Faithful mapping of model classes to mathematical structures*

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Abstract

Abstraction techniques are indispensable for the specification and verification of the functional behavior of programs. In object-oriented specification languages like JML, a powerful abstraction technique is the use of model classes, that is, classes that are only used for specification purposes and that provide object-oriented interfaces for essential mathematical concepts such as sets or relations.

While the use of model classes in specifications is natural and powerful, they pose problems for verification. Program verifiers map model classes to their underlying logics. Flaws in a model class or the mapping can easily lead to unsoundness and incompleteness.

This article proposes an approach for the faithful mapping of model classes to mathematical structures provided by the theorem prover of the program verifier at hand. Faithfulness means that a given model class semantically corresponds to the mathematical structure it is mapped to.

Our approach enables reasoning about programs specified in terms of model classes. It also helps in writing consistent and complete model-class specifications as well as in identifying and checking redundant specifications.

1 Introduction

Abstraction is indispensable for the functional specification and verification of object-oriented programs. Without abstraction, types without an implementation (interfaces or abstract classes) cannot be specified. Abstraction is also necessary to support subtyping and information hiding.

One way of expressing data abstraction in specification languages is by relating implementations to mathematical structures such as sets and tuples. This approach was pioneered by the Larch project [1], which advocated two-tiered specifications consisting of a contract and a theory providing the mathematical structures.

The Java Modeling Language (JML) unifies these tiers to simplify the development of specifications [2]. Instead of using a separate language to describe mathematical structures, JML describes them in an object-oriented manner through **model classes**. These classes contain only pure (side-effect free) methods. Therefore, they can be used in specification expressions.

Figure 1 shows the use of model class JMLObjectSet for the specification of the class SingletonSet.¹ The model class, through its pure methods, encodes a mathematical set of objects. In order to use the model class, a model field _set is declared. It represents the abstraction of an instance of type SingletonSet as specified by the represents clause. One can specify SingletonSet's method setValue in an abstract way (that is, without referring to the private field value) using model field _set and JMLObjectSet's pure method has, which checks for set membership.

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¹A brief summary of the most important JML constructs is given in Section 2.1. Readers who are not familiar with JML might want to read that section first.

```
package java.util;
//@ import org.jmlspecs.models.JMLObjectSet;

public class SingletonSet {
   private Object value;
   //@ public model JMLObjectSet _set;
   //@ private represents _set <- new JMLObjectSet(value);

/*@ public normal_behavior
   @ ensures _set.has(o);
   @ assignable _set;
   @*/
   public void setValue(Object o) { value = o; }

   // other constructors and methods omitted</pre>
```

Figure 1: Specification of type SingletonSet using model class JMLObjectSet.

While model classes are useful for specification purposes, they pose problems for verification. Program verifiers have to encode model classes in the underlying theorem prover. This can be done by encoding pure methods and their contracts by uninterpreted function symbols and axioms, respectively [3, 4, 5, 6]. However, this approach is not optimal for model classes because the tactics of a theorem prover are optimized for theories that are part of the prover's theory-library rather than for encodings of JML model classes. Moreover, it is difficult to ensure soundness of such encodings, especially in the presence of recursive specifications [3].

To overcome these problems, previous work [7, 8, 9] proposes to map model classes and their pure methods directly to theories of the theorem prover. This is possible because model classes are in fact very similar to mathematical structures. Their objects are immutable, all their operations are side-effect free, and equality is based on their state rather than object identity. Therefore, instances of model classes behave like mathematical values rather than heap-allocated objects. This view greatly simplifies reasoning about model classes, in particular, because it is typically not necessary to make the heap explicit in the reasoning.

For instance, the specification expression $_set.has(o)$ in the specification of method setValue in Figure 1 can be mapped to $o \in _set$. By mapping the expression new JMLObjectSet(value) in the represents clause for $_set$ to the singleton set $\{value\}$, we obtain the following proof obligation for setValue: $o \in \{o\}$, which is trivial to prove. This proof obligation is considerably better suited for verification than the proof obligation has(JMLObjectSet(o), o) that one would obtain by encoding each method and constructor m of the model class by a function symbol \hat{m} and the corresponding axioms.

However, existing work only discusses the mapping of method signatures, but ignores their contracts. With this approach, the meaning of has is given by the definition of symbol '\in ', and not by the contract of has. This is problematic if there is a mismatch between the contract and the semantics of the operation given by the theorem prover: static program verifiers might produce results that come unexpected for programmers who rely on the model class contract. The results may also vary between different theorem provers, which define certain operations slightly differently (for instance, division by zero yields 0 in Isabelle [10], while it is not admissible in PVS [11]). Moreover, runtime assertion checking might diverge from static verification if the model class implementation used by the runtime assertion checker is based on the model class contract.

To illustrate the possible discrepancies between static verification and runtime assertion checking, assume that we have the following specification for one of the constructors of JMLObjectSet:

```
/*@ public normal_behavior
  @ ensures (e == null ==> \result.isEmpty())
  @ && (e != null ==> \result.has(e));
  @*/
public JMLObjectSet(/*@ nullable @*/ Object e);
```

That is, the constructor returns an empty set if the argument is null, and a set that contains e otherwise. With this behavior of the constructor, the runtime assertion checker reports an error for the call mySingletonSet.setValue(null) because in the post-state of setValue, the set _set is empty and, thus, does not actually contain null. That is, _set.has(null) yields false. However, as we have argued above, the proof obligation obtained by applying the mapping can be trivially proven. This discrepancy is due to the fact that mapping JMLObjectSet(/*@ nullable @*/ Object e) to {e} alters the semantics of the specification in the case when e is null.

In this article, we show how model classes can be mapped to theorem provers without semantic mismatches. The main contribution of our work is a technique for proving that the mapping of a model class to a mathematical structure defined by the theorem prover is faithful. Faithfulness means that the model class and the structure indeed correspond to each other in their properties. To show faithfulness, we prove formally that the mapping is consistent and complete. Consistency means that everything that can be proved using the contracts of the model class can also be proved using the corresponding structure of the theorem prover. Completeness means that everything that can be proved using the structure defined by the theorem prover can also be proved using the contracts. Once faithfulness of a model class has been proven, the mapping can be used for program verification without worrying about semantic discrepancies. In particular, the above discrepancy between the static verification of setValue and runtime assertion checking is detected during the consistency proof for JMLObjectSet.

Our approach leads to important results beyond semantical correspondence and simplified reasoning. Model class contracts are complex and can easily get inconsistent, which can lead to unsound reasoning. Showing that a model class can be mapped consistently to a mathematical structure proves that the model class contract itself is consistent (provided that the structure is well-defined). In fact, one of our case studies discovered an inconsistent specification in one of the most basic model classes of JML.

This shows that proving faithfulness of mappings helps in writing better specifications for model classes by making them consistent and complete. Our approach can also be used to identify redundant parts of specifications as well as to check whether specifications marked as redundant are indeed derivable from non-redundant specifications. These capabilities further improve the quality of model-class specifications.

Throughout the article we will use JML [12] as specification language and Isabelle [10] as target theorem prover. However, the presented approach is applicable to any combination of specification language and theorem prover, for instance, Eiffel [13] and Coq [14].

This article extends our earlier paper [15] by more details, explanations, examples, and, in particular, the coverage of inductive data types, which are a common way of specifying mathematical structures in theorem provers. Inductive data types come with a variety of properties such as the induction principle that can typically not be derived from JML specifications. Therefore, a different proof technique is required to show completeness of a JML model class w.r.t. an inductive data type.

The rest of this article is structured as follows. Section 2 describes the essential features of JML and Isabelle that are referred to in this article. Furthermore, a JML model class and an Isabelle theory is introduced, through which we illustrate the main concepts of our approach. Section 3 presents our solution for the faithful mapping of model classes to mathematical structures defined by a theorem prover. Section 4 presents a case study we performed on model class JMLObjectSet. Section 5 extends our approach to handle model classes that are mapped to inductive data types. Section 6 demonstrates the extension by a second case study on model class JMLObjectSequence. Section 7 gives an overview of related work, and in Section 8 we conclude.

2 Preliminaries

In this section we briefly introduce those constructs of JML and Isabelle that are used in later sections. We also introduce a JML model class and an Isabelle theory that will be used as running example later.

2.1 The Java Modeling Language

JML is a behavioral interface specification language that follows the paradigm of Design by Contract [16] and is specifically tailored to the Java programming language. JML specifications are embedded in Java comments that start with an at-sign (@). Thus, Java programs annotated with JML specifications can still be processed by Java compilers.

One of the key design decisions behind JML is that the syntax of specification expressions is based on side-effect free Java expressions, extended with a few additional constructs. Thus, programmers need not learn a formal language from scratch but can get acquainted with the language with significantly less effort.

Method specifications. The functional behavior of methods² is specified by preconditions, postconditions, exceptional postconditions, and assignable clauses. The precondition (requires clause) of a method specifies what must hold when the method is called. The postcondition (ensures clause) specifies what must hold if and when it terminates. The exceptional postcondition consists of two clauses: (1) the signals_only clause specifies what type of exceptions may be thrown by the method; (2) the signals clause specifies what must hold at the point when a certain type of exception is thrown. The assignable clause of a method specifies which locations the method may modify. All other locations must remain unchanged. Constructors need not mention locations of the object being initialized.

JML provides different kinds of method specification cases of which the most general one is the "behavior specification case". It may contain all five clauses mentioned above. A "normal behavior specification case" (normal behavior clause) specifies method behavior in which methods may not throw exceptions. It is syntactic sugar for a behavior specification case to which the "signals (Exception) false;" clause is added. An "exceptional behavior specification case" (exceptional behavior clause) specifies method behavior in which methods must throw exceptions. It is syntactic sugar for a behavior specification case to which clause "ensures false;" is added. Note that a method may have both a normal and an exceptional behavior specification case. If so, the preconditions of the cases must be disjoint, otherwise the behavior is not implementable.

JML extends Java with the modifier **pure** that marks methods to be side-effect free. Thus, the pure modifier can be thought of as a short-hand for the clause "assignable \nothing". When a constructor is marked to be pure then it may only have side-effects on the object being initialized. Due to their side-effect freeness, pure methods may be invoked in specification expressions.

Another JML modifier applicable on method declarations is **model**. It marks methods to be specification-only, that is, calls to model methods must not appear in implementations.

Type specifications. Object invariants (**invariant** clause) specify the consistent states of objects. In JML, they specify properties that must hold in all **visible states**, that is, in all pre- and post-states of method executions [17].

The **pure** modifier applied to a type means that all its instance methods are pure. The **model** modifier applied to a field declaration marks the field to be used for specification purposes only. The relation between the value of a model field and the values of other (possibly model) fields is determined by the **represents** clause, which allows one to write abstraction functions [18].

The semantics of JML does not allow, by default, declared fields, method parameters, and return values of reference type to be **null**. To allow them to take the **null** value, one has to use the **nullable** modifier in field declarations and method signatures.

Invariants and method specifications can be marked redundant by the **implies_that** keyword, preand postconditions by the **requires_redundantly** and **ensures_redundantly** keywords, respectively. Specification elements marked as redundant should be derivable from other, non-redundant specifications.

The **import** declaration in specifications allows one to refer to types that are used for specification purposes only, for instance, model classes.

At the time of writing, **immutable** was not part of the JML syntax. Still, for the purpose of this article we will use it as a modifier on types to specify that instances of such types are immutable. This is particularly important for model classes, which can be thought of as mathematical structures.

Expressions. JML's expression syntax extends Java's side-effect free expression syntax. The most important extensions are additional logical connectives (for instance, implication ==> and equivalence <==>), the \old construct used in postconditions to refer to values in pre-states, and the \result construct used in postconditions of non-void methods to refer to the return value. JML also adds

²In the sequel, we include constructors when referring to "methods". We will distinguish between constructors and methods explicitly only when specifically needed.

quantifiers \forall and \exists. The syntax of universal quantification is (\forall x; E_R ; E), where both E_R and E are predicates and E_R defines the range of the quantification for which E must hold. If omitted, E_R defaults to true.

2.2 An example model class: JMLObjectSet

As an example to demonstrate some of the features of JML, we take model class JMLObjectSet, which is part of the model library of the JML distribution [19]. The class encodes sets of objects. That is, it provides the usual operations of mathematical sets and equality of elements is based on Java's reference equality ("=="). Figure 2 presents the class with those members that we discuss in this article. Other methods and specification elements are omitted for brevity.

The class is specified to be pure, thus, all its instance methods are pure. Furthermore, the class is specified to be immutable. Thus, methods that return JMLObjectSets (for instance, union) do not mutate their receiver objects but return new instances. Since no arguments or return values are marked to be nullable, all reference type arguments and return values are considered to be non-null.

The class is specified by method specifications and an invariant. Two sample normal behavior specification cases are given for methods insert and union. Note that assignable clauses are not needed since all methods are pure. The invariant expresses that method equational_theory has to return true in every visible state for every non-null JMLObjectSet instance s2, and objects e1 and e2. Method equational_theory is a static pure model method and has a large normal behavior specification case containing equations written in the style of algebraic laws. As a result, the invariant of the model class prescribes that all equations specified by the method specification of equational_theory have to hold in all visible states. For brevity, Figure 2 shows only a sample equation defining method union.

This way of writing invariants is typical for model classes and thus, such invariants are commonly referred to as the **equational theory** of the class. We will use this terminology in the sequel, too. Furthermore, we will use the term "invariant" when referring to an equation prescribed by the specification of method **equational_theory**, for instance, to the equation that defines method **union**.

The proposed mapping of the class and its methods to one of Isabelle's set structures is given by the mapped_to clauses that we introduce in this article.

We follow the proposal of Leavens et al. [8] and Charles [7], and consider model classes to be final and unrelated to Java's type hierarchy rooted in class Object. This prevents problems related to inheritance, method overriding, and dynamic dispatch. In the realm of model classes, these restrictions seem acceptable since model classes are supposed to describe elementary mathematical concepts and to be used only for specification purposes.

2.3 Isabelle/HOL and theory HOL/Set

Isabelle [20] is a generic interactive LCF-style theorem prover. It is generic in that it provides a metalogic, which allows one to implement different logical formalisms, for instance, FOL (first-order logic) and ZF (Zermelo-Fraenkel set theory). This article uses Isabelle/HOL [10, 21], which is the specialization of Isabelle for the logical system of higher-order logic. In the sequel, we will interchangeably use the term "Isabelle" to refer to both Isabelle, the theorem prover, and Isabelle/HOL, the logical system.

Isabelle is interactive, that is, users have full control over the process of proving theorems. However, several automatic decision procedures and tableaux provers (collectively called **tactics**) are available, which significantly simplifies and accelerates the proof process. Two of the often used tactics are **simp**, which is based on term rewriting; and **auto**, which is a tableaux prover.

Isabelle is an LCF-style theorem prover, that is, it is based on a small logical core [22]. Everything else is supposed to be defined on top of this core by conservative extensions [23], which ensure its logical consistency. Although Isabelle allows users to state axioms, it is strongly discouraged due to the risk of making the specification inconsistent.

When working with Isabelle, users write theories. Theories typically consist of type and functionsymbol declarations, and of definitions and theorems over these types and symbols.

An example theory. We guide the reader through a snippet of theory HOL/Set [24] in order to introduce the constructs that are necessary for the understanding of the article. The relevant parts of

```
package org.jmlspecs.models;
//@ immutable
//@ mapped_to("Isabelle", "HOL/Set", "\alpha set");
public final /*@ pure @*/ class JMLObjectSet {
  /*@ public invariant
   @ (\forall JMLObjectSet s2; s2 != null;
   0
         (\forall Object e1, e2; ;
          equational_theory(this, s2, e1, e2))); */
  /*@ public normal_behavior
   @ ensures \result <==>
        (s.union(s2)).has(e1) == (s.has(e1) || s2.has(e1));
   @ static public pure model boolean
   @ equational_theory(JMLObjectSet s, JMLObjectSet s2,
                       Object e1, Object e2); */
  //@ mapped_to("Isabelle", "{}");
  public JMLObjectSet();
  //@ mapped_to("Isabelle", "insert e {}");
  public JMLObjectSet(Object e);
  //@ mapped_to("Isabelle", "elem : this");
 public boolean has(Object elem);
  //@ mapped_to("Isabelle", "this = s2");
  public boolean equals(Object s2);
  //@ mapped_to("Isabelle", "this = {}");
  public boolean isEmpty();
  public int int_size();
  //@ mapped_to("Isabelle", "this <= s2");</pre>
  public boolean isSubset(JMLObjectSet s2);
  //@ mapped_to("Isabelle", "this < s2");</pre>
  public boolean isProperSubset(JMLObjectSet s2);
  //@ mapped_to("Isabelle", "SOME x. x : this");
 public Object choose();
  /*@ public normal_behavior
   @ ensures (\forall Object e; ; \result.has(e) <==>
        (this.has(e) || e == elem)); */
  //@ mapped_to("Isabelle", "insert elem this");
  public JMLObjectSet insert(Object elem);
  //@ mapped_to("Isabelle", "this - (insert elem {})");
  public JMLObjectSet remove(Object elem);
  /*@ public normal_behavior
   @ ensures (\forall Object e; ; \result.has(e) <==>
        (this.has(e) || s2.has(e))); */
  //@ mapped_to("Isabelle", "this Un s2");
 public JMLObjectSet union(JMLObjectSet s2);
  //@ mapped_to("Isabelle", "this - s2");
 public JMLObjectSet difference(JMLObjectSet s2);
```

Figure 2: Model class JMLObjectSet containing the signatures of methods we consider in this article.

```
theory Set
imports LOrder
begin
typedecl \alpha set
consts
                    :: "\alpha set"
  "{}"
                    :: \ "\alpha \ \Rightarrow \ \alpha \ \mathtt{set} \ \Rightarrow \ \alpha \ \mathtt{set}"
  insert
                    :: "(\alpha \Rightarrow bool) \Rightarrow \alpha set"
  Collect
                    :: "\alpha set \Rightarrow \alpha set \Rightarrow \alpha set"
  "op :"
                    :: "\alpha \Rightarrow \alpha \text{ set } \Rightarrow \text{bool}"
translations
  "{x. P}"
                    == "Collect (\lambda x. P)"
axioms
  mem\_Collect\_eq: "(a : {x. P(x)}) = P(a)"
  Collect_mem_eq: \{x. x:A\} = A
defs (overloaded)
  subset_def: "A <= B</pre>
                                    == \forall x. x:A \Rightarrow x:B"
  psubset_def: "A < B
                                    == A <= B & ~A=B"
  set_diff_def: "A - B
                                    == \{x. x:A \& ~x:B\}"
defs
  Un_def:
                    "A Un B
                                    == \{x. x:A \mid x:B\}"
  empty_def:
                    "{}
                                    == \{x. False\}"
  insert_def: "insert a B == {x. x=a} Un B"
lemma subsetI: "(\forall x. x:A \Rightarrow x:B) \Rightarrow A <= B"
  by (simp add: subset_def)
end
```

Figure 3: Snippet of Isabelle theory HOL/Set containing signatures, axioms and definitions we consider in this article.

the theory are presented in Figure 3.

The theory begins by importing another theory HOL/LOrder, which means that all symbols, definitions, axioms, and theorems that are available in HOL/LOrder are also available in HOL/Set. Next, a new type α set is introduced, where α is a type variable that gives rise to polymorphic types [10].

Keyword **consts** declares five new function symbols for the empty set, element insertion, set comprehension, union, and set membership, respectively. Union and set membership are defined to be infix operators—not shown in the figure to avoid unnecessary syntactic clutter.³

The constant declaration is followed by the definition of syntactic sugar for set comprehension and the axiomatization of set comprehension. The axioms are followed by definitions; the first group defines the semantics of symbols that are not introduced by theory HOL/Set but are already available in the imported theory HOL/LOrder. These are subset, proper subset, and set difference. The second group defines the newly introduced symbols—except the already axiomatized set comprehension.

Finally, a theorem is stated (introduced by keyword **lemma**) and proven using the **simp** tactic, which uses a pre-defined set of axioms, definitions, and theorems. For the proof of the theorem, this set is extended by definition **subset_def**.

 $^{^{3}}$ We also omitted other, rather cryptic parts to ease understanding. As a result, the presented specification does not parse with Isabelle.

3 Faithful mapping

In this section, we present our solution for proving that the mapping of a model class M to a mathematical structure S (as defined by some theory) is faithful. That is, there is a semantic correspondence between M and S, namely, they are **isomorphic**. Here, we assume that structure S is defined non-inductively. Inductive structures are discussed in Section 5.

The process consists of three stages. In the first stage, we specify the mapping of M to S by the proposed mapped_to clause. Then we prove consistency and completeness of the specified mapping in the second and third stage, respectively. In this section, we present the details of these stages.

3.1 Specifying the mapping

In the first stage, one has to decide how to map model class M. That is, one has to specify (1) to what structure S is the model class mapped; and (2) to which function symbols of S are the methods of the model class mapped.

The mapping of a model class is specified by attaching to it the specification construct mapped_to that we propose in this article. The first parameter specifies the target environment, the second the target context, and the third the specific type in the context to which the model class is mapped. Figure 2 shows a possible mapping of model class JMLObjectSet: it is mapped to the Isabelle theorem prover, namely to its HOL/Set theory [24], more specifically to type α set. Alternatively or additionally, the class could be mapped to other provers such as PVS and Coq. In these provers, sets are represented as predicates [25, 26], that is, functions from a given type to booleans. A possible mapping is:

```
//@ mapped_to("PVS", "sets[Object]", "set");
//@ mapped_to("Coq", "Coq.Sets.Classical_sets", "Ensemble");
```

The mapping of methods is specified by mapped_to clauses attached to the methods. The first parameter of the clause is again the target environment and the second specifies the way the model-class method is mapped to some term in the target context. For instance, in Figure 2, JMLObjectSet's has method is mapped to Isabelle's set membership ':'. In PVS and Coq, the following mapping could be chosen for the method:

```
//@ mapped_to("PVS", "member(elem, this)");
//@ mapped_to("Coq", "In this elem");
```

The second parameter of mapped_to clauses typically mentions function symbols of the target context as well as parameters (including the receiver) of the method being specified. Note, however, that we permit arbitrary terms of the target context; this flexibility allows us to specify mappings even if the target theorem prover does not provide a structure that directly corresponds to the model class being mapped. An example where this flexibility is necessary is JMLObjectSet's remove method, which removes a single element of a set. The theory HOL/Set does not have a corresponding operation; thus, if our approach allowed only direct correspondence between methods and function symbols, then this simple operation could not be handled with the chosen mapping. See Section 4.3 for further details on the mapping of the method.

We call the mapping of some method m with parameters \mathbf{this} , p_1, \ldots, p_n to some term T direct if and only if T is of the form $f(a_1, \ldots, a_m)$, where f is some function symbol, $m \geq 0$, and each a_i is either one of the parameters of m or a constant symbol. For instance, the mappings of the two constructors of model class JMLObjectSet are direct: JMLObjectSet() is mapped to the constant symbol $\{\}$, and JMLObjectSet(Object e) is mapped to function application insert e $\{\}$. However, the mapping of method remove is not direct: it is mapped to the term $this - (insert\ elem\ \{\})$, where - is an infix operator. Since the second argument contains the non-constant symbol insert, the mapping is not direct.

To support multiple theorem provers, multiple mapped_to clauses may be attached to the model class and its methods. This is needed since different theorem provers provide different theories with different

function symbols and syntax for the same functionality. Thus, the isomorphism proof has to be carried out in every target theorem prover specified in mapped_to clauses.

Important to note is that mappings need not be specified by programmers who are typically not familiar with theorem provers and their theories and syntax. They can be specified by the author of a model class or by the team that performs the verification. The same applies also to the consistency and completeness proofs, which typically require experience in theorem proving.

The proposed mapped_to clause is only used for the purpose of static verification. For runtime assertion checking the clause can be ignored.

3.2 Consistency

of method m.

Once the mapping is specified, its faithfulness has to be proven. For each theorem prover, this proof needs to be carried out only once. Afterwards, any verification system can make use of the specified mapping to handle model classes in specifications. In this subsection, we describe how to prove consistency of the mapping, that is, we prove that the properties of model class M (as specified by its contracts) can be derived from the properties of structure S (as defined by axioms and definitions).

In order to prove consistency, one has to encode the method specifications and invariants of M in the language of S based on the mapped_to clauses and prove the resulting formulas using the properties of S. In fact, not all method specifications have to be translated and proved but only the ones that specify the normal behavior of a given method. Behavior and exceptional behavior specifications cases describe situations when the method might throw exceptions. We ignore such cases for the isomorphism proof because we assume that all JML specifications are well-defined [6], that is, exceptions are guaranteed never to be thrown.

In the sequel, we use the term **relevant specification element** to refer either to an invariant or to a normal behavior method specification case of a model class. Every relevant specification element s_M in M needs to be translated and proved as follows:

- 1. (a) If s_M is a method specification of a method m with precondition pre and postcondition post then it is translated into a formula of the form " $pre \Rightarrow post$ ", which is universally quantified over all parameters (including the implicit receiver **this**) of m. Note that it is not necessary to conjoin M's invariant to the pre- and postcondition because invariants of model classes do not restrict the state space of their instances, but rather give equational laws about their operations. These laws are dealt with separately when the invariant is translated as one of the relevant specification elements. (b) Occurrences of every method call in s_M to some method m are replaced by the term prescribed in the mapped_to clause of method m. For simplicity, we assume that JML's logical operators
 - operator is mapped to logical implication) and that this implicit mapping is faithful. (c) If s_M is a method specification of a method m, then in the postcondition all occurrences of **result** (this if m is a constructor) are replaced by the term prescribed in the mapped_to clause

are also method calls with implicit mappings to the underlying theorem prover (e.g., JML's ==>

2. The formula that is derived in step 1 is turned into a lemma and proved in the theorem prover specified by the mapped_to clause using the axioms, definitions, theorems, etc. of S.

We demonstrate this process on JMLObjectSet's insert method. Its specification is presented in Figure 2. In step 1(a), the postcondition gets universally quantified over the parameters of insert, this and elem. In step 1(b), the two method calls to has get replaced by Isabelle's set membership operator ':' as prescribed by the mapped_to clause of has in Figure 2. This yields terms "e: \result" and "e: this". Additionally, the logical operators \forall, <==>, ||, and == get replaced by the corresponding Isabelle operators \forall , =, \lor , and =, respectively. Step 1(c) replaces \result by "insert elem this" as prescribed by the mapped_to clause of method insert. This yields the following formula:

```
\forall this, elem. \forall e. (e:(insert\ elem\ this)) = ((e:this) \lor (e=elem))
```

In step 2, the formula is turned into a lemma in Isabelle. Its proof can be completed automatically by the **auto** tactic. This is not surprising since theorem provers like Isabelle are typically well-equipped with theorems over structures such as sets.

Completing this stage successfully for every relevant specification element in model class M gives us the guarantee that whatever can be proven using the properties of M also can be proven using S. An important consequence of this result is that the specification of M is consistent (that is, free from contradictions), provided that S is consistent. Since structures like Isabelle's HOL/Set are defined using conservative extensions and have been reviewed by many people, it is rather unlikely that they contain inconsistencies. In other words, in this stage we prove that Isabelle's HOL/Set theory is a **model** for the axioms extracted from the specification of model class JMLObjectSet. By exhibiting this model, we prove that the specification of JMLObjectSet is consistent.

This is also an interesting result concerning the use of pure methods in specification expressions. As we have shown earlier [3], the use of pure methods in specifications can easily lead to unsoundness. The solution we proposed in our earlier work to prevent unsoundness was to exhibit a witness for showing that the specification of the method is satisfiable. Recursive specifications require a proof of well-foundedness [6], which can be difficult for pointer structures. With the approach presented above, recursive specifications do not pose any problems because the consistency of the mapping of a method m to a well-defined element of S implies that m is also well-defined, no matter whether it is specified recursively or not.

As the example of method insert suggests, proving this stage may be fully automated: (1) the lemma was generated following three simple steps performing syntactic replacements based on mapped_to clauses, and (2) the lemma was proved without any user interaction using a powerful tactic of Isabelle. We note, however, that for more complicated properties the mere use of tactics does not suffice and one has to help the prover by giving hints at which theorems of S to use.

Consistency and sound verification

Although proving consistency is sufficient to show that the specification of a model class is free from contradictions, we demonstrate by an example that it is not sufficient for the use of mapped_to clauses for verification purposes.

Assume model class JMLObjectSet had a method bogusUnion that was mapped to Isabelle's set union operation and was specified as follows:

```
/*@ public normal_behavior
  @ ensures !this.isEmpty() ==> !\result.isEmpty();*/
//@ mapped_to("Isabelle", "this Un s2");
public JMLObjectSet bogusUnion(JMLObjectSet s2)
```

Consistency of the specification can be proven trivially since the specified property holds for Isabelle's union operation Un, too. However, consider the following expression:

```
new JMLObjectSet().
bogusUnion(new JMLObjectSet(e)).has(e)
```

The specification of bogusUnion does not allow us to determine whether the expression is true or false, while the corresponding Isabelle formula " $e:(\{\}\ Un\ (insert\ e\ \{\}))$ " is trivially provable. Thus, it would be unsound for a program verifier to map method bogusUnion to symbol Un since we would allow more properties to be proven after the mapping than we could prove before the mapping using the model-class specifications. For instance, the specification of the method allows the implementation return this, which clearly violates the properties of set union.

Intuitively, the problem is that the specification of bogusUnion only describes one particular property of what we understand under the mathematical union of sets. However, after having mapped bogusUnion to Isabelle's Un symbol, the method is bequeathed all the additional properties that symbol Un has. For the faithful mapping of bogusUnion, we need to show that the method indeed possesses these bequeathed properties. This is the task of the next stage, where we prove completeness, which often requires one to strengthen specifications of model classes.

3.3 Completeness

In the third stage, we complete the isomorphism proof by showing completeness of the mapping, that is, that the properties of structure S can be derived from the properties of model class M. The proof procedure is as follows:

- 1. Each method m of M is turned into a function symbol \hat{m} and its signature is declared based on m's signature.
- 2. Each relevant specification element s_M in M is turned into a formula in a similar way as described in step 1 of the translation for the consistency proof (Section 3.2). The only difference is that in step 1(b), calls to some method m are not replaced according to m's mapped_to clause, but by an application of function \hat{m} . Analogously, \result (and this) are also replaced by function applications in step 1(c).

The resulting formula is then stated as axiom.

- 3. A lemma is generated from every definition and axiom s_S of S^4 by replacing all occurrences of function symbols in s_S by some corresponding term, which may contain function symbols declared in step 1. Since mapped_to clauses specify the mapping from M to S, finding the **corresponding term** is non-trivial unless the clause specifies a direct mapping between function symbols of M and S. When several methods of M are mapped to a function symbol of S then one lemma is generated for each possible backward mapping, see details below.
- 4. The lemma is proven using the axioms generated in step 2.

As an example, we show this procedure for Isabelle's definition of proper subsets. In the first two steps, we introduce function symbols and axioms for all methods of the model class. Here, we focus on the only method needed for proper subsets, isProperSubset. In the first step, the signature of isProperSubset is declared as follows:

$$isProperSubset: \alpha set \times \alpha set \Rightarrow bool$$

The second step is based on the specification of the method. For demonstration purposes, this time we take the specification prescribed by the invariant, that is, the equation given in the specification of method equational_theory:

```
s.isProperSubset(s2) == (s.isSubset(s2) && !s.equals(s2))
```

Since the equation is part of the method specification of method equational_theory, first it gets quantified over its parameters: s, s2, e1, and e2. Then method calls to <code>isProperSubset</code>, <code>isSubset</code>, and <code>equals</code> are translated into the function applications isProperSubset(s,s2), isSubset(s,s2), and equals(s,s2), respectively. The resulting formula is turned into the following axiom:

$$\forall \ s, s2, e1, e2. \ isProperSubset(s, s2) = \\ (isSubset(s, s2) \land \neg equals(s, s2))$$
 (1)

In step 3, we take the definition of proper subsets from Isabelle's theory [24]:

```
psubset_def: "A < B == A <= B & ~A=B"</pre>
```

and translate it to the following lemma:⁵

$$\forall \ A, B. \ isProperSubset(A, B) = \\ (isSubset(A, B) \land \neg equals(A, B))$$

Note that in this case, the backward mapping (that is, "finding the corresponding term" in step 3) is trivial since there is a direct mapping between the three JML and Isabelle function symbols.

In step 4, the lemma needs to be proven using the axioms defined in step 2. The proof is trivial since axiom (1) (derived from the equational theory) is equivalent to the lemma.

Proving this stage guarantees that whatever can be proved using the axioms, definitions, and theorems of Isabelle's HOL/Set, can also be proved using JML's JMLObjectSet. An interesting consequence is that

⁴The set of definitions and axioms is identified by syntactically inspecting the target context, for instance, an Isabelle

⁵Isabelle definitions are implicitly universally quantified over all free variables.

we have proved that the axiom system extracted from the specifications of JMLObjectSet is complete relative to Isabelle's HOL/Set theory. Since Isabelle structures like HOL/Set are heavily used in formalizations and proofs, one can be confident that they contain all important properties of the structure.

As noted above, the generation of lemmas in step 3 is not as trivial as for the consistency proof because the backward mapping from S to the model class is not explicitly specified. Furthermore, proving the lemmas in step 4 is also less trivial than for the consistency proof. First, even the application of automated tactics typically requires one to manually select the set of axioms to be used for proving a given lemma because selecting all axioms might cause the tactic to loop. Second, beyond trivial cases, tactics often fail to find the proper instantiations of axioms that are generated in step 2. In such cases, further hints need to be given to the prover, for instance, by the insertion of simple helper lemmas. In practice, we also found that the specification of the model class may be too weak to verify some axioms or definitions of the structure. In this case, the missing specifications need to be identified and added to the model class. Thus, it seems that the automation of this stage can, in general, only be partial, and manual intervention is needed. However, the effort is justified by the increased quality of the model class specification.

An interesting side-effect of this proof technique is that redundant specifications can be discovered in the model class, and one can check whether specification elements marked as redundant are indeed implied by other specification elements. If an axiom is never used in the completeness proof then the specification element from which the axiom was derived is redundant in the model class. To check redundancy of a specification element, we follow step 1 and 2 as before, but generate lemmas (and not axioms) out of specification elements that are marked as redundant. Lemmas that are provable using the axioms, generated from the non-redundant specification elements, confirm that the corresponding specification elements are indeed redundant. The identification and checking of redundant specifications further improve the quality of model-class specifications.

Issues with backward mappings

It is crucial to note that the completeness proof should not only show that the model class provides all the functionality that the Isabelle structure provides. It should also show that the related JML methods and Isabelle functions indeed correspond to each other. For instance, if model class JMLObjectSet provides several methods to insert an element into a set then all of them must have the properties of *insert*, even though one method with these properties would be sufficient to obtain the expressiveness of the structure. We achieve this strong notion of completeness by applying all possible backward mappings that can be derived from the specified mapped_to clauses during the process of lemma generation (step 3). In the following, we describe the three situations in which the backward mappings are non-trivial. These situations are not exclusive, that is, their occurrence may overlap.

Multiple mappings. A given Isabelle function may be mapped to by several model methods. Assume model class JMLObjectSet contained both method union as presented in Figure 2, and method bogusUnion as presented in Section 3.2. We can show that the model class has the functionality of set union by applying the trivial backward mapping of symbol Un to method union. However, this is not sufficient for the use of the mappings: if we do not additionally apply the backward mapping of Un to bogusUnion, then the discrepancy described in Section 3.2 would still remain. Thus, every occurrence of symbol Un in s_S has to be mapped back both to union and bogusUnion when generating lemmas (step 3). This yields multiple generated lemmas from a single Isabelle definition or axiom. In step 4, the attempt to prove some of the lemmas for the mapping of Un back to bogusUnion will fail. That is, some of the properties of Un are not derivable from the specification of bogusUnion. This points out the bogus mapping of the method.

Mappings with mismatching parameters. Model classes often offer "convenience methods", methods that are redundant in the sense that they are equivalent to some compound expression consisting of calls to more basic model methods. Such methods make the use of model classes more convenient, but their functionalities are often not directly available in the corresponding structures leading to a mismatch in the parameters of the model method and the related function.

An example is constructor JMLObjectSet(Object e), which is equivalent with creating an empty set and then inserting element e into it: new JMLObjectSet().insert(e). Accordingly, the constructor is

mapped to the term "insert e {}". Note that Isabelle symbol insert is mapped to by method insert, too. In fact, that mapping is direct, and thus the backward mapping is trivial. The faithful mapping of method insert to function insert can be easily proven, which implicitly also covers the case when the second parameter of insert is the empty set. However, for the same reason as for symbol Un above, it is not sufficient to map Isabelle symbol insert back only to model method insert in step 3. Additionally, we need to map it back to the constructor.

The issue with the backward mapping of *insert* to the constructor is that the former has two parameters while the latter has only one. Furthermore, term "insert e {}" does not appear in Isabelle definitions because no definition handles the special case when the second parameter is the empty set. Thus, we map every occurrence of insert back to the constructor and substitute parameters appropriately: (1) the general term "insert e B" that appears in Isabelle definitions and axioms s_S is to be mapped back to JMLObjectSet(e), and thus replaced by function application $JMLObjectSet(e)^6$; (2) every occurrence of B is to be substituted by {}, the empty set. Since {} trivially maps back to JMLObjectSet(), occurrences of B in s_S are to be replaced by function application JMLObjectSet().

Indirect mappings. As mentioned in Section 3.1, mapped_to clauses may not only contain direct mappings, but may as well prescribe mappings to arbitrary terms in the language of the Isabelle structure. This is typically the case when the functionality of a model method is not directly supported by the related theory.

Consider JMLObjectSet's remove(Object elem) method, which removes a single element elem of a set, and theory HOL/Set, which only supports set difference. Thus, the method is mapped to the term this—(insert elem {}). Note that this term contains three function symbols: "—" (set difference), insert, and {}. All three symbols can be directly mapped back to the model class (methods difference, insert, and JMLObjectSet()), however, proving the faithful mapping of these symbols does not necessarily imply that method remove expresses the functionality of removing an element from the set. To demonstrate the problem, assume that the only specification of the method was the following:

```
(\forall e; ; new JMLObjectSet().
  remove(e).equals(new JMLObjectSet()))
```

Consistency of the specification can be shown trivially, since it expresses a valid property given the above mapping of remove. If we were satisfied by the consistency and completeness proof of the three symbols used in the mapping, then we would conclude that the prescribed mapping for remove is faithful. However, the specification would admit, for instance, the implementation return new JMLObjectSet(), which would be obviously wrong.

This shows that we need to do more than just separately proving the faithful mapping of symbols used in an indirect mapping. The symbol on the top-most level of the mapping needs to be mapped back to the method in every Isabelle definition and axiom s_S . In our example this means that symbol "—" needs to be mapped back to method remove, while properly matching its arguments based on the mapped_to clause and its occurrences in s_S : The first parameter of symbol "—" appearing in s_S needs to be substituted by this and the second by term $insert\ elem\ \{\}$, which gets mapped back to parameter elem according to the prescribed mapping.

The term insert elem {} further needs to be mapped back since it is still in the language of Isabelle and not of the model class. As we have seen above, the term insert elem {} has two different backward mappings: to method insert and to constructor JMLObjectSet(elem). However, now that we are in a recursive case of the backward mapping, we need not perform both mappings since above, when dealing with JMLObjectSet(Object e), we have already proved that both of them are correct and thus equivalent.

⁶For simplicity, we assume that the functions that encode model class constructors (such as $JMLO\hat{b}jectSet(e)$) yield a value that corresponds to the new, initialized object—in contrast to Java, where constructors take the new object as implicit parameter and do not have a result.

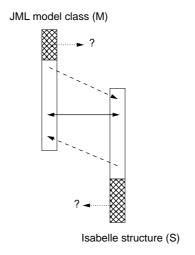


Figure 4: Mapping model methods to Isabelle functions and vice versa.

3.4 Summary

Successful completion of the three stages described above guarantees that model class M and structure S are isomorphic. This property confirms that the mapping prescribed by the mapped_to clauses are semantically correct.

The most important property from the consistency proof is that the axiom system extracted from the model class is consistent; thus, its usage cannot lead to unsoundness. This is obviously a crucial property for every verification system. For this stage, the generation and proving of lemmas seem to be automatable to a great extent. Failing to prove a lemma most probably indicates an error in the model class contract.

The most important result of the completeness proof is that the model class expresses the properties of the mathematical structure. This is important in order to prevent mismatches between the property one wants to express in a specification and the property one actually proves during the verification process. As noted above, the generation and proving of lemmas is not as trivial as for consistency.

Once both directions are successfully proven, method calls can be directly translated to the corresponding function applications without being worried about soundness issues or semantic discrepancies.

3.5 Mismatches between model class and structure

The interface of a model class is typically developed independently from the structures that it may potentially be mapped to. This is justified by the fact that model classes are used by different program verifiers equipped with different back-end theorem provers. Different theorem provers provide different structures and functions; thus, typically it is not possible to develop model classes such that they can be trivially mapped to all suitable structures.

There are mainly three different situations the mapping of a model class M to some structure S might lead to. These situations are illustrated by Figure 4.

The best situation is when all methods of M can be directly mapped to functions of S, depicted by a solid arrow. In this case, isomorphism of the related methods and functions can be proved and the lemma generation (step 3) for the completeness proof is rather straightforward, as described in Section 3.3.

Another possibility, depicted by dashed arrows, is that a method of model class M cannot be mapped directly to a function of structure S, but to a compound expression in the language of S. This situation may also occur in the reverse direction. Although isomorphism of related symbols can still be shown, the derivation of all backward mappings becomes non-trivial, as discussed in Section 3.3.

The worst situation is when no mapping can be given for a model method or a structure operation (dotted arrows in the figure). In such cases, there is a mismatch that cannot be bridged: M and S are not isomorphic. However, the "direction" of the mismatch makes a difference in the consequences.

If a method of M cannot be translated to S then we cannot be sure whether specifications that contain calls to the method are consistent, and whether the method semantically corresponds to some mathematical operation. In such situations, one needs to pick a different target structure where the mapping is possible.

The situation is better if an operation of S cannot be translated to M. Although isomorphism of M and S cannot be proven, isomorphism of those operations that are defined by the interface of M and the corresponding operations in S can still be shown. The mapping prescribed by the mapped_to clauses can be safely used because the consistency and completeness of the methods in M can still be shown. We call this kind of isomorphism observational faithfulness, which is a sufficient result for the sound use of mapped_to clauses since clients of a model class can only call model methods that are available in the model-class. Observational faithfulness is important because typically there are many operations in S that cannot be mapped to M. For instance, a theorem prover with a higher-order logic typically supports operations like filter or map, which are not expressible in JML, which is first order.

4 Case study: mapping JMLObjectSet to HOL/Set

In this section, we demonstrate our technique presented in the previous section by mapping model class JMLObjectSet to Isabelle's HOL/Set theory. Overall, we considered 17 members of the model class: 2 constructors, 9 query methods, and 6 methods that create new JMLObjectSet instances. These were all the methods that remained after the simplification step that we discuss below.

All proofs were carried out in Isabelle. The proof scripts contained a total of ca. 380 lines of code (LOC) without comments and empty lines. Consistency of the mapping was proven in ca. 100, completeness in ca. 120 LOC. Equivalence of the equational theory and the method specifications (see Section 4.5) was proven in ca. 160 LOC. All proofs of the case study and the one presented in Section 6 are available at pm.ethz.ch/people/darvas/iet.

Our approach does not yet have tool support. All steps in the case study, including the writing of the proof scripts, were performed manually. In Section 8, as future work, we briefly mention areas where tool support could greatly help.

4.1 Simplifications

Since we were interested in the mapping of JMLObjectSet and its methods to an Isabelle theory, we first removed all methods that provided object-oriented features irrelevant for the mapping of the model class. These methods included, for instance, clone, singleton, hashCode, and toString. In our opinion, such methods need not be part of model classes if one thinks of them as mathematical structures.

As next step, we removed all implementation details, including non-public methods and specifications, since our approach is merely based on the public specification of model classes. Additionally, we removed public members that only provide syntactic sugar, for instance, the constant field EMPTY that represents the empty set JMLObjectSet(). As mentioned in Section 3.2, only method specifications that describe normal behavior need to be treated by our approach. Thus, we removed all other method specification cases.

In order to keep our case study comprehensible, we removed ghost fields from the model class together with all specification expressions that referred to them. Ghost fields can be handled by mapping a model class M with n ghost fields to an n+1-tuple, where the first component represents the structure for M and the other components represent the state of the ghost fields [27]. Omitting ghost fields allows us to map a model class M directly to some structure S and to avoid cluttering up the proof obligations with projections of tuples.

Obviously, omitting ghost fields had some effects on the semantics of the model class, however, not on its general properties. The two ghost fields of the class are containsNull and elementType. The former has value true if and only if the represented set contains value null. After removing the ghost field, this information has to be queried using has(null).

Note that the method signatures in Figure 2 do not admit value **null** to be element of a JMLObjectSet-instance. This can be easily changed by adding the **nullable** modifier to method parameters that correspond to set-elements.

The other ghost field elementType is of type \TYPE, which is a type introduced by JML and represents the kind of all Java types [12]. The field gives an upper bound on the types of the set-elements, that is, all elements must be subtype of \TYPE. By dropping the field, this upper bound is lost and objects of arbitrary types are admitted as set-elements.

In summary, the removal of containsNull does not change the properties of the model class, while the removal of elementType does change them slightly. However, the main characteristics for which the model class is typically used in specifications remain unchanged.

To focus on the main ideas of this article, we decided not to handle methods that referred to non-primitive types other than Object and JMLObjectSet. For instance, constructors that take as argument a node of a singly-linked list from which a JMLObjectSet is created, or methods that convert JMLObjectSets to other model and non-model types. The handling of these kinds of methods is possible once one has provided mappings for all types that are mentioned in their signatures.

4.2 Division of specifications

We analyzed the specification of JMLObjectSet and found that the equational theory and method specifications were highly redundant. We illustrate this redundancy by method union. The equation defining the method in the equational theory and its method specification is given in Figure 2. It is easy to see that after proper substitutions, the two specifications express the same property. Thus, we decided to split specifications into two parts: one containing only the equational theory and the other containing only the method specifications. This allowed us to analyze their relation, as discussed in Section 4.5.

We note that it is not always the case that the equational theory of a model class and its method specifications are redundant. For instance, model classes JMLObjectToObjectRelation and JMLValueValuePair specify the behavior of the class in great majority by method specifications. But one could as well specify a model class mainly or entirely by an equational theory. Thus, in general, faithfulness should be proven using both the equational theory and the method specifications together.

4.3 Specifying the mapping

The next step was to specify the mapping of the model class and its methods. The resulting mapping of the methods that we consider in this article is shown in Figure 2.

The mapping of the different methods of the model class was mostly straightforward. Here, we mention three interesting cases. Method **choose** yields an arbitrary element of the set in case it is not empty. Although Isabelle's set theory has no equivalent operation, the method directly corresponds to Hilbert's ϵ -operator, written as "SOME x. P(x)" in Isabelle, denoting some x for which P(x) is true, provided one exists [10]. In our case, P simply needs to express set membership of x.

Another interesting case was the mapping of method remove. As discussed above, theory HOL/Set does not contain a corresponding function, thus the indirect mapping to term $this - (insert \ elem \ \{\})$ had to be applied. As noted in Section 3.3, this indirect mapping leads to non-trivial backward mappings, but we can still prove that the specification of method remove is consistent and corresponds to set difference with a singleton set containing elem.

An important issue of the mapping is the handling of equality. In general, we use reference equality for objects [7]. However, instances of model classes are treated as terms of a mathematical structure; therefore, the equality of this structure applies. We achieve this by overloading Isabelle's = operator. Instances of non-model classes are represented in Isabelle by a designated sort. The = operator on this sort denotes reference equality. Consequently, we simply map Java's == operator to Isabelle's = operator when applied to instances of non-model classes, in particular, to the elements stored in a JMLObjectSet. Instances of model classes are represented in Isabelle by the sort specified in the mapped_to clause of the model class. When applied to instances of model classes, we replace the == operator by a call to equals. This call is then mapped to Isabelle as prescribed by the mapped_to clause for equals. For instance, the == operator on JMLObjectSet instances is mapped to set equality in Isabelle. During the isomorphism proof, one has to prove that the equals method corresponds to Isabelle's notion of set equality.

4.4 Consistency

In the next step, we proved that the specification of the model class is implied by the properties of Isabelle's HOL/Set theory. The proof was performed as described in Section 3.2.

We found one inconsistent equation in the equational theory. This equation intended to describe a relation between methods remove and insert as follows:

```
s.insert(e1).remove(e2).
equals(e1 == e2 ? s : s.remove(e2).insert(e1))
```

where s is a JMLObjectSet instance, and e1 and e2 are two objects. The specification expresses that if e1 and e2 refer to the same object then inserting and removing the object into and from set s yields a set equal to s; otherwise, the order of performing the two operations is interchangeable.

Although this might look correct at first sight, the attempt to formally prove its correctness reveals that it is incorrect in case s contains e2, and e1 and e2 refer to the same object. In this case, the insertion yields some set s' that contains the same objects as s and the remove operation yields some set s'' that contains the same objects as s' except the object referenced by e2 (and e1). Thus, this set cannot be equal to s.

This problem was directly pointed out by Isabelle via the open goal that remained after applying the automatic tactic **auto** on the corresponding lemma. The open goal was: $e2: s \Rightarrow False$, expressing that the property does not hold in case s contains e2.

The buggy equation could be easily fixed after the problem was caught and all specifications of the equational theory and the method specifications could be proven trivially using the **auto** tactic of Isabelle. As a consequence, we proved that the (fixed) specification of the model class is consistent.

In general, the axiomatic JML specifications seem to be more error-prone than the conservative Isabelle specifications. Therefore, we expect other model classes to contain similar bugs, which our technique can reveal.

4.5 Equivalence of equational theory and method specifications

While it was easy to notice the large overlap of properties specified by the invariant and by method specifications, it was not trivial to see whether they are equivalent. Thus, after having proved that the specifications are consistent, we proved their equivalence formally using Isabelle.

The procedure of proving the equivalence was the following. First, we declared signatures of function symbols the same way as described in Section 3.3. When proving that the equational theory implies the method specifications, we stated axioms based on the equational theory and generated lemmas based on the method specifications. Finally, we attempted to prove the lemmas using the axioms. The other direction was proved analogously.

We found that the equational theory and the method specifications were not equivalent, and none of them contained stronger specifications than the other. That is, while proving either direction, some lemmas could not be proven without strengthening some of the axioms or adding new ones. Four additional equations had to be added to the equational theory and one postcondition had to be strengthened in the method specifications in order to prove their equivalence. Here we give one example for each direction.

The equational theory contains two specifications that mention method is Empty:

```
new JMLObjectSet().isEmpty() and
!s.insert(e1).isEmpty()
```

These express that a newly-allocated set is empty and that a set into which an element is inserted is not empty. These specifications do not imply the property stated in the postcondition of method is Empty:

```
\result == (\forall Object e; ; !this.has(e))
```

That is, is Empty returns true if and only if the set does not contain any object. The postcondition could not be proven using the two equations because those just express properties of is Empty (after construction and insertion) while the postcondition gives the definition of is Empty. Adding this definition to the equational theory (and thus to the set of axioms used in the proofs) trivially solved the problem. In fact, the two original specifications could as well be removed (or marked as redundant) since the new one (together with other properties) implies them.

The specification of constructor <code>JMLObjectSet(e)</code> had to be strengthened because the original post-condition <code>this.has(e)</code> was not sufficient to prove two specifications from the equational theory, for instance, the equation that relates the two constructors of the class:

```
new JMLObjectSet(e1).
  equals(new JMLObjectSet().insert(e1))
```

The weakness of the constructor's postcondition was again revealed by the open goal while proving the above equation and suggested us to strengthen the postcondition to express that object \mathbf{e} is the one and only object contained by the set after construction:

```
(\forall Object e1; ; this.has(e1) <==> (e == e1))
```

The strengthened postcondition allowed us to prove the two remaining specifications in the equational theory.

To make sure that the added and strengthened specifications did not introduce unsoundness, we proved their consistency the same way as in Section 4.4.

The result of having proved the equivalence of the equational theory and the method specifications is that one can use one or the other. For instance, one only needs to prove isomorphism of the method specifications and theory HOL/Set, while the equational theory can be marked as redundant.

4.6 Completeness

As the last step, we proved that the definitions of Isabelle's HOL/Set theory are implied by the (corrected and strengthened) specification of JMLObjectSet. The proof was performed both for the equational theory and for method specifications, and was carried out as described in Section 3.3. We note that due to the equivalence proof sketched above, it would have sufficed to perform this step either for the equational theory or for the method specifications. We carried out the proofs for both of them in order to gain more experience with our approach.

The most interesting part in this step was the mapping of Isabelle definitions to the signatures of the model class. Specifically, many of the definitions in Isabelle's HOL/Set theory use set comprehension (see Figure 3). This is a construct that cannot be expressed by a method in the model class. However, probably for this reason, JML supports set comprehension on the syntax level [12]. The JML Reference Manual [12] does not give a concrete definition for the semantics of the construct, thus we used the meaning that Isabelle defines via the axioms. This (1) ensured that we did not introduce unsoundness (provided that Isabelle's definition is sound), and (2) gave a connection between mathematical set comprehension and the methods of JMLObjectSet since the Isabelle definition refers to set membership which corresponds to the has method of the model class.

With the help of set comprehension, most Isabelle definitions could be easily mapped back to the "language" of the model class. The corresponding lemmas could be proven both by the corrected and strengthened equational theory and by the strengthened method specifications. This means that JMLObjectSet's specification indeed captures the elementary properties of sets.

Most proofs were trivially discharged by giving hints to Isabelle's **auto** and **simp** tactics which axioms to use. When giving such hints, a first approximation is typically to include all axioms that refer to the function symbols that appear in a given proof obligation. However, this might make the tactics loop, requiring one to remove some of the axioms. To decide which ones to remove, one needs to analyze the proof obligation to see which properties may not be needed to complete the proof.

4.7 Mismatching methods and functions

Finally, we mention cases where the model class and the Isabelle structure cannot be related to each other.

As one can see in Figure 2, there is no mapped_to clause attached to method int_size, which yields the number of elements the set contains. The method cannot be mapped to any term in the target theory since the theory does not define set cardinality and it cannot be expressed by the combination of other functions either. As discussed in Section 3.5, this means that our approach can neither guarantee consistency of specifications that mention the method nor that the semantic meaning of the method is indeed set cardinality. Thus, if the author of the model class wanted to keep the method in the model class,

then the class would need to be mapped to another structure, for instance, Isabelle's HOL/Finite_Set, which provides the corresponding function, card.

Not surprisingly, due to the higher-order nature of the theory to which the class was mapped, there were definitions that could not be mapped back to the model class. An example is function image which takes a function f and a set A as parameters, and yields the image of A under f. The model class does not provide such functionality and it cannot be expressed by other methods of the class. As discussed in Section 3.5, this means that at most observational faithfulness can be shown between the model class and the structure, which is sufficient for the use of the mapping during verification.

5 Handling inductive structures

Many theorem provers allow one to introduce data types and sets inductively. For instance, data type list is typically introduced inductively by two type constructors: Nil, which creates the empty list; and Cons e ls, which creates a list by adding element e to list ls. The set of natural numbers nat is defined inductively by two introduction rules: 0 belongs to the set; and, if n belongs to the set then Suc n belongs to the set, too.

Inductive definitions are natural to write and convenient to use because behind the scenes, theorem provers automatically generate proper definitions (for instance, a least fixed-point definition for nat) which ensure that the introduction of the data type is a conservative extension [28]. Furthermore, numerous theorems are derived from the definitions (for instance, the induction principle) available for the user and for the tactics [14, 28, 29].

As explained in Section 3, proving completeness requires deriving all definitions and axioms of the mathematical structure from the specification of the model class. The set of definitions and axioms should also include those that are implicitly generated for inductive structures by the theorem prover. However, the correctness of the implicit definitions and axioms follows from meta-theoretical results [28, 29] and are typically not derivable from the JML specification of the corresponding model class.

For instance, in Isabelle new functions are introduced and axiomatized for every inductive data type. These functions and axioms allow the automatic derivation of essential theorems, for instance, the induction principle. However, these implicit axioms are impossible to derive from the JML specifications, since the functions that Isabelle implicitly introduces do not even exist in the JML model classes.

Furthermore, even the most important implicitly derived Isabelle theorems are not deducible from the JML specification. Consider the induction principle for data type list, which states for any property P and list ys:

$$\begin{array}{ccc} P \; \text{Nil} & \forall \, x, xs. \; P \; xs \Rightarrow P \; (\text{Cons} \; x \; xs) \\ \hline & P \; ys \end{array}$$

This principle cannot be expressed in JML, which is based on first order logic and, thus, does not allow one to quantify over predicate P. Note that this problem did not occur for model class JMLObjectSet because type α set to which it was mapped, is not defined inductively.

The above mentioned problems indicate that the technique presented in Section 3.3 to show completeness is not sufficient to handle inductively defined types because the proof would always fail for the generated definitions and axioms. In this section, we address this problem by using four characteristic properties of inductive structures, which imply the other implicit definitions and axioms, and by showing that these properties also hold for the model class. Three of the properties can typically be proved based on the model class specification. The fourth can be enforced by a simple syntactic check. In the rest of this section, we focus on inductive data types and omit inductive sets, which can be handled in a similar manner.

5.1 Characteristic properties

In this subsection, we show how our approach enforces that model classes that are mapped to inductive data types indeed have the properties that follow from the inductive nature of the data type. We only cover non-nested, non-mutually-recursive definitions, which suffice to cover all model classes of the JML model library. The general form of a non-nested, non-mutually-recursive inductive data type definition is [28]:

$$(\alpha_1, \dots, \alpha_n) rty ::= C_1 ty_1^1 \dots ty_1^{k_1} | \dots | C_m ty_m^1 \dots ty_m^{k_m}$$
 (2)

which defines type $(\alpha_1, \ldots, \alpha_n)rty$ with n type variables $\alpha_1, \ldots, \alpha_n$ where $n \geq 0$. The type has m constructors C_1, \ldots, C_m where $m \geq 1$. Each constructor C_i takes k_i arguments where $k_i \geq 0$, and type expression ty_i^j for $1 \leq j \leq k_i$ either does not contain rty (i.e., is non-nested) or is equal to $(\alpha_1, \ldots, \alpha_n)rty$ (i.e., is recursive).

For example, the formal definition of type *list* is typically given as $(\alpha)list ::= Nil \mid Cons \alpha (\alpha)list$, where Nil takes no argument, the first argument of Cons is non-nested, and the second is recursive.

Inductive data types defined in the form of (2) can be fully characterized by three properties: the injectivity and distinctness of constructors, and the induction principle [21, 30]. That is, all other standard properties of inductive data types can be derived from these three properties. While we know that the three characteristic properties hold for the inductively defined data type, we have to show that the same properties hold for the corresponding model class too.

While the first two properties can be expressed in JML, the induction principle, as noted above, cannot. Thus, we capture other properties of data types that ensure that the set of possibly constructable values of the data type is the least set that can be finitely generated by the constructors [28], and thus, imply the validity of the induction principle. These properties are inclusiveness, no junk, and no loops.

Lastly, we will be interested in the property of non-emptiness. Although non-emptiness is not a necessary requirement in every logic, our approach enforces the property in order to make it independent of the logic.

In the following, we define formally the meaning of the above mentioned properties. These are the properties that we will require from model classes that are mapped to inductively defined data types.

1. injectivity of constructors. For every constructor C_i and their parameters, the following holds:

$$C_i x_i^1 \dots x_i^{k_i} = C_i y_i^1 \dots y_i^{k_i} \Leftrightarrow x_i^1 = y_i^1 \wedge \dots \wedge x_i^{k_i} = y_i^{k_i}$$

$$(3)$$

2. distinctness of constructors. For every pair of constructors C_i and C_j , where $i \neq j$, and for all parameters of C_i and C_j , the following holds:

$$C_i x_i^1 \dots x_i^{k_i} \neq C_j y_i^1 \dots y_i^{k_j} \tag{4}$$

3. inclusiveness. Every value of the type S is denoted by some term of the form $C_i \ x_i^1 \ \dots \ x_i^{k_i}$:

$$\forall v : S. (\exists x_1^1 \dots x_1^{k_1} . v = \mathsf{C}_1 x_1^1 \dots x_1^{k_1}) \lor \dots \lor (\exists x_m^1 \dots x_m^{k_m} . v = \mathsf{C}_m x_m^1 \dots x_m^{k_m})$$
 (5)

4. no loops. For any non-empty sequence of nested constructors and value x, the following holds:

$$x \neq C_1(\ldots, C_j(\ldots, x, \ldots), \ldots)$$
 (6)

- **5. no junk.** The set of data-type values is the minimal set closed under the constructors. That is, every value of the type can be built by repeated applications of the constructors.
- **6. non-emptiness.** The type has at least one element.

These six characteristic properties have to be enforced on the model class, that is, we need to show that (1) all model instances can be related to values that can be constructed by type constructors C_i , and that (2) the characteristic properties hold for the model instances.

5.2 Enforcing characteristic properties

Note that the characteristic properties are expressed in the language of the structure; thus, the backward mapping from the structure to the model class needs to be applied. As noted in Section 3.3, deriving this backward mapping may be non-trivial. For the proof of the characteristic properties, we require that at least every constructor of the inductive data type can be mapped back. Otherwise, the proof fails. On the other hand, as before, if multiple backward mappings exist then all of them have to be taken into account.

We demonstrate how the characteristic properties are proven using model class JMLObjectSequence, which is mapped to data type (α) list as specified in Figure 5. Given the specified mapped_to clauses, we get the following backward mappings: Nil is trivially mapped back to JMLObjectSequence(); Cons e ls is trivially mapped back to insertFront(ls, e), and to JMLObjectSequence(e) with ls matched with Nil and, consequently replaced by JMLObjectSequence().

Note that the backward mapping of data type constructors may not only yield model constructors, but also model methods. This is important because the implementation of a model class often has constructors that are not part of its public interface and which create instances that are not composable by the public constructors of the class. Such non-public constructors are typically "hidden" behind public model methods, that is, the implementations of the methods call these non-public constructors. An example is method <code>insertFront</code>, which creates instances that cannot be constructed by the two public constructors: <code>insertFront</code> creates lists with at least one element, whereas the constructors can only create empty lists and lists with exactly one element.

Based on the backward mapping, we can express the characteristic properties in the language of the model class. As we will see, some of the properties can be enforced syntactically and some of them follow from the other properties in our special setting of model classes.

1. injectivity of constructors. We have to show that equivalence (3) carries over to the model class. Thus, we generate proof obligations that correspond to this equivalence by substituting the type constructors using the backward mapping.

As an example, we show how the substitution works when applied to type constructor Cons and symbol insertFront. The signatures are:

```
 \begin{array}{lll} \mathtt{Cons}: \ \alpha \ \times \ \alpha \ list \ \Rightarrow \alpha \ list \\ insert \hat{F}ront: \ \alpha \ list \ \times \ \alpha \ \Rightarrow \alpha \ list \end{array}
```

From the mapped_to clause of method insertFront, we know that during the substitution of Cons by insertFront, we have to swap the positions of the parameters. This yields the following proof obligation:

```
\forall s_1, s_2, e_1, e_2.equals(insertFront(s_1, e_1), insertFront(s_2, e_2)) \Leftrightarrow e_1 = e_2 \land equals(s_1, s_2)
```

Note that when the operator = is applied to the data type, it is replaced by an application of equals. This is a consequence of the specified mapping of method equals to operator = in the model class. In Section 6, we show an example where the substitution of parameters is not as trivial as in the example above.

Since multiple methods of the model class may be mapped to a type constructor C_i , C_i may be substituted by multiple function symbols. To ensure that the property of injectivity carries over to the model class, we have to consider all possible substitutions of C_i in equivalence (3). Moreover, we have to consider all possible combinations of substitutions since C_i appears on both sides of the equivalence. In our example, this leads to four proof obligations since Cons can be mapped back in two different ways. One of the proof obligations is the formula above. All four are shown in Figure 6.

2. distinctness of constructors. To show that distinctness of constructors carries over to the model class, we have to perform substitutions on formula (4) in the same way as for injectivity. For instance, the distinctness property $Nil \neq Cons\ e\ s$ yields the following formula when the substitution is applied with JMLObjectSequence() on Nil and with insertFront on Cons:

```
\forall s, e. \neg equals(JMLObjectSequence(), insertFront(s, e))
```

The substitution of Nil is trivial since neither Nil nor the corresponding symbol JMLObjectSequence() take any parameter. The substitution of Cons works as described above.

Analogously to injectivity, multiple proof obligations have to be proved if multiple model methods are mapped to the same type constructor. In this example, the second backward mapping of Cons yields a second proof obligation, see Figure 6.

3. inclusiveness. To enforce inclusiveness for the model class, we need to show that every model instance has a mapping to the structure. This is expressed by translating equivalence (5) to the model class:

$$\begin{array}{c} \forall \, v : M. \; (\; \exists \; \overrightarrow{x_1}. \; equals(v, \, \hat{g_1}(\overrightarrow{x_1})) \;) \; \vee \; \dots \; \vee \\ (\; \exists \; \overrightarrow{x_k}. \; equals(v, \, \hat{g_k}(\overrightarrow{x_k})) \;) \end{array}$$

where the $\hat{g}_i(\overrightarrow{x_i})$ are the results of the backward mapping applied to the type constructors of S.

The quantification over all instances v of class M makes this condition difficult to prove. However, since model classes are immutable, we can prove it indirectly. If the property holds for each method of M that returns an instance of type M then it holds for all instances of M. The above proof obligation is adapted as follows when proven for some method m: the quantification over v is replaced by quantification over the parameters of m, and variable v is replaced by an application of function \hat{m} . For instance, the proof obligation for method concat is the following:

```
\forall this, s2.
equals(concat(this, s2), JMLObjectSequence()) \lor \exists e. \ equals(concat(this, s2), JMLObjectSequence(e)) \lor \exists s, e. \ equals(concat(this, s2), insertFront(s, e)))
```

4. no loops. Note that the expression on the right-hand side of (6) is an arbitrary sequence of constructor applications. Thus, proving (6) directly would lead to an infinite set of proof obligations. Therefore, we prove the property as follows.

We identify some measure μ in the data type S for which we can prove the following two properties. First, any two values with different measures are non-equal:

$$\forall s_1, s_2 : S. \ \mu(s_1) \neq \mu(s_2) \ \Rightarrow \ s_1 \neq s_2 \tag{7}$$

Second, the measure increases by every application of constructors that have recursive arguments. Formally, for some constructor C_i with one recursive argument (assumed to be on the first position):

$$\forall \overrightarrow{x}, s : S. \ \mu(s) < \mu(C_i(s, \overrightarrow{x})) \tag{8}$$

In data type (α) list (and in any other inductively defined data type in Isabelle), size is a candidate for the measure. One can show that it is indeed a measure by trivially proving the following two lemmas:

$$\forall s_1, s_2. \ (\mathtt{size} \ s_1) \neq (\mathtt{size} \ s_2) \ \Rightarrow \ s_1 \neq s_2$$

$$\forall\,e,\,s.\;(\mathtt{size}\;s)<(\mathtt{size}\;(\mathtt{Cons}\;e\;s))$$

Note that property (8) only has to be proven for constructor Cons, as Nil is not recursive.

By a simple inductive argument on the number of constructor applications on the right-hand side of (6), one can trivially show that these two properties together imply the absence of loops.

In order to show that properties (7) and (8) hold for the model class as well, they have to be mapped back to the language of the model class. We give the precise proof obligations that have to be proven for the model class in the next section.

5. no junk. As the property of inclusiveness guarantees us that every data-type value can be related to a JML instance, and that every JML instance is constructable by a member that is mapped to a data-type constructor, we can deduce that the JML model class does not contain junk either.

Since this argument is valid for any model class that is mapped to an inductively defined data type, no proof obligation has to be proven.

6. non-emptiness. We have to show that there is at least one model instance that can be created by the model class and that has a counterpart in the structure. Since the property of inclusiveness ensures that every model instance has a counterpart in the structure, it suffices to show that at least one model instance can be created.

For a model class M, the existence of an instance can be shown by syntactically checking that at least one of the model constructors that are mapped to a type constructor does not contain parameters of type M or of any other model class. We exclude other model classes since there is potential mutual recursion between M and that class. Since methods of non-model classes cannot have parameters whose type is a model class, we do not have to exclude those.

For instance, in Figure 5, we can see that method insertFront has an explicit parameter of the enclosing type JMLObjectSequence; thus, it does not guarantee non-emptiness. However, constructor JMLObjectSequence() does not have any parameters; thus, there is at least one instance of model class JMLObjectSequence.

The result of having proven these six characteristic properties is that we may safely assume that the model class possesses the standard properties of inductively defined types. In particular, we may assume that the induction principle holds for the model class, which therefore can be added as an axiom to the set of axioms that is extracted from the specification of the model class during the completeness proof (see step 2. in Section 3.3).

6 Case study: mapping JMLObjectSequence to HOL/List

In this section, we present our second case study: the mapping of model class JMLObjectSequence to Isabelle's HOL/List theory [31], more specifically, to the inductive data type $(\alpha)list$. We only present the proof obligations that need to be proven to show that the class possesses the characteristic properties of the inductive data type $(\alpha)list$, but we do not discuss how consistency and the other properties of completeness were proven. The procedure for those proofs (that is, simplifications as well as generation and proving of proof obligations) is analogous to the previous case study.

The mapping of the class and those methods that we consider in this article is presented in Figure 5.

1. injectivity of constructors. Injectivity of Nil is trivial since the type constructor does not take any parameters. This is also the case with the corresponding model member JMLObjectSequence().

The injectivity property for Cons is that for all lists s_1, s_2 and elements e_1, e_2 , the following holds:

$$\mathtt{Cons}\ e_1\ s_1 = \mathtt{Cons}\ e_2\ s_2\ \Leftrightarrow\ e_1 = e_2\ \wedge\ s_1 = s_2$$

To show that the property holds for the model class, four proof obligations need to be proven, since there are two possible backward mappings for Cons. In Section 5.2, we described how Cons is substituted by symbol insertFront. Here, we explain how Cons is substituted by JMLObjectSequence(e). Their signatures are as follows:

```
 \begin{array}{ll} {\tt Cons}: \ \alpha \ \times \ \alpha \ list \ \Rightarrow \alpha \ list \\ {\tt JMLObjectSequence}(e): \ \alpha \ \Rightarrow \alpha \ list \end{array}
```

As we can see, there is a mismatch between their arguments: Cons has an additional α list argument. From the mapped_to clause of constructor JMLObjectSequence(e), which specifies Cons e Nil, we can derive that this α list argument is Nil. Since we know that the backward mapping for Nil yields JMLObjectSequence(), we can conclude that when Cons is to be substituted by JMLObjectSequence(e), the first argument of Cons gives the only argument of JMLObjectSequence(e), while the second argument of Cons is to be replaced by the constant JMLObjectSequence(). Applying the substitutions for the property in all combinations yields the upper four proof obligations in Figure 6.

The proof obligations have to be proven using the axioms that are extracted from the specification of the model class as described in Section 3.3. We proved the first three proof obligations by giving hints to Isabelle's **auto** tactic which axioms to use. The fourth proof obligation additionally required a quantifier instantiation and a case split.

```
package org.jmlspecs.models;
//@ immutable
//@ mapped_to("Isabelle", "HOL/List", "\alpha list");
public /*@ pure @*/ class JMLObjectSequence {
  /*@ public invariant
      (\forall JMLObjectSequence s2; s2 != null;
         (\forall Object e1, e2; ;
          equational_theory(this, s2, e1, e2))); */
  /*@ public normal_behavior
   @ ensures \result <==>
       s.insertFront(e1).concat(s2).equals(
   0
           s.concat(s2).insertFront(e1));
   @ static public pure model boolean
      equational_theory(JMLObjectSequence s,
         JMLObjectSequence s2, Object e1, Object e2); */
  //@ mapped_to("Isabelle", "Nil");
 public JMLObjectSequence();
  //@ mapped_to("Isabelle", "Cons e Nil");
  public JMLObjectSequence(Object e);
  //@ mapped_to("Isabelle", "size this");
  public int int_size();
  //@ mapped_to("Isabelle", "elem mem this");
  public boolean has(Object elem);
  //@ mapped_to("Isabelle", "this = obj");
 public boolean equals(Object obj);
  /*@ public normal_behavior
   @ ensures \result == (int_size() == 0); */
  //@ mapped_to("Isabelle", "null this");
 public boolean isEmpty();
  //@ mapped_to("Isabelle", "Cons item this");
 public JMLObjectSequence insertFront(Object item);
  //@ mapped_to("Isabelle", "this @ s2");
 public JMLObjectSequence concat(JMLObjectSequence s2);
  //@ mapped_to("Isabelle", "rev this");
 public JMLObjectSequence reverse();
```

Figure 5: Model class JMLObjectSequence containing the signatures of methods we consider in this article.

```
\forall e_{1}, e_{2}. \ equals(JMLObjectSequence(e_{1}), JMLObjectSequence(e_{2})) \Leftrightarrow e_{1} = e_{2} \land equals(JMLObjectSequence(), JMLObjectSequence())
\forall s, e_{1}, e_{2}. \ equals(JMLObjectSequence(e_{1}), insertFront(s, e_{2})) \Leftrightarrow e_{1} = e_{2} \land equals(JMLObjectSequence(), s)
\forall s, e_{1}, e_{2}. \ equals(insertFront(s, e_{1}), JMLObjectSequence(e_{2})) \Leftrightarrow e_{1} = e_{2} \land equals(s, JMLObjectSequence())
\forall s_{1}, s_{2}, e_{1}, e_{2}. \ equals(insertFront(s_{1}, e_{1}), insertFront(s_{2}, e_{2})) \Leftrightarrow e_{1} = e_{2} \land equals(s_{1}, s_{2})
\forall e. \neg equals(JMLObjectSequence(), JMLObjectSequence(e))
\forall s, e. \neg equals(JMLObjectSequence(), insertFront(s, e))
```

Figure 6: Proof obligations for injectivity and distinctness for model class JMLObjectSequence.

2. distinctness of constructors. Type (α) list has two constructors. Thus, it has only one distinctness property: for every list s and element e, Nil \neq Cons e s holds. Since the backward mapping yields two model class methods for Cons and one for Nil, there are two combinations of substitutions for the type constructors. Thus, two proof obligations are to be proven in order to show that JMLObjectSequence preserves the property.

We have already seen how to do the substitutions for Cons, and that Nil is to be substituted by *JMLObjectSequence()*. After performing the substitutions of type constructors, we get the two formulas at the bottom in Figure 6. We proved both proof obligations by giving hints to the prover which axioms to use.

3. inclusiveness. As mentioned in Section 5.2, the proof of inclusiveness requires a proof obligation for each method of the model class that yields an instance of the class. We have shown an instance of the proof obligation for method concat in Section 5.2.

In our case study, there were 15 methods of class JMLObjectSequence that returned a sequence instance. Our experience was that this kind of proof obligation was the most difficult to prove because the specifications of numerous methods, and thus the corresponding axioms interact. For instance, the proof obligation for method concat contains function applications of JMLObjectSequence(), JMLObjectSequence(e), insertFront, equals, and concat. Thus, in order to discharge the proof obligation, most of the axioms for these symbols have to be used in a non-trivial way. Furthermore, the existential quantifications typically require manual instantiations.

Often certain subgoals were unprovable from the specification of the model class. In such cases, we extended the specification of the class with additional properties. For instance, while proving inclusiveness for method concat, a subgoal could not be proven because commutativity of concatenation and insertion to the front could not be derived from the specification of the model class. Thus, we added the property to the equational theory of the class, as shown in Figure 5.

The proof for method concat required several non-trivial manual steps, including two case splits, four quantifier instantiations, and three substitutions.

4. no loops. As mentioned above, a proper measure in data type $(\alpha)list$ is size, which trivially maps back to method int_size. Thus, the proof obligation instantiated for property (7) is:

$$\forall s_1, s_2. int_size(s_1) \neq int_size(s_2) \Rightarrow \neg equals(s_1, s_2)$$

Although data type constructor Cons maps back both to symbol JMLObjectSequence(e) and insertFront, property (8) only has to be instantiated for the latter, because the former does not correspond to a member that has any parameter of type JMLObjectSequence. The resulting proof obligation is:

$$\forall e, s. int_size(s) < int_size(insertFront(s, e))$$

Both proof obligations were trivially proven by auto with hints on which axioms to use.

- 5. no junk. As argued above, the property follows from inclusiveness.
- **6. non-emptiness.** There are two constructors in JMLObjectSequence that do not contain recursive parameters. Thus, non-emptiness is ensured.

7 Related work

The idea of using function symbols that are understood by the back-end theorem prover directly on the specification level is already present in ESC/Java [32]. The special construct \dtfsa (Damn The Torpedos, Full Speed Ahead!) allows users to refer to function applications on the level of Simplify, the theorem prover of ESC/Java. The corresponding function symbols are defined directly on the level of the prover. While this construct is a powerful means for specification, one has to be careful with its usage since on the specification level, the definitions of the function are hidden. The verification system does not give support for showing that the definitions are free from inconsistencies.

The Caduceus tool is a static verification system for C programs [33]. For specification and verification purposes, the tool allows one to declare types and predicates as well as to define or axiomatize these predicates on the C source level. One can also define "hybrid" predicates, predicates that refer both to elements of the C program and elements of these specification-only types and predicates. Definitions of predicates can also be postponed on the source level and given directly in Coq, the back-end prover of the tool. This concept eases the task of specifying and verifying programs since, for instance, it prevents the use of method calls in specifications and leads to definitions that are more suitable for provers than JML specifications. Case studies demonstrate the power of this approach [34, 35]. The drawback of the approach is the absence of a consistency proof for definitions and axioms given on the source or prover level. This might lead to soundness issues.

Schoeller [36] roughly sketches the idea of the faithful mapping of model classes to mathematical structures. However, no details are given on how one would prove faithfulness.

Schoeller et al. developed a model library for Eiffel [13, 37]. They address the faithfulness issue by equipping methods of model classes with specifications that directly correspond to axioms and theorems taken from mathematical textbooks. A shortcoming of this approach is that the resulting model library has to follow exactly the structure of the mimicked theory. This limits the design decisions one can make when composing the model library and it is unclear how one can support multiple theorem provers. Furthermore, user-defined model classes cannot be supported since there is no corresponding theory. Our approach allows more flexibility in the construction of model classes and libraries by using mapped_to clauses that can go beyond direct mappings since arbitrary terms of the target context can be specified. In turn, our approach requires one to prove faithfulness of the mapping.

Charles [7] proposes the introduction of the native keyword to JML in the context of work on the program verifier Jack [38]. The keyword can be attached to methods with a similar meaning to ESC/Java's \dttfsa construct: methods marked as native introduce uninterpreted function symbols, and their definitions can be directly given on the level of Coq, the back-end prover of Jack. Charles carries the idea over to model classes: the native keyword may also be attached to types with the meaning that such types get mapped to corresponding Coq data types. The mapping of native types is also defined on the Coq level. This approach differs from ours in two ways. First, our approach ensures faithfulness of the mapping. There is no attempt to do so in the work of Charles. Second, the mapped_to clause we propose in this article allows one to specify the mapping on the specification language level. Furthermore, properties of model classes are specified in JML, which typically provides easier understanding (for programmers) of the semantics than definitions given directly on the level of a theorem prover.

Leavens et al. [9] identify the problem of specifying model types as a research challenge. They propose four possible solution approaches and summarize the open problems for each of them. Solution 1 uses

equational theories. One of the problems of this solution is that the resulting invariants quantify over all instances of a model class, which makes modular verification difficult. As we have illustrated in Section 4.5, our technique helps in proving the equivalence of equational theories and method specifications, which are typically easier to verify. The other problem of solution 1 mentioned by Leavens et al. is the possible semantic mismatch between the equals method of the model class and the built-in equality of the theorem prover. We solved this problem by mapping the equals method explicitly to an operation of the theorem prover and by proving faithfulness of this mapping.

Solution 2 uses method specifications. Leavens et al. observe that this solution makes it difficult to verify the implementations of model methods, a problem that we do not consider in this paper. Moreover, solution 2 requires a sound treatment of pure methods, which is exactly what we provide through proving faithfulness. As solution 3, Leavens et al. discuss automatic translations between model classes and mathematical structures and argue why such translations are difficult. We deal with these problems by specifying the mapping manually and proving faithfulness of the mapping. One of the problems mentioned by Leavens et al. is how to deal with model class specifications that invoke methods of the program, in particular, Object.equals. We do not address this problem here; a possible solution might be to also map those methods to operations of the theorem prover and to prove faithfulness. Leavens et al.'s solution 4 is similar to the work by Schoeller and Charles discussed above.

Several approaches have been developed to prove the consistency of design specifications written in languages such as Alloy [39] or OCL [40]. These approaches typically generate a model for the specification, whereas our work shows consistency indirectly by proving isomorphism to a structure that is assumed to be consistent. Our approach allows us in particular to replace model class specifications by terms of the theorem prover during program verification, which is one of the main motivations behind our work.

Our approach is based on the equivalence proof of two structures. Thus, it can be seen as stating that the structures are in a bi-directional refinement relation. This can be expressed in existing specification languages. For instance, in ESC/Java by the combination of the above mentioned \dttfsa construct together with JML's refining clause, which takes two arguments and specifies that one refines the other. An advantage of the newly proposed mapped_to clause is that it allows one to additionally specify the target theorem prover, possibly multiple ones.

There is a large body of work on the **runtime** discovery and checking of algebraic specifications. We give an incomplete list of references and refer the reader to [41] for a more detailed account on previous work. Sankar [42], Antoy and Hamlet [43], and Nunes et al. [44] developed systems that allow one to test the implementation of algebraic data types against their implementations. Henkel and Diwan [41, 45] developed an approach for the discovery of algebraic specifications as well as for their debugging. These approaches are orthogonal to ours. First, they inspect the relation between the specification and implementation of data types. Our approach inspects the relation between the specifications and definitions of two structures. Second, the listed approaches are dynamic, that is, based on executions of the inspected data types. Thus, these approaches cannot guarantee that the result of the specification discovery and checking is sound. Our approach is based on static verification techniques.

8 Conclusion

For the static verification of programs, model classes have to be encoded in the underlying logic of the program verifier. Previous work [7, 8, 9] proposed the mapping of model classes to mathematical structures of the underlying theorem prover. In this article, we proposed an approach to show that such mappings are faithful by proving isomorphism between the model classes and the structures.

The proposed approach improves on previous work in three ways. First, previous work that proposed the direct translation of model-class methods to functions of a theorem prover did not ensure any actual semantic relationship between the mapped entities. This can easily lead to semantic mismatch between what was intended to be specified and what was actually verified.

Second, our approach leads to better specifications for model classes by ensuring their (relative) consistency and completeness. The identification and checking of redundant specifications further improves the quality of the specifications.

Third, previous work for ensuring the consistency of recursive pure-method specifications either does not provide a satisfying solution [3], or proposes to explicitly prove well-foundedness [6]. The solution

proposed by this article solves this problem: by proving that a certain mathematical structure is a model for the specifications of a model class, we get the guarantee that the specifications are consistent. This result is independent of the presence of recursion and requires no explicit proof for well-foundedness.

To demonstrate our approach, we reported on case studies with two model classes from JML's model library and two theories from Isabelle's theory library. The case studies were successful in that observational faithfulness could be proved (except for method int_size of class JMLObjectSet) and interesting observations could be made on the model classes: an incorrect specification was revealed, missing specifications were identified, and a precise relation between the equational theory and method specifications was identified. Additionally, we did a case study, which mapped a model class encoding a stack as described in [16] to theory HOL/List, and proved observational faithfulness. Since stack is a rather simple structure, the case study was rather simple to complete. Still, it shows that our approach also works for model classes that do not have a directly corresponding theory in the target theorem prover.

Future work. Future work remains to provide tool support for the proposed mapping process described in this article. Tools could support the typechecking of mapped_to clauses; the (partial) generation of proof scripts for faithfulness proofs; and the actual use of mappings for static verification of programs.

We plan to carry out further case studies to cover most of the model classes of the JML model library. This will also give us a better understanding of the strengths and weaknesses of our approach.

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