# Reusing Precisions for Efficient Regression Verification

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Abstract—Continuous testing during development is a wellestablished technique for software-quality assurance. Continuous model checking from revision to revision is not yet established as a standard practice, because the enormous resource consumption makes its application impractical. Model checkers compute a large number of verification facts that are necessary for verifying if a given specification holds. We have identified a category of such intermediate results that are easy to store and efficient to reuse: abstraction precisions. The precision of an abstract domain specifies the level of abstraction that the analysis works on. Precisions are thus a precious result of the verification effort and it is a waste of resources to throw them away after each verification run. In particular, precisions are small and thus easy to store; they are easy to process and have a large impact on resource consumption. We experimentally show the impact of precision reuse on industrial verification problems, namely, 59 device drivers with 1119 revisions from the Linux kernel.

### I. INTRODUCTION

Reliable software is essential both for convenience and safety in our daily lives and for the revenue in the economy. Producing reliable software is costly; and speeding up testing and formal verification of software can save huge amounts of time and money. Economic pressure requires companies to come up with innovations more quickly by introducing more features in shorter release cycles — software is a key contributor to today's innovations. However, the problem of extending software, e.g., by introducing a new feature, is that this might break existing features — bugs get introduced. This is known as regression. To avoid regression, developers execute automated tests before a new revision of a piece of software is checked-in, in the hope that the tests alarm the developer of any new bug. While regression testing is an established and well-investigated technique since many years (e.g., [17], [25], [27]), in the end, the quality of the software (in terms of correctness) depends on the coverage percentage achieved by the regression test suite.

The confidence of correctness can be increased by augmenting the development process with formal verification, i.e., regression verification [11], [18], [20], [28], [30]. Formal verification exhaustively checks the program for bugs, but at the same time consumes large amounts of computation resources (time and memory), in particular when applied to industrial-size software. Regression verification applies formal verification techniques to continuously check development revisions in order to identify regressions early. Innovations in this field pave the road that leads from regression testing to regression

verification, and from simply finding bugs to actual proofs of correctness during the whole software-development process.

Verification tools spend much effort on computing intermediate results that are needed for verifying if the specification is satisfied. In most uses of model checking, these intermediate results are erased after the verification process — wasting precious information (in failing and succeeding runs). There are several directions to reuse (intermediate) results. *Conditional model checking* [5], [13] outputs partial verification results for later re-verification of the same program by another verification approach. *Regression verification* [11], [18], [20], [28], [30] outputs intermediate results (or checks differences) in order to enable a more efficient re-verification of a revised program relying on the very same verification approach.

The contribution of this paper is to reuse *precisions* as intermediate verification results. In program analysis, e.g., predicate analysis, shape analysis, or interval analysis, the respective abstract domain defines the kind of abstraction that is used to automatically construct the abstract model. The *precision* for an abstract domain defines the level of abstraction in the abstract model, for example, which predicates to track in predicate analysis, or which pointers to track in shape analysis. Such precisions can be obtained automatically; interpolation is an example for a technique that extracts predicate precisions from infeasible error paths.

Precisions are a good choice for reuse in regression verification, because they are technically easy to use and do not require much extra computation effort before they can be reused, they have a small memory footprint, and they are, as we show, not sensitive to changes in the program source code. We performed an extensive experimental study on industrial code, in order to show the significant impact of precision reuse for regression verification (in terms of performance gains). The benchmark verification tasks were extracted from the Linux kernel, which is an important application domain [9], and prepared for verification using the Linux Driver Verification toolkit (LDV) [22], [24]. Our study consisted of a total of 16772 verification runs for 4193 verification tasks, composed from a total of 1119 revisions (spanning more than 5 years) of 59 Linux drivers from the Linux kernel repository.

**Example.** We consider ten revisions of the Linux device driver extcon-arizona for which a bug was discovered using formal verification by the LDV team<sup>1</sup>. Table I lists the

<sup>&</sup>lt;sup>1</sup>https://patchwork.kernel.org/patch/1694901/

TABLE I

VERIFICATION OF LINUX DEVICE DRIVER EXTCON-ARIZONA WITHOUT AND WITH PRECISION REUSE

	Rev.	Commit Message	Result	Refinements	with Reuse	Abstractions	with Reuse	CPU Time	with Reuse	Result	Refinements	with Reuse	Abstractions	with Reuse	CPU Time	with Reuse
1.4	3	Implement button detection support	safe	24	24	792	792	10	10	unsafe	8	8	38	38	3.7	3.6
	4	Free MICDET IRQ on error during probe	safe	24	0	792	27	9.9	3.5	unsafe	8	0	38	14	3.6	3.4
	5	fix typos in extcon-arizona	safe	24	0	792	27	9.8	3.5	unsafe	8	0	38	14	3.6	3.4
1	6	Use bypass mode for MICVDD	safe	4	0	10	3	3.2	3.1	unsafe	1	0	3	2	3.1	3.1
•	7	Merge tag 'driver-core-3.6' of git://git.kernel.org/	safe	24	0	792	27	10	3.5	unsafe	8	0	38	14	3.6	3.4
•	8	unlock mutex on error path in arizona_micdet()	safe	24	0	792	27	10	3.5	safe	43	16	571	524	8.8	8.3
	9	remove use ofdevexit	safe	24	0	792	27	10	3.6	unsafe	8	0	38	22	3.5	3.7
4	10	remove use ofdevinit	safe	24	0	792	27	10	3.5	unsafe	8	0	38	22	3.5	3.8
I	11	remove use ofdevexit_p	safe	24	0	792	27	10	3.6	unsafe	8	0	38	22	3.6	3.7
I	12	Merge tag 'pull_req_20121122' of git://git.kernel.org/	safe	24	0	792	27	10	3.6	safe	43	0	571	27	8.8	3.7
┰			Spe	cificat	ion 1:	'Spinlo	cks loc	k/unlock	,	Spe	ecificat	tion 2:	'Mute	k lock/u	ınlock'	

revisions and the corresponding commit messages (in bold: the commit that fixes the above mentioned bug). We verify two specifications with a CEGAR-based predicate analysis: (1) 'Spinlocks lock/unlock', and (2) 'Mutex lock/unlock'. Revisions 3 to 7 and 9 to 11 violate specification 2. Tasks that violate the specification generally need less refinements and abstraction computations since the analysis can terminate as soon as it finds a bug. In cases where the specification holds, the whole state space of the program has to be analyzed; mostly a large number of refinements (> 20) and expensive abstraction computations (> 500) have to be performed.

The columns titled 'with Reuse' show the results with precision reuse. For cases where a complete reusable precision from a successful verification of a previous revision is not available (revision 3 for specification 1, revisions 3 to 8 for specification 2) because the whole state space was not yet analyzed before, there is no speedup. For most of the cases where the state space was completely analyzed in a previous run, and a complete precision is available for reuse, a speedup of at least factor 2 can be achieved (CPU time less than 4s instead of greater than 8s). Refinements are eliminated completely because all necessary verification facts are already specified by the reused precision.

Verifying large numbers of (more complex) program revisions often takes several hours or even days. Our approach of precision reuse can speed this up by a factor greater than 3 on average for predicate analysis.

**Contributions.** We make the following novel contributions:

- We identify the abstraction precisions as intermediate results that are valuable for reuse in regression checking.
- We define a tool-independent format for persistent storage and exchange of precisions.
- We extend an existing software-verification tool in order to support regression verification with precision reuse.
- We prepare and consolidate a benchmark set for regression verification that is based on industrial source code from the Linux kernel and consists of thousands of benchmarks.
- In an extensive experimental study, we show that precision reuse leads to significant performance improvements and causes almost no overhead for the verification tool as well as for the benchmarking infrastructure (and thus, forms no additional barriers in a software-development process).

**Related Work.** The goal of constructing efficient tools for incremental formal verification is more than 15 years old [18], [29]. In the literature, there exist two main directions to approach the problem of regression verification: (1) based on analyzing the difference between the program and other programs that were successfully verified in a previous verification run, and (2) based on reuse of intermediate results that were costly computed in previous verification runs.

Verification of Differences. The first group of approaches to efficient regression verification takes two programs as input and analyzes the differences in order to verify whether the specification is still fulfilled. An input condition is used to limit the verification to certain relevant parts of the state space [10], [15]. These approaches can be seen as conditional model checking [5], where the input condition instructs the verifier to perform a partial verification. The parts of the program that were identified as not being affected by modifications can be skipped [15], [26] during the verification process. A technique for proving conditional equivalence of two programs [15] isolates and abstracts the functions of both versions using uninterpreted functions and then proves their equivalence (also extended to multi-threaded programs [11]).

**Reuse of Verification Results.** The other group of approaches reuses state-space graphs [20], [23], constraint solving results [31], [33], or function summaries [28]. To ensure that the information is valid to be reused, those parts of the information that were affected by modifications (to the analyzed program or its specification) have to be validated. The check for reusability is done either before the actual formal verification process is started [28], [32], [33] or immediately before certain information should be reused [20], [23]. Extreme model checking [20] is the only existing approach that uses unbounded model checking with lazy abstraction and predicate analysis for regression verification. Another way of information reuse is to not store the concrete data, but its hash value. One such approach [18] stores hashes of verified models; these models are constructed by reducing a program to those parts that are relevant to prove one property. To be efficient, model construction must be less expensive than verifying the model. For formal regression verification of hardware using the ic3 algorithm, the reuse of correctness proves and counterexamples has been proposed [12]. A more general fashion of reuse is to store and reuse canonicalized constraint solver queries and

the corresponding results. This idea is supported by the Green framework [31], which provides a solver wrapper interface.

Our approach belongs to this second category: we reuse abstraction precisions as intermediate results and do not (explicitly) analyze the differences in the program code (our approach implicitly spends more effort on changed parts). This is the first work that reuses abstraction precisions.

#### II. BACKGROUND

Abstract Reachability Graph. The class of analyses we consider in our work is based on creating an abstract model of the program in form of an abstract reachability graph (ARG). An example for such an analysis is implemented in BLAST [4]. The ARG is created iteratively by unrolling the control-flow automaton (CFA) of the program, creating an abstract successor state for the next location whenever the control flow passes through an edge of the CFA. The creation of abstract-successor states is usually over-approximating and guided by some form of precision that instructs the analysis which facts should be tracked and which facts should be omitted by abstraction. The abstract domain determines the characteristics of the precision. For example, if the abstract domain tracks information of program variables explicitly, then the set of relevant program variables to consider at a program location is a suitable precision for the analysis. The precision in use should require the tracking of just enough information to prevent false alarms, while at the same time be as concise as possible in order to enable an efficient analysis.

Counterexample-Guided Abstraction Refinement (CEGAR). CEGAR [14] is a well established technique for automatically finding a suitable precision that matches the above criteria. Beginning with an initial coarse or even empty precision, the ARG is created based on this initial precision. If no state violating the specification is found, the program is proved safe. If a violation of the specification is found, the concrete path of this counterexample is analyzed for feasibility. If it is feasible, the program is unsafe and the analysis terminates. Otherwise the abstract model of the program was too coarse, so the precision needs to be refined to exclude this infeasible counterexample from future explorations. Depending on the abstract domain, the facts necessary to rule out this counterexample are extracted from the proof of infeasibility and added to the precision. Then the CEGAR loop is restarted with this newly refined precision.

Lazy Abstraction. The efficiency of CEGAR-based analyses can be increased by using lazy abstraction [21]. Instead of always restarting the analysis from scratch after an infeasible counterexample was found, the abstract model is refined in a "lazy" style. That is, during counterexample analysis the newly-learned facts that are extracted from the counterexample are only added where necessary. Then only those parts from the ARG that were computed with a too coarse precision are removed and scheduled for re-exploration. The remainder of the ARG, for example, a prefix of the current counterexample path, or other paths not related to the current counterexample, are kept and are neither thrown away nor re-explored. This does not only reduce unnecessary recomputations, but also

reduces computation effort by lazily applying the new, stronger, precision only to those states of the ARG where it is needed. States on unrelated paths of the ARG are still computed with the old, weaker, and more efficient, precision. A further improvement is to use different precisions for each program location in order to track as little information as possible. For example, the analysis drops information during path exploration when reaching a location after which this piece of information is no longer needed.

**Predicate Analysis.** One technique which is used widely together with the above concepts is predicate abstraction [16]. Given the set X of program variables, and the set  $\mathcal{P}$  of quantifier-free predicates over variables from X, the abstract domain here is the set of boolean combinations of predicates from  $\mathcal{P}$ . The precision  $\pi$  is a set of predicates from  $\mathcal{P}$ . When constructing the ARG, abstract successor states are created by computing either the cartesian or the boolean abstraction of the current state using the predicates from  $\pi$  with an SMT solver. Using Craig interpolation, predicates can be generated fully automatically from a proof of unsatisfiability for the formula representing a concrete counterexample [19].

The performance of predicate abstraction can be improved with adjustable-block encoding (ABE) [7]. This technique groups program statements into blocks and computes abstractions only at the end of each block instead of at all program locations. Furthermore, if control flow merges within a block, paths in the ARG are also merged so that sets of paths are considered instead of single program paths. When using ABE-Loops (which encodes loop-free parts of the program into blocks), abstractions will be computed only at loophead locations. Thus predicates will be relevant only at these locations, and the precision is ignored at all other locations.

**Explicit-Value Analysis.** Another domain that can utilize a precision is explicit-state analysis [8], which tracks the current value for each program variable explicitly. Within this analysis, an abstract state is represented as an abstract variable assignment  $X \to \mathbb{Z} \cup \{\top, \bot\}$ , where X denotes the set of program variables of a program. The value  $\top$  represents a variable valuation that is unknown, e.g., due to an uninitialized variable; the value  $\bot$  represents a variable valuation that is impossible. Abstract successor computation is done by evaluating program operations and assigning the evaluated value to the respective program variables in abstract variable assignments explicitly — in contrast to modeling them symbolically as done in the predicate domain.

The precision for an abstract variable assignment is defined as a set  $\pi$  of variables, which is used to restrict an abstract variable assignment to variables that are in that precision  $\pi$ . For example, applying the precision  $\pi = \{b\}$  on the abstract variable assignment  $v = \{a \mapsto 4, b \mapsto 15\}$  would result in the abstract variable assignment  $v^{\pi} = \{b \mapsto 15\}$ . Experiments show that a variable that is relevant for one path, is often relevant on similar paths as well, and thus it is beneficial to add a newly-found relevant variable to the precision for all locations of the functions in which it is relevant. This reduces the number of refinements, because similar paths can now often also be ruled out without further refinements.

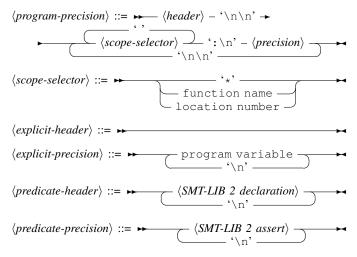


Fig. 1. Format of program-precision file; depending on the abstract domain, we use the respective definitions of  $\langle header \rangle$  and  $\langle precision \rangle$ 

### III. PRECISION REUSE

**Definitions.** A *precision* is the information an abstraction-based analysis uses to guide the abstraction computation for creating abstract states. Given one analysis, we write  $\Pi$  for the set of possible precisions, and  $\pi$  for one element thereof. The *empty precision* is the coarsest precision from  $\Pi$  (usually, this precision defines that all information is abstracted). The *union* of two precisions from  $\Pi$  is defined in the intuitive way. For example, for predicate abstraction, a precision is a set of predicates over program variables, and the union of two precisions is the union of the two sets of predicates.

In order to use lazy abstraction, which enables the use of different precisions at different program locations, we define a program precision as a mapping  $L \to \Pi$  from the set L of program locations to the set of precisions  $\Pi$ . The union of two program precisions  $p_1$  and  $p_2$  is the program precision that maps every location l to the union of  $p_1(l)$  and  $p_2(l)$ .

Format for Program-Precision Files. In order to write and read precisions to and from persistent storage, we define a simple text-based file format that describes program precisions in a human-readable and tool-independent way. A formal definition of the format is given in the syntax diagram of Fig. 1. The basic structure defined by *(program-precision)* is the same for all analyses. The file starts with a header (the content depends on the analysis) followed by a blank line. After the header, an arbitrary number of blocks separated by blank lines follow, each consisting of one line with a nonempty sequence of scope selectors, and an analysis-dependent precision. There are three kinds of scope selectors: the literal \* (representing all program locations), the name of a function of the program (representing all locations inside this function), and the number of a program location (representing this single location). The precision given in a block is used at all locations represented by the specified scope selectors. The effective precision for any given program location is the union over

```
*:
lock
lock
main f:
x

(declare-fun |lock|() Real)
(declare-fun |x|() Real)
(define-fun t1() Bool (= |lock| 0))
(define-fun t2() Bool (<= |x| 1))

*:
(assert t1)
main f:
(assert t2)</pre>
```

Fig. 2. Example program-precision files; left: explicit-value analysis; right: predicate analysis

the precisions from all blocks that contain at least one scope selector representing that location.

For explicit-value analysis, the header  $\langle explicit-header \rangle$  is empty. The precision  $\langle explicit-precision \rangle$  is a list of variables that occur in the program. For predicate analysis, we define the precision  $\langle predicate-precision \rangle$  as a list of assert commands as defined by the SMT-LIB 2 standard [2] (a standard for SMT-solver interfaces supported by state-of-the-art SMT solvers). The header  $\langle predicate-header \rangle$  is a sequence of term declaration commands as defined by SMT-LIB 2 (including the commands define-fun and declare-fun), and the formulas in the precisions may reference these declarations.

**Example.** Consider a C program that contains two variables lock and x, both of which are relevant for proving the safety of the program. Variable lock may be relevant at all locations, whereas variable x may be relevant only in the functions main and f. An example program-precision file for explicit-value analysis that encodes this information is given on the left in Fig. 2. An example for predicate analysis could look as shown on the right in Fig. 2, assuming that the model checker encodes these variables as real numbers, and the predicates lock = 0 and x < 1 are relevant.

Generating Program-Precision Files. In order to enable the reuse of precisions, we collect all program precisions that are created during the analysis (typically, there is one for each refinement step), and create the union over all these program precisions. The resulting precision is written to a file. For each program location, the precision is dumped and labeled with the number and the function name of the program location (empty precisions can be omitted.)

Reuse of Precisions. In order to reuse a precision for the subsequent analysis of the same or a similar program, an initial program precision for the analysis is created by interpreting the contents of a previously stored program-precision file. There are three possibilities to construct such a precision. First, precisions can be function-scoped, such that a precision is created for each function of the program, by taking the union of all precisions labeled with the function name. The result is assigned to all locations of the respective function. Note that this will widen the scope of precisions (thus potentially leading to a more precise abstraction), and also loose precisions if functions are renamed. This precision assignment is insensitive to changes of the control-flow structure in the functions of a program.

Second, precisions can be location-scoped such that the location numbers in the file are read as the keys for the resulting program precision. For all program locations that do not appear in the file, the empty precision is used. Note that location numbers may change if the program code changes, and thus, precisions get assigned to locations that correspond to a semantically different location of the original program. Third, precisions can be global-scoped by taking the union of all precisions in the file and assigning the result to all locations of the program. This will not loose any precision from the previous analysis, but might apply precisions to locations where they are not necessary (and thus make the analysis more expensive).

After the creation of the initial program precision, the analysis is started as usual. No changes to the analysis itself are necessary. If the provided precision is strong enough to prove the program safe, no further refinement effort will be needed. If the input precision contains only a part of the necessary precision to be tracked, spurious counterexamples will be detected and subsequent refinements will strengthen the precision. Note that even in this case the input precision likely reduces the effort by decreasing the number of necessary refinements. This process may be iterated by writing again the program precision that was further refined by the second analysis to file, and using this as the input for a further analysis, possibly on a newer version of the program.

**Discussion.** The most significant effect of reusing precisions from a previous verification run is the reduction in the number of necessary refinements. These are usually among the most expensive operations executed by a model checker (for example involving satisfiability checks and interpolation queries over formulas that represent sets of complete program paths from the entry point to the error state). Furthermore, fewer refinements reduce the number of operations to prune and re-create parts of the abstract reachability graph. This is especially important for analyses that perform expensive operations during this phase, for example for predicate analysis, which needs SMT-solver queries to compute abstractions. While the introduction of adjustable-block encoding [7] has reduced the number of such computations by executing them only at loop-head locations and not for every abstract state, the need to use boolean abstraction still makes this costly.

Precision reuse is an elegant and conceptually simple approach, because it integrates naturally into the techniques that are used by many successful model checkers. These techniques can be applied as they exist without any change, to the first, initial, verification run (when no reusable information is present), and also to the subsequent re-verification runs. Furthermore, this makes precision reuse applicable not only for the two presented analyses, but also for any analysis and abstract domain that is based on CEGAR and incorporates an abstraction step that is guided by some form of precision. For example, precision reuse would extend naturally to other abstract domains such as interval or shape analysis.

Precision reuse is easy to implement in existing model checkers that are based on CEGAR and abstractions. Only the import and export of precisions before and after the actual analysis needs to be added. Complex algorithms, as required for

comparing two revisions of a program and detecting similar and changed code, are not necessary in our approach. The format we defined is easy to parse and write, and could be supported by a variety of model checkers, thus even enabling the reuse of precisions across different tools.

Furthermore, precision reuse is also user-friendly: a user that is already familiar with using one model checker will not need to learn how to use new concepts or tools. Dumping of precisions as part of the analysis result should be enabled by default in most tools, and thus the only necessary action by the user is to supply the previously written program-precision file as an additional input to the next verification run. Even if the user mistakenly specifies a wrong program-precision file as input, the result will be still correct (the analysis is still sound) and only the performance might be slightly worse. In order to employ precision reuse, it is not necessary to have access to previous program revisions; the only information needed is the (small) generated program-precision file.

**Applicability of Precisions.** As described above, there are three strategies how the precisions from the previous verification run can be applied to the program locations of the program's next revision. The strategies differ in how they widen the scope of the precisions. A location-scoped precision is applied at exactly those locations stated in this precision, risking to not have a precision at a location where it would be relevant in the new revision. For example, consider a precision that is relevant for locations 5 to 10 of a program. Now, a change is made to the program, and a statement that is unrelated to the safety of the program is introduced right after location 6. Thus, the previous locations 5 to 10 now correspond to the new locations 5, 6, 8 - 11. The previous precision is not applied to location 11 and the analysis first fails to prove the program safe, thus needing at least one additional refinement to rediscover the missing facts. Function-scoped precisions are insensitive to such changes. Even changes due to cross-cutting concerns that affect code locally in many functions are expected to be verifiable without further refinements. Changes to the call graph of the program, however, might still generate a similar need for refinements, for example, if code that is relevant to the safety of a program is moved to another function. Global-scoped precisions reduce this problem further, making refinements only necessary if code referenced by the precision is changed directly (for example, if variables are renamed).

We consider location-scoped precisions to be too sensitive when program code changes. Which of the other two strategies performs better depends on the class of program changes (e.g., whether heavy refactorings changing the functions of the program are common), and how expensive an unnecessarily coarse precision is for the analysis. Often, the latter has less effect than one would intuitively consider. For example, specifying variables from a function f in the precision of a function f would have no effect as the variables in f are out of scope in f anyway. The policy of most projects is to create small commits with mostly local changes, thus, we expect function-scoped precisions to be most promising in practice.

#### IV. EXPERIMENTAL EVALUATION

In order to evaluate the impact of precision reuse on the effectiveness and efficiency of regression verification, we performed an extensive experimental evaluation. We use industrial software for our experiments: in total, we prepared 4 193 verification tasks from 1 119 revisions of 59 device drivers from the Linux kernel. We started verification runs on all those problems with both an explicit-value analysis and a predicate analysis, each with and without precision reuse. Our tool implementation, the C source code of the device drivers, and the full benchmark results are available on our supplementary web page: http://www.sosy-lab.org/~dbeyer/cpa-reuse/. During our experiments, we found an actual bug in the Linux kernel<sup>2</sup>.

Implementation. Our implementation is based on the open-source verification framework CPACHECKER<sup>3</sup> [6], which is available under the Apache 2.0 license. CPACHECKER provides implementations of explicit-state analysis [8] and predicate analysis with ABE [7]. Both approaches are based on CEGAR and use a precision to define the level of abstraction. Thus we only had to add support for writing the program precision to file after a verification run, and reading in a previously written program precision to be used as initial precision before a verification run. The format for persistent storage of the program precision is described in Sect. III. Further changes to the verification tool were not necessary, in particular, the verification algorithm and the abstract domains were not changed. Our extension for precision reuse is integrated into the trunk of the project's source-code repository<sup>4</sup>.

**Verification Tasks.** A verification task is a fully specified verification input, which is referred to by a triple that consists of the name of the driver, the specification that the driver has to satisfy, and the revision number from the repository.

Preparation of an Industrial Benchmark for Regression Verification. We started our selection process by considering the verification tasks from the category 'DeviceDrivers64' of the 2nd Intl. Competition on Software Verification (SV-COMP'13) [3], which is a benchmark set that consists of 1 237 verification tasks. From this set of verification tasks, we selected those device drivers that fulfill the following two criteria: (1) CPACHECKER, in revision 7481, needed more than 20 s of CPU time to report either SAFE or UNSAFE (to ensure that the startup time like JVM startup, parsing, etc., does not influence the total run-time too much); (2) the device driver needs at least one refinement during verification (to omit trivial problems and those for which precisions are not needed).

This selection process resulted in a total of 59 device drivers from the SV-COMP'13 benchmarks that fulfilled the above criteria. We extracted the sources for all available revisions of those drivers from the official Linux kernel repository<sup>5</sup>. Each of these device drivers consists of several header and source files, each having its own revision history. We considered all commits to all C source files of the device driver, in chronological order, starting with the revision in which the device driver was added

# TABLE II CONSIDERED SPECIFICATIONS (LDV RULES) $^6$

Name	Description
------	-------------

- 08\_1a Module get/put. For each successful call to try\_module\_get() a corresponding call to module\_put() that unblocks the module must exist.
- 32\_1 Mutex lock/unlock. A less accurate implementation of specification 32\_7a.
- 32\_7a Mutex lock/unlock. A mutex must not be acquired or released twice. A mutex must not be released without prior acquiring. Finally, all mutexes must be released.
- 39\_7a Spinlocks lock/unlock. A spin lock must not be acquired or released twice. A spin lock must not be released without prior acquiring. Finally, all spin locks must be released.
- 43\_1a *Memory allocation inside spinlocks*. The flag for atomic allocation operations must be used whenever a memory allocation function call is done while a spin lock is held.
- 68\_1 *USB alloc/free urb.* For each allocation of an USB Request Block (URB) using usb\_alloc\_urb() a corresponding call to usb\_free\_urb() must exist.

to its directory in the kernel repository (if the driver resided in the "staging" area of the kernel before being accepted into the main area, these revisions were not considered). In order to obtain a linear history of changes we excluded commits that occurred on branches that were created during the development of a driver (the merge commits that reintegrated such branches are included, and thus no changes are lost). The oldest revisions taken date back to the year 2007, and the latest ones to the end of 2012.

In order to obtain verification tasks, we also need specifications. We used as specification six different rules for correct Linux kernel core API usage (see Table II). We composed each revision of the 59 selected drivers with each specification. The composition was done using the LDV-toolkit <sup>7</sup> [22], [24] and consisted of: (1) adding a main function that simulates calls to the device driver from the Linux kernel core, (2) weaving in one of the six specifications (reducing the rule-based specification of the property into a reachability property by weaving in a monitor automaton), and (3) combining all files that the device driver (in the particular revision) consists of, into a single file (using CIL pre-processing). The result of this composition process is a verification task that consists of a single verifiable C file, for each revision.

We omitted tasks where the specification is trivially satisfied, e.g., specification "Module get/put" for drivers that do not call the function try\_module\_get(). For evaluating the effect of our approach, we need to consider those verification tasks for which the precision needs to be fully discovered and where repeated application of the verifier yields deterministically the same precision. This is not the case for verification tasks with a known specification violation, because the analysis can terminate as soon as finding a counterexample, skipping parts of the state space. Of course, precision reuse is applicable in such cases as well (witnessed by the bug we found), but in our

<sup>&</sup>lt;sup>2</sup>https://lkml.org/lkml/2013/3/1/550

<sup>&</sup>lt;sup>3</sup>http://cpachecker.sosy-lab.org

<sup>4</sup>https://svn.sosy-lab.org/software/cpachecker

<sup>&</sup>lt;sup>5</sup>git://git.kernel.org/pub/scm/linux/kernel/git/torvalds/linux.git

<sup>&</sup>lt;sup>6</sup>http://linuxtesting.org/ldv/online?action=rules

<sup>&</sup>lt;sup>7</sup>http://linuxtesting.org/project/ldv

benchmarks the numbers would not be comparable. Therefore, we remove from our benchmark set all verification tasks with the expected result UNSAFE. The resulting benchmark set for regression verification consists of a total of 4 193 industrial-strength verification tasks, which allows us to perform a significant experimental study.

Differences between Verification-Task Revisions. While normally source-code changes for the device drivers are rather limited from revision to revision, our benchmark set has quite large source-code differences between revisions, which is (not by design, rather as a side-effect) good to evaluate insensitivity to changes. We explain the main three reasons in the following: (1) Whenever commits occurred in branches, we did not include the corresponding revisions along the branch; instead, we extracted only revisions from the mainline branch. The revisions after a merge into the mainline branch result from a single (generally larger) commit. (2) Another reason for a large difference between revisions is the omission of revisions with a known specification violation. Thus, the changes from such revisions appear together with the changes of the next commit, in the succeeding revision without a specification violation. (3) Another cause for large differences is that we took one snapshot of the code for each revision in which one of the actual core device-driver source files changed. However, in the kernel project there are many other (header) files that influence the code of a particular file, by being included from the file, and by defining macros, types, inline functions etc., which are used in the code. Thus the change between two revisions incorporates not only the changes of the actual device-driver source files, but also the changes to all other kernel (header) files since the last revision. The latter changes are sometimes even larger in size and effect than changes to the driver. For example, the introduction of the kernel feature CONFIG BRANCH TRACER (profiling of unlikely and likely branches in the code by code instrumentation) added several lines of auxiliary variables per if statement, and this additional code appears as new code in the next revision that was made for each driver after the feature was introduced. Our benchmark set of verification tasks has an average of 688 changed lines of source code between subsequent revisions. Our results, presented in the following, show that precision reuse is quite insensitive to such large differences between revisions.

Setup. All experiments were performed on machines with a 3.4 GHz Quad Core CPU (Intel Core i7-2600) and 32 GB of RAM. We used Ubuntu 12.04 (64-bit) with Linux 3.2 and OpenJDK 1.7. We used CPACHECKER, revision 7537. The predicate analysis uses MathSAT 5.2.3 as SMT solver. Each verification run was limited to 15 minutes of run-time and 15 GB of RAM; the Java heap size was limited to 10 GB. The run-time that we report refers to the total CPU time of the verification tool (including startup and reading/writing of program-precision files), and is given in seconds with two significant digits. This is a similar environment to the community-agreed setting of SV-COMP'13. The size of code differences between two revisions of one program is given as the number of differing lines excluding whitespace changes (calculated with diff --ignore-all-space | diffstat).

TABLE III
RESULTS FOR VERIFYING DRIVER DVB-USB-AZ6007 USING PREDICATE
ANALYSIS

-			with	out Pre	cision Reus	with 1	Precisi	on Reus	se	
Spec.	n-th Rev.	Diff. Lines	CPU T	ine Refin	athents Abstracti	OTIS	cru'i	ine Refi	nements Abstr	actions
	32	-	9.1	2	1352		9.5	2	1352	
	33	593	9.5	2	1352		3.6	0	24	
08_1a	34	707	9.8	2	1352		3.6	0	24	
	35	478	9.3	2	1352		3.7	0	24	
	36	2	9.2	2	1352		3.9	0	24	
		Total	47	10	6760		24	2	1448	
	32	-	6.5	27	186		6.6	27	186	
	33	752	7.2	28	210		4.5	1	48	
32_7a	34	961	8.0	29	234		4.8	1	48	
	35	462	7.9	29	234		4.4	0	24	
	36	2	7.9	29	234		4.4	0	24	
		Total	37	142	1098		25	29	330	
	32	_	58	10	8432		58	10	8432	
	33	595	58	10	8432		3.8	0	24	
39_7a	34	707	58	10	8432		4.1	0	24	
	35	462	60	10	8432		4.2	0	24	
	36	2	60	10	8432		4.2	0	24	
		Total	290	50	42160		75	10	8528	

**Results.** We experiment with the reuse of precisions across a sequence of different revisions of a program. For this we start the verification of the first revision with the empty precision, dump the generated precision and use it as the initial precision for the verification of the second revision. The final precision of the second verification run is the input precision for the verification of the third revision and so on. We compare the time needed for this process against the time that is needed for verifying all the revisions individually (using the empty precision as the input for each run and without generating program-precision files).

Results for a Single Driver. The results for a single driver (dvb-usb-az6007) from the Linux kernel are shown in Table III. There are five revisions for this driver, and we show the verification of three specifications using predicate analysis. The column "Diff. Lines" shows the number of lines differing in one revision compared to the previous revision. The lines "Total" show the sum of the respective values for all revisions with one specification.

As expected, the runtime for verifying the first revision is not decreased by the reuse of precisions (as there is no precision to reuse); also, there is no significant overhead for writing the precision to the output file. For the remaining revisions, the runtime results show a clear improvement of performance when reusing the precision from the previous revision. This is achieved by almost completely eliminating the need for refinements, and by lowering the number of (costly) boolean-abstraction computations considerably, compared to the verification of the same program without precision reuse. It is interesting to observe the second and third revisions of this driver when verified against the specification 32\_7a: These two revisions affected the program source in a way that made additional predicates necessary (witnessed by the increase in the number of refinements from 27 to 29). In such a case, the

analysis with precision reuse also has to perform refinements, because these additional predicates are not yet known. However, the 27 refinements that were necessary to discover predicates without precision reuse, are not necessary, because the results are read from the precision file. Thus, the runtime is still much better than without precision reuse.

Results for all Device Drivers and Specifications. Tables IV and V show the results of verifying all revisions of all 59 device drivers against all appropriate specifications, with predicate analysis and explicit analysis, respectively. Due to space reasons we restrict these tables to the 50 best and 25 worst cases out of the total 259 driver/specification pairs (sorted by column "Speedup"). The complete tables are available on the supplementary webpage.

The columns "CPU Time" show the total time used by the model checker to verify all revisions of the device driver against the given specification (excluding the revisions for which it failed due to a timeout or an out-of-memory condition). The column "CPU Time 1st Rev." shows the time needed for verifying the first revision (this is the same with and without reuse). The column "Solved Tasks" shows the number of successfully verified revisions out of the total number of revisions for this driver (the remaining cases were either timeout or out-of-memory, there were no incorrect verification results). If the value in this column is of format "N + M", this means that without precision reuse only N revisions could be verified, whereas with precision reuse N+M revisions could be verified; otherwise the number of successfully verified revisions is the same. There were no cases where a revision could be verified without reuse, but not with precision reuse. The column "Speedup" gives the average speedup for the task of verifying a single revision of the driver when a precision from a previous revision is available for reuse, as opposed to the case where no information is available for reuse. The verification time of the first revision of each driver is not taken into account for calculating the speedup, in order to make this value independent from the number of revisions per driver (otherwise a driver with more revisions would in general show a higher speedup because the cost of the verification of the first revision is less relevant). We also excluded from calculating the speedup such revisions that could not be verified by one or both of the two configurations (without and with reuse). In the last column, we report the size in bytes of the final program-precision file that was produced during the verification of the revisions of this driver. Note that our file format is purely text-based, thus, this number gives a coarse over-approximation of the amount of information that is reused between verification runs. The two highlighted rows show the driver dvb-usb-az6007, for which further details are available in Table III (the two lines here correspond to the lines labeled "Total" in the previous table). The bottom rows of the table report the sum and the average of the respective values per driver/specification pair.

Precision reuse not only increases the efficiency, but also the effectiveness: For five pairs of driver and specification, the number of successfully solved verification tasks was increased by our approach (for predicate analysis). This may happen if an early revision of a driver is verifiable, and a later revision

TABLE VI
RESULTS FOR CONSIDERING ALL REVISIONS VERSUS CONSIDERING ONLY
EVERY 4TH REVISION

Analysis	Revs.	# Tasks	Avg.	CPU		Speedup	Solved
			Diff. Lines	w/o Reuse	w/ Reuse		
Predicate	All	4193	688	130000	40000	3.7	4001+56
Predicate	4th	1090	1579	34000	14000	3.2	1045 + 12
Explicit	All 4th	4193 1090	688 1579	27000 6300	20000 5100	1.4 1.3	$4191 \\ 1090$

would need more than 900 s to be verified. With precision reuse, the verification of the later revision is easier, because a large part of the precision is given as input; often up to the point that it actually can be verified successfully. The maximum speedup for predicate analysis is 50, and for 77 out of 259 driver/specification pairs the speedup is at least two.

We also list all negative results: there are only a few. The last lines of the tables report the few cases for which the verification with precision reuse takes a bit more time than without. Most of these cases have a rather low average CPU time per revision, and in almost all of these cases, the performance drop is not worse than 5%. There is one case for which the time for verification with precision reuse is significantly higher (the last line in Table IV, driver mos7840 with specification 43\_1a). However, note that precision reuse increased the number of successfully solved tasks from 11 to 18 for this case. We generally consider an increase in the number of solved programs to be more important than a performance difference. The verification of the same driver against the other specifications actually shows nice speedups (e.g., third line; also with increase of solved tasks).

The total time that the predicate analysis used for successfully verifying 4001 verification tasks without precision reuse was  $130\,000\,\mathrm{s}$ , whereas with precision reuse a total of 4057 verification tasks (56 more) were verified in only  $40\,000\,\mathrm{s}$ , less than a third of the time. This gives evidence of the significant performance improvement of our approach.

Size of Precision. The size of the precision that is necessary to be stored between subsequent verification runs is small: usually just a few KBs in our uncompressed plain-text format. The average size for predicate analysis is 1 KB (max: 4 KB); for explicit analysis it is 3 KB (max: 35 KB).

The total amount of precision storage that was necessary for verifying all 4 193 verification tasks was 236 KB for predicate analysis and 738 KB for explicit analysis, which is orders of magnitude less compared to the size of the source-code.

Scaling with Larger Changes. As explained above, the changes between subsequent revisions in our benchmark set are already rather large (affecting 688 lines on average) compared to typical developer commits. To find out how our approach scales with the size of changes per revision (change-size sensitivity), we created verification problems with even more changes: we consider only every 4th revision per driver/specification pair as an alternative benchmark set. Thus, the difference between two revisions in this benchmark set combines the differences of four actual driver revisions.

 $\label{thm:table_iv} \text{TABLE IV} \\ \text{Results for predicate analysis (details for highlighted lines in Table III)}$ 

Device Driver	Spec.	# Tasks	Avg. Diff Lines	Refineme w/o Reuse	ents w/ Reuse	1st Rev.	CPU Time w/o Reuse	w/ Reuse	Solved Tasks	Speedup	Size of Precision
leds-bd2802	43_1a	4	426	210	6	220	1900	250	3+1	50	640
dp83640	39_7a	16	557	2256	140	590	11000	860	16	39	3516
mos7840	39_7a	57	621	27522	767	580	23000	1300	45 + 12	31	3307
dmx3191d	39_7a	2	1597	104	57	640	1300	670	2	21	3321
dvb-usb-vp7045	39_7a	12	1001	356	44	41	1700	120	12	20	2680
leds-bd2802	08_1a	14	504	960	8	200	3300	360	14	20	471
ems_usb	39_7a	21	666	796	40	72	2400	190	21	20	2934
dvb-usb-az6007	39_7a	5	353	50	10	58	290	75	5	15	1680
catc	39_7a	22	893	1100	52	32	4100	340	22	13	3282
cp210x	39_7a	71	256	24	12	770	1600	850	2 + 26	9.7	1539
spcp8x5	39_7a	37	481	4701	348	54	2400	310	37	9.4	1847
cxd2820r	39_7a	23	468	624	42	3.1	4200	480	23	8.8	2380
i915	39_7a	79	842	3428	72	49	5800	770	78	8.0	3075
i2o_scsi	39_7a	6	454	381	64	29	230	54	6	7.6	2495
dmx3191d	08_1a	2	1432	20	10	54	110	62	2	7.5	514
it87	39_7a	54	462	1358	37	20	5000	680	54	7.4	2091
dvb-usb-rtl28xxu	39_7a	10	173	154	10	7.8	310	51	10	6.9	1820
sym53c500_cs	39_7a	19	468	1947	113	21	650	120	19	6.6	2634
arkfb	39_7a	22	447	960	56	81	1200	260	20	6.4	2009
budget-patch	39_7a	9	1669	205	27	12	200	44	9	6.0	2290
cp210x	68_1	14	538	954	162	330	4600	1100	14	5.4	938
mos7840	08_1a	60	795	722	15	46	3000	610	60	5.3	889
xilinx_uartps	39_7a	3	352	531	177	22	66	30	3	5.3	2248
farsync	08_1a	5	984	159	30	18	100	33	5	5.0	815
it87	32_7a	59	463	860	25	17	2900	590	59	4.9	1696
ssu100	39_7a	28	337	791	44	35	830	200	28	4.7	2417
cp210x	32_1	14	219	1473	227	63	1100	310	14	4.3	693
mISDN_core	39_7a	59	1265	2651	50	20	2200	540	59	4.1	2691
it87	08_1a	59	478	603	14	18	2100	550	59	3.8	818
leds-bd2802	68_1	4	463	57	16	38	170	75	4	3.4	1361
metro-usb	39_7a	25	158	351	15	8.4	310	97	25	3.4	1417
i2c-algo-pca	68_1	7	477	238	35	8.6	68	26	7	3.3	917
vsxxxaa	68_1	2	1354	28	14	11	22	14	2	3.2	706
sil164	39_7a	3	383	54	18	12	37	20	3	3.2	1693
dp83640	08_1a	16	527	190	12	24	400	140	16	3.1	789
spcp8x5	68_1	13	740	508	46	11	260	92	13	3.1	1385
leds-bd2802	32_1	4	121	32	10	25	120	55	4	3.1	1135
cp210x	08_1a	71	304	186	9	170	8200	2800	71	3.1	387
i915	08_1a	79	731	1264	20	69	1900	680	79	3.0	527
uartlite	39_7a	9	326	198	22	11	98	40	9	3.0	2151
it87	43_1a	15	612	105	7	9.0	150	56	15	2.9	405
i2c-algo-pca	32_1	7	223	131	19	6.7	50	21	7	2.9	668
i915	32_7a	79	777	1184	24	5.9	1800	640	79	2.9	1020
mos7840	32_7a	60	615	779	49	6.4	2500	900	60	2.8	1902
cp210x	32_7a	71	257	600	20	44	5500	2100	56 + 10	2.6	1248
lms283gf05	39_7a	13	458	320	23	11	140	62	13	2.6	1658
arkfb	68_1	6	706	136	48	95	300	170	6	2.6	2575
dvb-usb-az6007	08_1a	5	356	10	2	9.5	47	24	5	2.6	312
twidjoy	39_7a	2	1458	46	26	10	19	14	2	2.5	2159
wm831x-dcdc	39_7a	34	286	133	4	4.8	470	190	34	2.5	1402
:		F	or full result	s c.f. http://www	.sosy-lab.o	org/~dbeye	r/cpa-reuse/pre	dicate.html			:
	32 79	41	259	58	3	4.0	160	160	41	1.0	614
tcm_loop mt2266	32_7a 32_7a	5	748	58 3	1	2.3	160 13	12	5	1.0	565
adl_pci7432	32_7a 39_7a	13	122	46	4	2.5	32	32	13	1.0	816
slram	08_1a	9	563	60	6	3.5	34	33	9	1.0	490
spi_ks8995	32_7a	4	516	12	4	2.8	11	33 11	4	1.0	828
drbd	08_1a	96	2657	96	1	9.0	870	860	96	1.0	245
mtdoops	08_1a	41	264	47	4	$\frac{9.0}{4.4}$	110	110	41	1.0	539
farsync	32_7a	9	889	0	0	4.4	49	49	9	1.0	2
rtc-max6902		5	564	5	1	2.9	49 14	49 14	9 5	1.0	221
	32_1	13	122	23	2	$\frac{2.9}{2.4}$	14 31	14 31		1.0	604
adl_pci7432 wl12xx sdio	08_1a		261	42	3	$\frac{2.4}{3.2}$	130	130	13	1.0	
_	32_7a	38 2	201	3	3		4.2	4.2	$\frac{38}{2}$	1.0	776 277
ar7part i915	43_1a	79	746	0	0	2.0					277 2
	43_1a		2079	156	6	6.2	640	640	79 26	.99	223
mISDN_core	43_1a	26				7.0	190	190	26	.99	
mt2266 rtc-max6902	08_1a	5 5	725 562	5 4	1	2.6	13	13	5	.99	557
	43_1a	5 9	562 747	27	1 9	$\frac{2.7}{2.9}$	13 28	13 28	5 9	.99	219
rtc-pcf2123	32_7a	5	409	8	2		28 12	28 13	9 5	.98 .98	1252 257
i2c-matroxfb	43_1a			3		2.5	7.7				
keyspan_remote	32_1	3	285		1	2.7		8.0	3	.98	297
wl12xx_sdio	08_1a	38	258	38	2	3.2	120	130	38	.97	579
i2c-matroxfb	08_1a	7	565	7	2	2.6	18	19	7	.96	283
ads7871	08_1a	10	265	10	1	2.3	22	23	10	.96	245
magellan	32_7a	2	1267	10	9	3.9	7.4	7.6	2	.96	1209
	32_7a	9 25	625	34	16	2.7	30	36	9	.83	1618
slram		. 75	1018	518	1	390	980	4800	11 + 7	.21	3965
slram mos7840	43_1a	23	1010								
	43_1a	4193	1010	80280	5034	5800	130000	40000	4001+ <b>56</b>		242197

TABLE V
RESULTS FOR EXPLICIT-VALUE ANALYSIS

Device Driver	Spec.	# Tasks	Avg. Diff. Lines	Refiner w/o Reuse	nents w/ Reuse	1st Rev.	CPU Time w/o Reuse		Solved Tasks	Speedup	Size of Precision
cfag12864b	08_1a	4	326	36	9	75	290	89	4	15	4846
cfag12864b	32_1	2	48	14	7	71	140	76	2	13	3175
cfag12864b	39_7a	4	414	49	13	240	1100	310	4	12	20606
mISDN_core	39_7a	59	1265	738	15	25	1900	490	59	4.0	34859
cfag12864b	32_7a	4	369	37	10	71	350	140	4	3.8	10573
it87	39_7a	54	462	478	10	5.7	540	250	54	2.2	3324
mISDN_core	68_1	26	2481	52	2	6.8	410	200	26	2.1	958
tcm_loop	39_7a	41	263	517	14	8.1	360	180	41	2.0	15686
budget-patch	43_1a	5	1239	20	4	6.7	37	22	5	2.0	4135
mISDN_core	32_7a	59	1179	202	7	10	860	440	59	2.0	26517
sil164	39_7a	3	383	18	6	6.5	18	13	3	1.9	9100
com20020_cs	39_7a	2	524	18	9	6.2	12	9.4	2	1.9	11896
uartlite	39_7a	9	326	63	7	6.4	52	31	9	1.9	15106
i2o_scsi	39_7a	6	454	55	10	6.4	38	23	6	1.8	10457
wl12xx_sdio	39_7a	38	266	372	11	6.6	240	130	38	1.8	2869
ems_usb	39_7a	21	666	199	10	7.0	140	82	21	1.8	6129
slram	68_1	5	511	25	5	5.7	28	18	5	1.8	7030
mISDN_core	08_1a	59	1532	118	2	11	730	420	59	1.8	1972
slram	39_7a	9	599	72	9	5.5	51	31	9	1.8	7567
cx231xx-dvb	39_7a	13	577	127	10	6.2	87	53	13	1.7	6854
it87	32_7a	59	463	299	11	4.9	480	270	59	1.7	15657
dvb-usb-az6007	39_7a	5	353	45	9	7.0	35	23	5	1.7	14225
dvb-usb-rtl28xxu	39_7a	10	173	90	9	6.3	66	41	10	1.7	8771
it87	08_1a	59	478	229	3	4.7	430	250	59	1.7	535
arkfb	39_7a	22	447	132	7	7.1	180	110	22	1.7	4375
dp83640	39_7a	16	557	176	11	6.9	110	69	16	1.7	9995
dvb-usb-vp7045	39_7a	12	1001	110	11	6.5	78	48	12	1.7	13195
tdo24m	39_7a	12	536	74	7	6.3	68	43	12	1.7	5015
i2c-matroxfb	39_7a 39_7a	7	617	51	8	5.3	35	43 24	7	1.7	5978
cate	39_7a 39_7a	22	893	246	13	6.3	150	93	22	$1.7 \\ 1.7$	6604
cp210x	32_1	14	219	56	4	6.8	94	60	14	1.7	4175
		71	256	456	8	6.2	460		71	$1.7 \\ 1.7$	
cp210x	39_7a							280			1363
budget-patch	39_7a	9	1669	98	13	6.0	57	37	9	1.7	9617
xilinx_uartps	39_7a	3	352	21	7	5.6	16	12	3	1.6	11926
panasonic-laptop	39_7a	16	410	104	7	4.9	78	50	16	1.6	2549
slram	32_1	5	450	20	4	5.0	24	17	5	1.6	3330
sil164	32_7a	3	486	15	6	5.3	16	12	3	1.6	8326
sym53c500_cs	39_7a	19	468	175	10	6.4	120	75	19	1.6	5914
spcp8x5	39_7a	37	481	273	9	6.2	230	140	37	1.6	1962
wm831x-dcdc	39_7a	34	286	133	4	4.5	180	110	34	1.6	593
dmx3191d	39_7a	2	1597	14	8	6.2	12	10	2	1.6	9896
ssu100	39_7a	28	337	209	9	6.7	170	110	28	1.6	5041
dvb-usb-vp7045	32_1	2	1806	12	6	5.9	12	10	2	1.6	3961
wm831x-dcdc	68_1	3	128	10	4	6.1	17	13	3	1.5	8991
metro-usb	39_7a	25	158	175	7	5.5	120	83	25	1.5	4102
abyss	39_7a	3	2202	26	10	6.4	19	15	3	1.5	13496
pcc-cpufreq	39_7a	3	554	21	7	4.4	13	10	3	1.5	6689
mos7840	39_7a	57	621	416	9	6.8	410	280	57	1.5	1290
tdo24m	32_7a	12	586	60	8	5.1	64	45	12	1.5	4445
keyspan_remote	39_7a	7	929	43	7	5.0	31	23	7	1.5	7903
:		1		s c.f. http://wv					· ·		:
videobuf-vmalloc	08_1a	31	363	31	1	2.6	79	79	31	1.0	. 57
	08_1a	10	275	10	1	2.6	24	24	10	.99	1130
intel_vr_nor uio sercos3				7	3	$\frac{2.0}{2.4}$					2842
_	32_7a	5	886 1465	0	0	$\frac{2.4}{2.8}$	13	13	5	.99	
abyss	43_1a	3	1465				9.1	9.0	3	.99	1251
rtc-pcf2123	43_1a	2	59 786	2	1	3.0	5.8	5.8	2	.99	1351
vsxxxaa	43_1a	2	786	2	1	2.9	5.3	5.5	2	.99	699
twidjoy	08_1a	2	1222	2	1	2.7	4.9	5.0	2	.99	1154
spcp8x5	43_1a	13	897	13	1	3.4	48	48	13	.99	652
i2c-algo-pca	08_1a	14	480	14	1	2.4	35	35	14	.99	173
i915	08_1a	79	731	93	1	4.5	510	510	79	.99	463
farsync	32_7a	9	889	0	0	3.1	29	30	9	.99	0
magellan	32_7a	2	1267	2	2	2.6	5.0	5.1	2	.98	1557
comedi_bond	08_1a	13	98	13	1	2.4	29	30	13	.98	173
mISDN_core	32_1	26	388	26	1	6.4	180	180	26	.98	308
mtdoops	43_1a	20	323	20	1	2.5	52	53	20	.98	223
rtc-max6902	32_7a	9	829	7	3	2.5	23	23	9	.98	2046
cxd2820r	32_7a	23	492	32	3	3.4	96	98	23	.98	1094
cfag12864b	43_1a	2	74	2	1	2.3	4.5	4.5	2	.97	399
twidjoy	32_7a	2	1268	2	2	2.6	4.9	5.1	$\frac{1}{2}$	.97	1557
abyss	32_7a	4	2025	2	2	2.8	13	14	$\frac{2}{4}$	.96	2774
cxd2820r		23	451	23	1	3.1	92	97	23	.95	119
	08_1a				2				23		
spaceorb	32_7a	2	1226	2		2.8	5.0	5.3		.94	1557
mISDN_core	43_1a	26	2079	26	1	5.8	170	180	26	.92	311
dmx3191d	32_7a	2	1608	3	3	3.0	7.3	7.8	2	.89	3246
drbd	08_1a	96	2657	96	1	10	950	1100	96	.89	89
dibu											
Sum		4193		13313	911	1500	27000	20000	4191		756465

Table VI shows the result for this experiment in the lines that are marked "4th" in column "Revs." (the lines marked "All" show the previous results for comparison). The average size of differences between revisions increased from 688 to 1579 lines. As expected, the speedup decreased, but only from 3.7 to 3.2 for predicate analysis, and from 1.4 to 1.3 for explicit analysis. This shows that our approach copes well even with massive changes to the analyzed code.

Threats to Validity. To have a significant experimental basis, we created a huge set of 4193 benchmark verification tasks. To derive highly credible test data, and instead of relying on random or artificial benchmarks, our selection of verification tasks is based on hundreds of actual source code commits to 59 different Linux device drivers. The characteristics of systems software, in particular kernel device drivers, might be similar and could have an impact on validity, but, Linux driver verification is important enough to be representative on its own [9]. After all, there is the Linux Driver Verification Program of the Linux Verification Center [22] and also Microsoft dedicates considerable amounts of resources to Windows driver verification [1]. We used an experimental setup and environment that is virtually identical to the infrastructure for the competition on software verification (communityagreed). Precision reuse has a different impact on different abstract domains. We included two totally different analysis approaches in our experimental evaluation: a symbolic and an explicit model-checking approach. Our experiments are not operating on one particular specification to check, but we rather consider six different, real-world specifications, with all showing a considerable speedup.

## V. CONCLUSION

We propose to use abstraction precisions as reusable verification facts. Precisions are easy to extract from model checkers that automatically construct an abstract model of the program (abstract interpretation). Precisions are tool-independent and it is easy for successive verification runs to read and use precisions; their memory footprint is small.

We present an extensive collection of verification tasks for benchmarking approaches for regression verification that is derived from industrial code, namely, the Linux kernel. Our benchmark consists of 4 193 single verification problems and is publicly available on our supplementary web page.

Our experiments confirm that the reuse of precisions has a significant effect on the verification process. The approach drastically improves the performance on most verification problems, and if not successful, it does not have a noticeable negative impact. Besides improving the performance, we sometimes even solve verification problems that were not solvable before in the given time and memory resources.

The technical insight of our approach is that reusing precisions drastically reduces the number of CEGAR iterations (refinements), and therefore the effort spent on analyzing spurious counterexamples and reconstructing abstract states for refined parts of the system. Precisions are precious intermediate results that are difficult to discover, and which define the abstraction level of the abstract model. Thus, the work on

discovering the abstract model is significantly reduced in later verification runs. Because the information that we reuse does not depend on source-code details, our approach is less sensitive to changes in the source code, compared to other approaches. Precision reuse is applicable to all verification approaches that are based on abstraction and automatically compute the precision of the abstract model (this includes CEGAR-based approaches and abstract interpretations).

As a result of the experiments for this paper, an unknown bug in the Linux kernel was found and a fix was submitted to the maintainers by the LDV team.

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