader is referred to (Sedrakyan and Snoeck, 2012; 2013a; 2014a; 2014b; 2015; Sedrakyan et al., 2014) for more details on these experimental evaluations.

7 CONCLUSION

In this work we presented a feedback automation technique that allows enriching a model-execution environment with automated feedback with the purpose to assist novice modelers in the task of validating the semantic quality of a model. The feedback automation technique uses a model-driven development approach combined with template-based generation to incorporate a textual and visual feedback in the transformation output. The feedback approach scored very high on perceived utility by novice modelers. This self-reported utility was complemented by investigating the effectiveness of such feedback with empirical/experimental studies. The feedback was observed to stimulate self-regulated learning resulting in significantly improved learning outcomes. The utility and effectiveness of the proposed approach suggest that the same approach can be considered for application of the proposed automated feedback method outside the domain of conceptual modeling to provide feedback for a broader spectrum of diagramming techniques in a broader learning context such as databases, programming, model driven development and other courses. To advance the research further certain limitations should be also considered. The main limitation includes the fact that the approach requires a modeling environments that provides executable outputs (such as MERODE), i.e. models that can be readily transformed to code.

The work presented in this paper can be expanded along several directions, such as:

1. expanding the framework towards a generic feedback framework with a support for a broader spectrum of diagrams.
2. exploring advanced feedback mechanisms, such as personalization, using adaptive systems and learning reinforcement algorithms. This perspective is additionally supported by the logging functionality of the tool allowing to observe modeling and learning processes (Sedrakyan et al., 2014).
3. exploring interactive feedback mechanisms to guide a model correction process by also highlighting the effects of changes made in the model during the correction process.

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