Formal Ontology Driven Model Refactoring
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Abstract—Refactoring, successfully used in the field of programming, can be used in maintenance and restructuring of the large and complex models. In this paper, we present a novel approach for model refactoring and a set of modelling patterns that are applicable for refinement-based formal development. 

In order to carry out this study, we investigate the previously developed large and complex model and required ontology to develop a domain model and a refactored system model. Further, we use the Rodin tools to check the internal consistency with respect to the desired functional behaviour and the required safety properties. Our main contributions are: to develop a refactoring technique related to the correct by construction approach; to use the domain specific knowledge in a system model explicitly; to define a set of modelling patterns; and to define a restructuring mechanism in the formal development. Finally, this proposed approach is evaluated through a complex medical case study: ECG clinical assessment protocol.

Keywords—Refactoring, refinement and proofs, ontologies, domain theories, Event-B.

I. INTRODUCTION

In order to reduce the development cost and maintenance cost, the formal modelling of complex systems and adaptation of new changes according to the newly added or modified requirements is a demanding task. In particular, if a system is developed using a correct by construction approach then the original structure of the formal model does not accommodate the new changes and newly added requirements without restructuring and modularizing the formal model.

On the other hand, in general, the system development process does not handle the domain knowledge explicitly. Such knowledge is always encoded implicitly during the system development considering some assumptions. For example, in the flight management system, the flight speed can be represented in Kilometres per hour (kph) or Miles per hour (mph) when modelling the collected data from the speed sensors. The sensed speed must be displayed on the pilot screen or the passenger screen according to the selected unit. From this modelling, if any miscalculation results in the unit with the given numerical values (i.e. speed) by defining it explicitly.

It is highly desirable to define the domain knowledge with a system in an explicit way to improve the quality of the development process and to accommodate the new changes in the system requirements by restructuring the formal model [1]. To consider the domain knowledge in the software engineering practices has been considered an important step in the area of system modelling and analysis. The triptych [2], [3], [4] approach covers three main phases of the software development process: domain description, requirements prescription and software design. \( \mathcal{D}, \mathcal{S} \longrightarrow \mathcal{R} \) expresses a formal notation, in which \( \mathcal{D} \) represents the domain concepts in form of properties, axioms, relations, functions and theories; \( \mathcal{S} \) represents a system model; and \( \mathcal{R} \) represents the intended system requirements. This notation states that the given domain description (\( \mathcal{D} \)) and the system model (\( \mathcal{S} \)) are correct with respect to the given requirements (\( \mathcal{R} \)). In similar vein, Jackson’s structure [2] \( \mathcal{E}, \mathcal{S} \vdash \mathcal{R} \) describes the requirements appropriately. In this structure \( \mathcal{E} \) is the given environment, \( \mathcal{S} \) represents the intended specification that is optative description of a condition over the shared phenomena at the interface between the machine and the environment; and \( \mathcal{R} \) is the requirement. The proposed structure must respect the distinction between system and the physical environment, and the environment properties must be achieved by the modelled system [2].

In this paper, we investigate a novel approach for model refactoring that is applicable for refinement based formal development. In order to use the domain knowledge in an explicit manner in a large formal model, we focus on a popular approach refactoring [5]. The proposed approach uses ontologies to define the domain-specific concepts explicitly and redefines the required behaviour and properties in form of patterns that can be reused in the system modelling to describe the required functional behaviour. Note that the proposed refactoring approach restructures the formal model and introduces domain knowledge explicitly in a system model without changing the refinement strategy. In other words, handling the explicit semantics in formal development does not affect the original formal development, in fact it strengthens them by allowing such a facility. This approach has several benefits, such as modularity, integration of domain knowledge, reusability, maintainability, preserving the required safety properties by proving the refactored model, and the development of modelling patterns.
We use the Event-B language for modelling the domain model and system model. Our main contributions are: (1) to develop a refactoring technique related to the correct by construction approach; (2) to use the domain specific knowledge in a system model explicitly; (3) to define the modelling patterns; and (4) to define a restructuring mechanism in the formal development.

We demonstrate the usability of the proposed approach through revisiting the formal development of the ECG protocol [6]. In this development, we refactor the whole model by preserving the required safety properties and functional behaviour through integrating the domain knowledge, such as heart and ECG. Moreover, we also demonstrate the other benefits as enumerated above during the model development.

The structure of the article is as follows. In Section II, we review preliminary material: refactoring, ontology and the modelling framework. Section III presents a refactoring methodology for developing the domain model and refactored system model. Section IV illustrates an application of the refactoring methodology: the ECG clinical assessment protocol. Section V discusses the paper. Section VI presents the related work and in Section VII, we conclude the paper and discuss the future work.

II. PRELIMINARIES

A. Refactoring

Refactoring is one of the popular approaches in the field of programming that allows us to restructure the source code without modifying the functional behaviour of a system. This technique helps to clean up the developed code systematically by replacing the complex instructions with simple instructions, minimising the risks of introducing bugs, introducing modularity, and improving the readability and maintainability of the code [5], [7], [8]. In our work, we plan to use the refactoring techniques to the developed complex formal model [9], in which the formal model is developed using a correct by construction approach. Our main motivation to use the refactoring approach is to introduce the domain knowledge explicitly in a system model, minimising the complexity of proof structures, improving the maintainability of the developed formal model and improving the readability of the developed model. Note that the model refactoring allows us to restructure the developed formal model without modifying the functional behaviour and the characterization of the system/environment state at the abstract level and the refined levels. It means that all the defined safety properties for the given model must be proved. In addition, this approach has some other benefits that allow extracting the modelling design patterns, proof patterns, expose of an existing bug, separation of the domain model and system model, simplifying the proof strategies and to increase the proof automation. Moreover, all these benefits are derived from the proposed refactoring approach that allows us to refactor a system model applying modelling patterns and to introduce domain concepts explicitly. A set of modelling design patterns and restructuring of models related to refactoring can help to reduce the proof efforts. This reduction results from the factorization, at the domain model DM or context of domain properties proved many times at the system model SM level. Developing a domain model separately helps to identify any possible bugs of the old model due to the underspecification hidden by the implicit semantics carried by the modelling language.

B. Ontology

Ontology - “science of being” - is originated in philosophy, which is defined as “hierarchical structuring of knowledge about concepts by sub-classing them according to their properties and qualities” [10]. Alternatively, it is also defined as “a declarative model of a domain that defines and represents the concepts existing in that domain, their attributes and the relationships between them” [10], [11].

Another definition relies on the notion of a dictionary. [12] considers a domain ontology as a formal and consensual dictionary of categories and properties of entities of a domain and the relationships that hold among them. Here, an entity represents any concept belonging to the considered domain. dictionary entails two major concepts. First, it makes explicit the existence, through a constructive definition or declaration, of entities in the domain under consideration and second any entity or relationship described in this ontology is directly referenceable independently of other entities or relationships. Reference is carried by a symbol defining an identifier. This identification symbol may be either a language-independent identifier, or a language-specific set of words. However, whatever this symbol is, and unlike in linguistic dictionary, it directly denotes a domain entity or relationship. Each description of each entity or relationship is formally stated using an ontology modelling language equipped with a formal semantics. It allows automatic reasoning and consistency checking.

In our work, we use the ontology to model the domain-specific knowledge explicitly. In fact, the construction of a domain model allows us to refactor the previously developed system model. The development of domain model has several benefits: (1) to share knowledge in the same domain; (2) to reuse the existing domain model for any other system model; (3) to provide an explicit list of domain assumptions; (4) to separate the domain knowledge from the operational knowledge; and (5) to perform domain-specific methodical analyses.

C. The Modelling Framework: Event-B

This section describes the essential components of the modelling framework. In particular, we will use the Event-B modelling language [13] for modelling a complex system in a progressive way. There are two main components of Event-B: context and machine. A context is a formal static structure that is composed of several other components, such as carrier sets, constants, axioms and theorems. A machine is a formal dynamic structure that is composed of variables, invariants, theorems, variants and events (see Table I). A machine and a context can be connected with sees relationship.
### TABLE I: Model structure

<table>
<thead>
<tr>
<th>CONTEXT</th>
<th>MACHINE</th>
</tr>
</thead>
<tbody>
<tr>
<td>cts_id_2</td>
<td>machine_id_2</td>
</tr>
<tr>
<td>EXTENDS</td>
<td>cts_id_2</td>
</tr>
<tr>
<td>SETS</td>
<td>cts_id_2</td>
</tr>
<tr>
<td>CONSTANTS</td>
<td>s</td>
</tr>
<tr>
<td>AXIOMS</td>
<td>A(s, c)</td>
</tr>
<tr>
<td>THEOREMS</td>
<td>T(s, c)</td>
</tr>
<tr>
<td>END</td>
<td></td>
</tr>
</tbody>
</table>

### TABLE II: Proof obligations

<table>
<thead>
<tr>
<th>Theorems</th>
<th>Invariant preservation</th>
<th>Event feasibility</th>
<th>Variant progress</th>
</tr>
</thead>
<tbody>
<tr>
<td>( A(s, c) \Rightarrow T(s, c) )</td>
<td>( A(s, c) \land I(s, c, v) \Rightarrow T_m(s, c, v) )</td>
<td>( A(s, c) \land I(s, c, v) \Rightarrow \exists v' : BA(s, c, v, v') )</td>
<td>( A(s, c) \land I(s, c, v) \Rightarrow \exists v' : BA(s, c, v, v') )</td>
</tr>
</tbody>
</table>

Fig. 1: Four step modelling methodology

An Event-B model is characterized by a list of state variables possibly modified by a list of events. Events play an important role for modelling the functional behaviour of a system. An event is state transition that contains two main components: guard and action. A guard is a predicate based on the state variables that defines a necessary condition for enabling the event. An action is also a predicate that allows modifying the state variables when the given guard becomes true. A set of invariants defines required safety properties that must be satisfied by all the defined state variables. There are several proof obligations, such as invariant preservation, non-deterministic action feasibility, guard strengthening in refinements, simulation, variant, well-definedness, that must be checked during the modelling and verification process (see Table II).

Event-B modelling language allows us modelling a complex system gradually using refinement. The refinement enables us to introduce more detailed behaviour and the required safety properties by transforming an abstract model to a concrete version. At each refinement step, the events can be refined by: (1) keeping the event as it is; (2) splitting an event into several events; or (3) refining by introducing another event to maintain state variables. Note that the refinement always preserves a relation between an abstract model and its corresponding concrete model. The newly generated proof obligations related to refinement ensures that the given abstract model is correctly refined by its concrete version. Note that the refined version of the model always reduces the degree of non-determinism by strengthening the guards and/or predicates. The modelling framework has a very good tool support (Rodin [14]) for project management, model development, conducting proofs, model checking and animation, and automatic code generation. There are numerous publications and books available for an introduction to Event-B and related refinement strategies [13].

**D. OntoEventB Plug-in**

In [15], the OntoEventB plug-in tool is developed to generate Event-B domain models from ontologies models, such as OWL [16] or PLIB [17]. This tool is integrated in the Rodin [14] platform that allows to generate the domain models applying shallow or deep approach on the ontology description file. Note that this tool is successfully applied in our work to generate the domain models from the given ontologies.

### III. METHODOLOGY

#### A. Modelling Methodology

This section presents a modelling methodology (see Fig. 1), which contains the different modelling steps: domain modelling, system modelling, model annotation and model verification [1], [18]. These modelling steps are described as follows:

1) **Domain Modelling.** The required information related to a domain may be modelled as a domain ontology through defining concepts, entities, relationships, constraints and rules. In this work for modelling the domain model, we choose the Event-B modelling language to formalize the required domain concepts derived from the domain ontology, which can be described as theories in Event-B. Note that Event-B theory plugin\(^1\) can be used for this purpose.

2) **System Modelling.** For developing a safe system considering all the required functionalities is a challenging problem. A system can be described using axioms, constants, variables and events. In this work for modelling the system model, we also choose the Event-B modelling language.

3) **Model Annotation.** Model annotation is used to link the domain model and the system model explicitly by describing the relationships between design model entities and ontology concepts. As a consequence, the annotated design model is enriched by the domain properties expressed in the ontology.

4) **Model Verification.** This last step is performed when the system model is annotated with the domain model. Two verification steps are envisioned. The first one is

\(^1\)http://wiki.event-b.org/index.php/Theory_Plug-in#Standard_Library
conducted on the designed system model before annotation (maybe no longer correct after annotation) to check the consistency and then the second one must be conducted on the designed system model after annotation to check the overall consistency considering the domain knowledge. Note that in the second step, the verification also allows us for checking new emerging properties due to the integration of domain model and system model using annotations.

B. Refactoring Methodology

A common way of restructuring, introducing modularity, minimising the complexity of proof structures, and improving the maintainability and readability of a formal specification is to use the refactoring techniques, which allow changing the structure of a model without changing the system functionalities and the behavioural objectives of the model [5], [7], [8]. In general, two kinds of refactoring techniques are identified: structural refactoring and behavioural refactoring. The structural refactoring changes the structure of a formal model and preserves its behaviour without changing the reachable states. Note that this structuring mechanism allows a developer to transfer the same safety properties to the new refactored model because this refactoring ensures the observability equivalence. The behavioural refactoring may change the behaviour of a formal model. In fact, applying this approach there are partly reachable states comparing to the formal model before refactoring [19]. Our work sets up the structural refactoring.

We propose to handle explicitly domain knowledge in a formal model using structural refactoring. Fig. 2 depicts a graphical layout of the input and output of the defined structural refactoring moving source models to target ones. The upper part of this figure denotes the source models (system models (SM) and ontology).

We consider that ontology\(^2\) is available but it is not used by the system models SM since they do not explicitly refer to the domain model (ontology). The lower part of the Fig. 2 represents the target models composed of domain models (DM) obtained from the ontology, and the refactored system models (SM'). The horizontal lines define model dependencies (e.g. visibility, extension) between models while the vertical lines describe refactoring operations. For example, the target domain models (DM) are developed by formalising the ontologies. The target system models (SM') are refactored from the source system models SM.

A set of refactoring operations is identified. The approach we propose consists in analysing whether a refactoring operation can be applied to any complex formal model developed progressively using a correct by construction approach and the conceptual knowledge related to a domain is formalised implicitly in a system model. Each refactoring operation can be seen as a before-after predicate that preserves the properties of the source models while making explicit domain knowledge in the target models (refactored models).

To support system models SM refactoring, we have identified a set of structural development operations corresponding to specific model mappings. These mappings shall fulfill the characteristics attached to ontologies, in particular, the unique referencing mechanism. We have identified the following operations.

- **Formalize DM.** The definition of DM consists in producing a domain model by selecting the relevant ontologies associated to the studied system. This DM may be formalized as a context or a theory depending on the used formal method. The consistency of DM shall be ensured (axioms providing definitions of domain concepts shall be inhabited).
- **Factorise_SM_2_DM.** The operation moves from the system model SM, the definitions of concepts (e.g. definitions related to variables, invariants or theorems) of SM, to the ontology or DM. If not available, these concepts are raised at ontological level else they are added as redundant concepts (derived concepts using ontology modelling operators).
- **Transform_SM_2_SM'.** A target system model SM' is produced from a source system model SM by adding relationships to the DM model, i.e. adding direct references to the DM concepts, or adding mappings between SM and DM concepts. This operation may require rewriting both static (axioms, theorems, etc.) and behavioural concepts (guards, before-after predicates, substitutions, etc.).

**Remark.** In this case, it should be noted that the new emerging invariants and theorems may be expressed in the SM' model. They are entailed by the domain knowledge explicitation.

The previous operations mention the notion of mapping between models. Ontology engineering provides with several kinds of mappings like equivalence, subsumption, algebraic mappings which can be formalized in Event-B.

Finally, once refactoring is performed, the SM models shall be submitted to a new verification process.

IV. DEVELOPMENT IN MEDICAL DOMAIN: CLINICAL ASSESSMENT OF ECG

We adopt our generic refactoring methodology for developing the domain model and system model together using

\(^2\)Several ontologies and domain models have proposed by several organizations, standards, companies, etc. The process of building these ontologies is out of scope of this paper.
the Event-B modelling language. Fig. 3 depicts an extended graphical layout of the generic refactoring methodology to show the different components of the Event-B models. In the extended figure, the system model SM is composed of the context model CM and machine model MM. Similarly, in the refactored system model SM’ is also composed of the context model CM’ and machine model MM’.

The formal model of the ECG clinical protocol [9] is revisited to apply the proposed refactoring approach. Here, we recall the ECG protocol and then we develop the domain model, context model and system model progressively.

A. Electrocardiogram

An electrocardiogram (EKG or ECG)\footnote{The interested reader is referred to [6] for the detailed information on the ECG signal and the ECG clinical assessment protocol.} [6] signal presents an electrical activity of the human heart in continuous form to show the depolarisation and repolarisation phenomena. A typical cycle of ECG (see Fig. 4) represents a sequence of waves and intervals, which is denoted as P-QRS-T-U. These waves and intervals are defined as: P-wave - a small deflection caused by the depolarisation of atria before contraction to show an electrical wave propagation from the SA node through the atria; PR interval - an interval between the beginning of the P-wave to the beginning of the Q-wave; PR segment - a flat segment between the end of the P-wave and the start of the QRS interval. QRS interval - an interval between the P-wave and T-wave with greater amplitude to show the depolarization of the ventricles; ST interval - an interval between the end of the S-wave and the beginning of the T-wave; ST segment - a flat segment starts at the end of the S-wave and finishes at the start of the T-wave; T-wave - a small deflection caused by the ventricular repolarisation, whereby the cardiac muscle is prepared for the next cycle of ECG; and U-wave - a small deflection immediately following the T-wave due to repolarization of the Purkinje fibers.

B. The Medical Domain modelling

A medical domain is characterised by the abundance knowledge of medical science collected from various sources. Ontology has played a significant role in representing medical knowledge systematically in an independent format to share and reuse across other biomedical domains. The medical ontology framework provides the common medical concepts, relationships, properties, and axioms related to the biomedical, disease, diagnosis, treatment, anatomy, pharmacology, clinical procedure and so on. There are several medical ontologies, such as GALAN, OpenCyc, WordNet, UMLS, SNOMED-CT and FMA developed by researchers, industries and medical centers.

According to our proposed refactoring methodology, we develop a domain model derived from the available ontologies, and the existing system model. To our knowledge, there are several databases and ontologies to represent the ECG. Describing the conceptual knowledge of biological process of the ECG, we use the OBO (Open Biomedical Ontologies) Process Ontology [20], classified as the fundamental relation, spatial relation, temporal relation and participation relation [20]. In the current work, the two main fundamental used relations are is_a and part_of.

\[ \text{is}_a \text{ and } \text{part}_of \]

The is_a relation states that every instance of class A is an instance of class B and the second relation states that A part_of B holds if and only if: for every individual x, if x instantiates A then there is some individual y such that y instantiates B and x is a part of y. In the previous definitions, inst is a relation between a class instance and a class which it instantiates and the part_of_inst is a relation between two class instances. Other relations are defined in ontology modelling languages. All of them are rigorously defined.

The whole concepts of the ontology modelling language need to be formalized in the used formal modelling language, Event-B in our case. The fundamental relations, is_a and part_of, are defined in an Event-B context using axioms (axm1 - axm5). axm2 and axm3 define is_a relation and part_of relation, respectively. Other axioms (axm1, axm4 and axm5) are used to support the formal definition of the defined
applying the refactoring operations using Formalize_DM and Factorize_SM_2_DM (see Fig. 2 and Fig. 3).

| axiom1 | partition(CLASS, [ElementaryForm], [Waveform], [Wave], [Segment], [Cycle], [PQ_Wave], [QRS_Wave], [T_Wave], [U_Wave], [PQ_Segment], [ST_Segment], [QRS_Wave], [T_Wave], [U_Wave]) |
| axm2 | (Wave) ≡ (PrimaryForm) ∈ ISA |
| axm3 | (Wave) ≡ (Waveform) ∈ ISA |
| axm4 | (Wave) ≡ (Cycle) ∈ ISA |
| axm5 | (Wave) ≡ (PQ_Wave) ∈ ISA |
| axm6 | (Wave) ≡ (QRS_Wave) ∈ ISA |
| axm7 | (Wave) ≡ (T_Wave) ∈ ISA |
| axm8 | (Wave) ≡ (U_Wave) ∈ ISA |
| axm9 | (Wave) ≡ (PQ_Segment) ∈ ISA |
| axm10 | (Wave) ≡ (ST_Segment) ∈ ISA |
| axm11 | (Wave) ≡ (QRS_Wave) ∈ ISA |
| axm12 | (Wave) ≡ (T_Wave) ∈ ISA |
| axm13 | (Wave) ≡ (U_Wave) ∈ ISA |
| axm14 | (Wave) ≡ (PQ_Segment) ∈ ISA |

C. The Context Refactored Model (ECG Protocol)

In this section, we revisit the developed ECG protocol [9] to apply the proposed refactoring approach. Fig 8 describes the stepwise development of the domain model and system model covering the given requirements. This is a generic development where the domain model and system model evolve progressively.

| axiom1 | partition(State, [OBJ], [KG]) |
| axm2 | partition(Effective, [Yes], [No]) |
| axm3 | RState ∈ (Heart) → State |

CS1. ClinicalProp1 ≡ (ks ∈ [Heart]) ∧ y ∈ PWave ∧ (k1 ∈ [I1, V1, V2]) ∧ RRIntEQ (k1) ∧ TrcE ∈ RIRIntEQ (k1) ∧ PIRIntEQ (k1) ∧ PIRIntEQ (y) ⇒ TRUE

C. ClinicalProp2 ≡ (ks ∈ [Heart]) ∧ y ∈ PWave ∧ (k1 ∈ [I1, V1, V2]) ∧ RRIntEQ (k1) ∧ TrcE ∈ RIRIntEQ (k1) ∧ PIRIntEQ (k1) ∧ PIRIntEQ (y) ⇒ FALSE

Fig. 7 presents a high level description of the ECG using the OBO relations for deflections known as waves and segments. The elementary concepts are represented using the is_a and part_of relationships (axioms axm1-axm13). The remaining axioms (axm14-axm52) characterise the ECG signal. They are derived from the existing ontologies and the previously developed ECG model [9] by applying the refactoring operations Formalize_DM and Factorize_SM_2_DM (see Fig. 2 and Fig. 3).

These defined relations are used to model the domain knowledge for developing the ECG protocol using a correct by construction approach. The domain model of the ECG relies on existing work [6], [21], [22], [23]. It is based on several sub ontologies, organised in a subsumption hierarchy, such as human heart, blood circulation, bioelectric phenomena and ECG (see Fig. 5). The initial set of axioms are defined by applying the Formalize_DM refactoring operation (see Fig. 2 and Fig. 3).

Fig. 6 describes a very high level description that contains four chambers: left atrium, right atrium, left ventricle and right ventricle organised using the part_of and is_a relationships. The OBO relationships are defined in axioms (axm1-axm4) according to Fig. 6. The next axiom (axm5) defines a set of possible physical units, which can be associated with variables and constants (axm6 - axm8). The next remaining axioms (axm9 - axm11) are used to define the normal and abnormal heart rate. All these axioms are defined by
The abstract model of the ECG protocol contains three events, Rhythm_test_TRUE, Rhythm_test_FALSE and Rhythm_test_TRUE_abRate to assess the heart state by analysing the heart rhythm and the normal or abnormal heart rate. These events have used the domain model knowledge and the given clinical properties to specify the required behaviour. In these events, the guards are modified by applying the refactoring operation Transform_SM_2_SM' (see Fig. 2 and Fig. 3). The first guard of these events annotated with clinical properties (ClinicalProp1 and ClinicalProp2) are used to state the safety properties.

The ECG protocol's abstract model defines three variables, Sinus - sinus state of the heart, Heart_Rate - heart rate limit, and Heart_State - normal or abnormal heart state, in inv1-inv3. A set of safety properties (inv1-inv6) is introduced: inv1 - if the positive visualization of P-wave in lead II is FALSE, then there is no sinus rhythm; inv2 - if the sinus is yes then the clinical property ClinicalProp1 must be TRUE; inv3 - if the clinical property ClinicalProp2 is TRUE then there is no sinus rhythm; inv4 - if the heart rate belongs to the range of the normal heart rate and the sinus rhythm is yes then the heart state is OK; inv5 - if the heart rate belongs to the abnormal heart rate and the sinus rhythm is yes then the heart state is KO; and inv6 - if the heart rate belongs to the normal heart rate and there is no sinus rhythm then the heart state is OK. These set of properties are modified by using the refactoring operation Transform_SM_2_SM' (see Fig. 2 and Fig. 3). Note that the defined clinical properties (ClinicalProp1 and ClinicalProp2) are used to state the safety properties.

---

Domain | System | Requirements
---|---|---
D_1 | S_1 | R_{set_1}
\[ \text{extends} \] | \[ \text{refines} \] | \[ \text{added} \]
D_2 | S_2 | R_{set_2}
\[ \text{extends} \] | \[ \text{refines} \] | \[ \text{added} \]
\vdots & \vdots & \vdots \\
D_n | S_n | R_{set_n}

---

Fig. 7: ECG ontology

![ECG ontology diagram]

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Fig. 8: Development of Event-B models

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Fig. 9: Basic Diagram of Assessing Rhythm and Rate [6]

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D. The Machine Refactored Model (ECG Protocol)

In the abstract model, we define three variables, Sinus - sinus state of the heart, Heart_Rate - heart rate limit, and Heart_State - normal or abnormal heart state, in inv1-inv3. A set of safety properties (inv1-inv6) is introduced: inv1 - if the positive visualization of P-wave in lead II is FALSE, then there is no sinus rhythm; inv2 - if the sinus is yes then the clinical property ClinicalProp1 must be TRUE; inv3 - if the clinical property ClinicalProp2 is TRUE then there is no sinus rhythm; inv4 - if the heart rate belongs to the range of the normal heart rate and the sinus rhythm is yes then the heart state is OK; inv5 - if the heart rate belongs to the abnormal heart rate and the sinus rhythm is yes then the heart state is KO; and inv6 - if the heart rate belongs to the normal heart rate and there is no sinus rhythm then the heart state is OK. These set of properties are modified by using the refactoring operation Transform_SM_2_SM' (see Fig. 2 and Fig. 3). Note that the defined clinical properties (ClinicalProp1 and ClinicalProp2) are used to state the safety properties.

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Fig. 9: Basic Diagram of Assessing Rhythm and Rate [6]

![Basic Diagram of Assessing Rhythm and Rate]

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some new axioms (axm1-axm4). These axioms are defined to specify the heart state (HState) and the sinus state of the heart (HState). For developing the ECG protocol, the abstract model defines two clinical properties CS1 and CS2. These clinical properties use the domain knowledge to specify the ECG assessment protocol. These clinical properties are introduced in the context model using the refactoring operations Transform_SM_2_SM' (see Fig. 2 and Fig. 3). Note that these properties were introduced implicitly in the previous model of the ECG protocol [9].
properties is refactored in the context model as CS1 or CS2. The second guard of these events annotates the heart rate that is explicitly defined in the domain model.

The abstract model is further enriched by introducing the essential assessment steps progressively in a sequence of refinements, which corresponds to the standard analysis step of the ECG protocol [6].

Note that the new refactored models are different from the old models. For example, below we show an event equivalent to the refactored event \( Rhythm\_test\_TRUE \). In the old event, the guards and other domain properties are defined implicitly, while in the new refactored model the required properties are defined only once in the domain model (such as \( ClinicalProp1 \)) and it is used in the system model. Note that such refactoring approach has increased the proof automation.

\[
\text{EVENT Rhythm\_test\_TRUE} \\
\text{ANY rate} \\
\text{WHEN} \\
\begin{align*}
gdl &: ClinicalProp1(Cycle \rightarrow P\_Wave) = \text{TRUE} \\
gdl &: rate \not\in \text{NORMAL\_HEART\_RATE}
\end{align*} \\
\text{THEN} \\
\begin{align*}
a1 &: Sino = \text{Heart} \rightarrow \text{Yes} \\
a2 &: Heart\_Rate = rate \\
a3 &: Heart\_State = \text{Heart} \rightarrow \text{OK}
\end{align*} \\
\text{END}
\]

\[
\text{EVENT Rhythm\_test\_FALSE} \\
\text{ANY rate} \\
\text{WHEN} \\
\begin{align*}
gdl &: ClinicalProp2(Cycle \rightarrow P\_Wave) = \text{TRUE} \\
gdl &: rate \in \text{ABNORMAL\_HEART\_RATE}
\end{align*} \\
\text{THEN} \\
\begin{align*}
a1 &: Sino = \text{Heart} \rightarrow \text{No} \\
a2 &: Heart\_Rate = rate \\
a3 &: Heart\_State = \text{Heart} \rightarrow \text{KO}
\end{align*} \\
\text{END}
\]

\[
\text{EVENT Rhythm\_test\_rate} \\
\text{ANY rate} \\
\text{WHEN} \\
\begin{align*}
gdl &: (\exists l \in \{II, V1, V2\} \land \\
P\_R\_Interval(l) = \text{TRUE} \\
R\_Interval(l) = \text{TRUE}
\end{align*} \\
\text{THEN} \\
\begin{align*}
a1 &: Sino = \text{Yes} \\
a2 &: Heart\_Rate = rate \\
a3 &: Heart\_State = \text{OK}
\end{align*} \\
\text{END}
\]

Fig. 10: Taken from the old ECG model [9]

Due to space constraints, we omit the rest of the development. A detailed formal development of this ECG protocol is available on the website[4].

E. Model Verification

In this section, we describe the proof statistics of the developed model using refactoring approach. As we know that this development is based on the Event-B modelling language, which allows us to check the consistency checking and refinement checking. Table III presents the proof statistics of the progressive development of the old ECG model and the refactored ECG model. In this development applying the proposed refactoring approach, we achieve 543 (100%) proof obligations, in which 391 (73%) POs are proved automatically, and the remaining 152 (27%) are proved interactively using the Rodin provers, while the old development has more POs. Note that the generated POs of new refactored model also include other possible POs related to refactoring operations. The old model has more POs, including more manual interactions, due to the complex predicates and implicit domain knowledge. This refactoring approach has simplified the modelling constructs and development process that allows us to automate the several proof strategies of the refactored model. Moreover, the interactive proof obligations are also very simple that are proved with the help of SMT solver.

First, we mention that our approach has been deployed on a non-trivial development issued from the medical domain. Note that the obtained new refactored model of ECG is simple compared to the old model of ECG. Some of the states and behavioural properties, previously defined implicitly in the old model of ECG, are defined explicitly in the new refactored model of ECG. Shared ontological definitions are referenced in the new obtained model.

Moreover, according to the Table III, the proof efforts have been decreased comparing with the old model [9]. In particular, the number of interactive proofs is significantly decreased. Indeed, the domain model properties are proved once for all in DM and are used as hypotheses to prove the properties of the system model SM.

The results shown in Table III indicate that the use of refactoring approach with explicit domain knowledge has improved significantly the process of formal development and has produced the new simplified proof strategies.

V. Assessment

The explicitation of domain knowledge in system modelling leads to the expression of properties absent in the old system model due to implicit or lack of domain knowledge. For example, the heart rate is represented in a pair of unit (bpm) and value that must comply whenever heart rate is modified. Note that in our old model, there was no unit (bpm) for representing the heart rate, and thus this property was absent.

The proposed refactoring approach restructures the formal model and introduces domain knowledge explicitly in the system model. The approach reduces the system complexity, proof efforts and improves the model consistency. For example, the clinical properties (CS1 and CS2) are defined once in the context model using the domain concepts borrowed from DM. These properties have been used later in the SM’ to define safety properties (see saf2 and saf3) and guards (grd1 in all three events).

Due to model refactoring, the developed DMs can be reused for any other system model SM in relation with this domain. Moreover, due to separation of concerns, these refactored models are easily maintainable and can be used for further designs or analyses. For example, we have developed the DM...

of ECG used here for analysing the medical protocol. The same ECG DM can be used for developing any other medical system.

Note that the total number of refinements for both the old model and the newly refactored model is **identical**. The use of refactoring has great impact on reducing the proof efforts by restructuring and decomposing the complex model. The number of automated proofs has been increased. For example, the old model of ECG [9] has 58% automated POs while the new model of ECG has 73% of automated POs due to the availability of new hypotheses in the DM. Moreover, the interactive POs of the new model is simpler than the old ECG model.

### VI. RELATED WORK

The use of ontology in software engineering for designing a complex system has great interest by several researchers to consider the domain knowledge explicitly. Zayas et al. [24] proposed a methodology to interoperate existing heterogeneous design models to make them complete and precise with shared domain knowledge. In [1], [25], authors proposed a new approach for handling domain knowledge in design models. In this work, the domain models are developed using ontologies that can be used further during the system development applying annotation mechanism. Hacid et. al. [18] have used the similar approach to develop a domain model based on ontology for developing a system model using stepwise development. In [15], authors proposed a generic approach to integrate the domain description formalized by ontologies into an Event-B development process.

The initial idea of refactoring was proposed by Opdyke [7] and Griswold [26] in their dissertations. Fowler et al. [5] described the code refactoring approaches, methods and associated tools. Refactoring is defined as, "Refactoring is the process of changing a software system in such a way that it does not alter the external behaviour of the code yet improves its internal structure". Mens and Tourwé [27] compared and discussed different criteria related to the refactoring activities, specific techniques and formalism that can be used for reducing software complexity using restructuring. Bois et al. [8] proposed quality matrix to describe the impact of refactoring. They developed a set of guidelines used to improve the coupling and cohesion characteristics. Several tools, such as Eclipse", IntellIJ IDEA", have been developed for source code refactoring.

Refactoring approaches are not limited to programming languages. They have been adopted by the formal specification modelling languages: [28] for Event-B, [29] for ASM, [30] for Alloy, and [31] for Object-Z. Whiteside et al. [32] proposed a proof script refactoring approach for constructing, restructuring, and maintaining the development of formal proofs to support complex proofs. Kobayashi et al. [28] proposed the refactoring approach to restructure the refinements in Event-B. The main contribution is refinement decomposition based on a slicing strategy of a large model. The objective of our proposed refactoring approach is different from others. The main objective is to steer refactoring by modelling explicitly domain knowledge in a system model, minimising the complexity of proof structures, improving the maintainability of the developed formal model, exposing of any existing bug and improving the readability of the developed model.

### VII. CONCLUSION

This paper has presented a refactoring approach that allows us to refactor a complex formal model, where the formal model is developed using a **correct by construction** approach and the domain concepts have been modelled implicitly. We have proposed a set of operations that allows us to refactor a system model considering domain specific knowledge in form of ontology to produce the domain model and system model through preserving the correctness of functional behaviour of the system. We have highlighted these refactoring operations for automation. In the current work, we have applied all these operations manually. The semantical description of the operations is beyond the scope of this paper. Due to the modelling complexity and variety of refinement laws, we do not claim completeness of the refactoring operations at this stage. Our results showed that the proposed refactoring
operations can largely be automated to produce a simplified formal model with an explicit domain model.

In order to apply the refactoring approach, we selected the Event-B modelling language, which allows incremental refinement based on a correct-by-construction approach, for generating formal models. Further, the Rodin tools have been used to verify formally the produced refactored model. To assess the effectiveness of our proposed refactoring approach, we have revisited the formal development of the ECG protocol. We have developed the domain model and refactored system model in Event-B by using ontology and revisiting the developed formal model of ECG. In this development, we have refactored the whole model by preserving the required safety properties and functional behaviour through integrating the domain knowledge, such as the ECG. In order to guarantee the 'correctness' of the system behaviour, we have used a list of safety properties in the refactored model. Each refactored model was proven to guarantee the preservation of those safety properties.

Our future goal is to provide a semantical description and formalisation of the proposed refactoring operations ($\text{Transform}_X \times 2 \rightarrow X$ and $\text{Factorise}_X \times 2 \times X$). In the current work the total number of refinements is identical for both the old model and the newly refactored model. Thus, our new challenge in future will be to modify the refinement strategy for restructuring the formal development and optimising the refinement levels. In addition, studying the reusability of the proofs performed on the source models for the refactored target models is not addressed in this paper. We also plan to investigate this point in our future work. Moreover, we want to develop a tool based on the proposed refactoring operations to automate the process of refactoring the complex formal models.

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[23] “http://aber-owl.net/ontology/ECG.”