

Improving Convergence Rate Of IC3

Eugene Goldberg
eu.goldberg@gmail.com

Abstract—*IC3*, a well-known model checker, proves a property of a transition system ξ by building a sequence of formulas F_0, \dots, F_k . Formula F_i , $0 \leq i \leq k$ over-approximates the set of states reachable in at most i transitions. The basic algorithm of *IC3* cannot guarantee that the value of k never exceeds the reachability diameter of ξ . We describe an algorithm called *IC4* that gives such a guarantee. (*IC4* stands for “*IC3* + Improved Convergence”). One can argue that the average convergence rate of *IC4* is better than for *IC3* as well. Improving convergence can facilitate some other variations of the basic algorithm. As an example, we describe a version of *IC4* employing property decomposition. The latter means replacing an original (strong) property with a conjunction of weaker properties to prove by *IC4*. We argue that addressing the convergence problem is important for making the property decomposition approach work.

I. INTRODUCTION

IC3 is a model checker [2] that has become very popular due to its high scalability. Let ξ be a transition system and P be a safety property of ξ . *IC3* builds a sequence of formulas F_0, \dots, F_k where F_i over-approximates the set of states reachable from an initial state of ξ in at most i transitions. Property P is proved when F_i becomes an inductive invariant of ξ for some $0 \leq i \leq k$.

One of the reasons for high performance of *IC3* is that the value of k above is typically much smaller than $\text{Diam}(\xi)$ (i.e. the reachability diameter of ξ). So, on average, *IC3* converges to an inductive invariant much faster than an RA-tool (where RA stands for “reachability analysis”). Interestingly, the *worst case* behavior of an RA-tool and *IC3* is quite different from their average behavior. Namely, *IC3* cannot guarantee that k never exceeds $\text{Diam}(\xi)$. We introduce a modification of *IC3* called *IC4* that fixes the problem above. (*IC4* stands for “*IC3* + Improved Convergence”). On one hand, *IC4* has the same worst case behavior as an RA-tool. On the other hand, the average convergence rate of *IC4* is arguably better than that of *IC3* as well.

The main difference between *IC4* and *IC3* is as follows. *IC3* checks if formula F_k is an inductive invariant by “pushing” the clauses of F_k to F_{k+1} . If every clause of F_k can be pushed to F_{k+1} , the former is an inductive invariant. Otherwise, there is at least one clause $C \in F_k$ that cannot be pushed to F_{k+1} . In this case, *IC3* moves on re-trying to push C to F_{k+1} when new clauses are added to F_k . In contrast to *IC3*, *IC4* applies extra effort to push C to F_{k+1} . Namely, it derives new inductive clauses to exclude states that prevent C from being pushed to F_{k+1} . This extra effort results either in successfully pushing C to F_{k+1} or in proving that C is “unpushable”.

The proof of unpushability consists of finding a *reachable* state s that satisfies formula F_{k+1} and falsifies clause C .

The existence of s means that F_k cannot be turned into an inductive invariant by adding more clauses. Thus, semantically, the difference between *IC4* and *IC3* is that the former starts building a new over-approximation F_{k+1} only after it proved that adding one more time frame is *mandatory*. Operationally, *IC4* and *IC3* are different in that *IC4* generates a small set of reachable states.

An appealing feature of *IC3* is its ability to generate property-specific proofs. So it seems natural to decompose a hard property P into a conjunction $P_1 \wedge \dots \wedge P_m$ of weaker properties and then generate m property-specific proofs for P_i . However, the convergence issues of *IC3* are arguably more pronounced for weak properties (see Subsection VII-B). So, to make property decomposition work, one should use *IC4* rather than *IC3* to prove properties P_i . In this paper, we describe a variation of *IC4* employing property decomposition.

At the time of writing the first version of the paper we were not aware of *QUIP*, a version of *IC3* published at [1]. We fix this omission and describe the relation between *IC4* and *QUIP* in Subsection VII-A. *QUIP* more aggressively than the basic *IC3* pushes clauses to future time frames and generates reachable states as a proof that a clause cannot be pushed. However, no relation of *QUIP*’s good performance with improvement of its convergence rate has been established either theoretically or experimentally.

The contribution of this paper is as follows. First, we show the reason why *IC3* has a poor upper bound on the convergence rate (Section III). Second, we formulate a new version of *IC3* called *IC4* (Section IV) that is meant for fixing this problem. In particular, we show that *IC4* indeed has a better upper bound than *IC3* (Section V). We also give an estimate of the number of reachable states *IC4* has to generate (Section VI). Third, we discuss arguments in favor of *IC4* (Section VII). Fourth, we describe *IC4-PD*, a version of *IC4* meant for solving hard problems by property decomposition (Section VIII).

II. A BRIEF OVERVIEW OF IC3

Let I and T be formulas¹ specifying the initial states and transition relation of a transition system ξ respectively. Let P be a formula specifying a safety property of ξ . *IC3* proves P by building a set of formulas F_0, \dots, F_k . Here formula F_i , $0 \leq i \leq k$ depends on the set of state variables of i -th time frame (denoted as S_i) and over-approximates the set of states²

¹We assume that all formulas are propositional and are represented in CNF (conjunctive normal form)

²A state is an assignment to the set of state variables.

reachable in at most i transitions. That is every state reachable in at most i transitions is an F_i -state³.

IC3 builds formula F_k as follows. Formula F_0 is always equal to I . Every formula F_k , $k > 0$ is originally set to P . (So $F_k \rightarrow P$ is always true because the only modification applied to F_k is adding clauses.) Then *IC3* tries to exclude every F_k -state that is a predecessor of a bad state⁴ i.e. a state s that breaks $F_k \wedge T \rightarrow P'$. Here T is a short for $T(S_k, S_{k+1})$ and P' , as usual, means that P depends on *next-state variables* i.e. those of S_{k+1} . Exclusion of s is done by derivation of a so-called inductive clause C falsified by s . Adding C to F_k excludes s from consideration. (If s cannot be excluded, *IC3* generates a counterexample.)

One of the properties of formulas F_i maintained by *IC3* is $F_i \rightarrow F_{i+1}$. To guarantee this, *IC3* maintains two stronger properties of F_i : a) $Clauses(F_{i+1}) \subseteq Clauses(F_i)$ and b) $F_i \neq F_{i+1}$ implies that $F_i \not\equiv F_{i+1}$. That is the set of clauses of F_i contains all the clauses of F_{i+1} and the fact that F_i contains at least one clause that is not in F_{i+1} means that F_i and F_{i+1} are logically inequivalent. Since every formula F_i implies P , one cannot have more than $|P\text{-states}|$ different formulas F_0, \dots, F_k . That is if the value of k exceeds $|P\text{-states}|$, there should be two formulas F_{i-1}, F_i , $i < k$ such that $F_{i-1} = F_i$. This means that F_{i-1} is an inductive invariant and property P holds.

III. CONVERGENCE RATE OF *IC3* AND CLAUSE PUSHING

We will refer to the number of time frames one has to unroll before proving property P as the **convergence rate**. We will refer to the latter as $ConvRate(P)$. As we mentioned in Section II, an upper bound on $ConvRate(P)$ of the basic version of *IC3* formulated in [2] is $|P\text{-states}|$. Importantly, the value of $|P\text{-states}|$ can be much larger than $Diam(\xi)$ (i.e. the reachability diameter of ξ). Of course, on average, $ConvRate(P)$ of *IC3* is much smaller than $Diam(\xi)$, let alone $|P\text{-states}|$. However, as we argue below, a poor upper bound on $ConvRate(P)$ is actually a *symptom of a problem*.

Recall that formula F_k specifies an over-approximation of the set of states reachable in at most k transitions. So, it cannot exclude a state s reachable in j transitions where $j \leq k$. (That is such a state s cannot falsify F_k .) On the other hand, F_k may exclude states reachable in *at least* $k + 1$ transitions or more.

Suppose *IC3* just finished constructing formula F_k . At this point $F_k \wedge T \rightarrow P'$ holds i.e. no bad state can be reached from an F_k -state in one transition. After constructing F_k , *IC3* invokes a procedure for pushing clauses from F_k to F_{k+1} . In particular, this procedure checks for every clause C of F_k if implication $F_k \wedge T \rightarrow C'$ holds. We will refer to this implication as the **pushing condition**. If the pushing condition holds for clause C , it can be pushed from F_k to F_{k+1} . If

the pushing condition holds for every clause⁵ of F_k , then $F_k \wedge T \rightarrow F'_k$ and F_k is an inductive invariant.

Suppose that the pushing condition does not hold for a clause C of F_k . Below, we describe two different reasons for the pushing condition to be broken. *IC3* does not try to identify which of the reasons takes place. This feature of *IC3* is the cause of its poor upper bound on $ConvRate(P)$. Moreover, intuitively, this feature should affect the *average* value of $ConvRate(P)$ as well.

The first reason for breaking the pushing condition is that clause C excludes a state s that is *reachable* in $(k+1)$ -th time frame from an initial state. In this case, formula F_k *cannot* be turned into an inductive invariant by adding more clauses. In particular, the broken pushing condition cannot be fixed for C . The second reason for breaking the pushing condition is that clause C excludes a state s that is *unreachable* in $(k+1)$ -th time frame from an initial state. In this case, every F_k -state q that is a predecessor of s can be excluded by deriving a clause falsified by q . So in this case, the broken pushing condition *can* be fixed. In particular, by fixing broken pushing conditions for F_k one may turn the latter into an inductive invariant.

IV. INTRODUCING *IC4*

A. A high-level view of *IC4*

We will refer the version of *IC3* with a better convergence rate described in this paper as ***IC4***. The main difference between *IC3* and *IC4* is that the latter makes an extra effort in pushing clauses to later time frames. This new feature of *IC4* is implemented in a procedure called *NewPush* (see Figure 1). It is invoked after *IC4* has built F_k where the predecessors of bad states are excluded i.e. as soon as $F_k \wedge T \rightarrow P'$ holds. For every clause C of F_k , *NewPush* checks the pushing condition (see Section III). If this condition is broken, *NewPush* tries to fix it or proves that it cannot be fixed and hence C is “unpushable”.

Depending on the clause-pushing effort, one can identify three different versions of *IC4*: minimal, maximal and heuristic. The *minimal IC4* stops fixing pushing conditions as soon as *NewPush* finds a clause of F_k that cannot be pushed. After that the minimal *IC4* switches into the “*IC3* mode” where the pushing conditions are not fixed for the remaining clauses of F_k . The *maximal IC4* tries to fix the pushing condition for every inductive clause of F_k . That is if a clause $C \in F_k$ cannot be pushed to F_{k+1} , the maximal *IC4* tries to fix the pushing condition (regardless of how many unpushable clauses of F_k has been already identified). Moreover, if an inductive clause C is added to F_i , $i < k$, the maximal *IC4* try to fix the pushing condition for C if it cannot be immediately pushed to F_{i+1} .

A *heuristic IC4* uses a heuristic to stay between minimal and maximal *IC4* in terms of the clause-pushing effort. In this paper, we describe the minimal *IC4* unless otherwise stated. So, when we just say *IC4* we mean the minimal version of it.

³Given a formula $H(S)$, a state s is said to be an H -state if $H(s) = 1$.

⁴Given a property P , a \bar{P} -state is called a bad state.

⁵In reality, since both F_k and F_{k+1} contain the clauses of P , only the inductive clauses of F_k added to strengthen P are checked for the pushing condition.

```

//  $\mathbb{F}_k = \{F_0, \dots, F_k\}$ ;
//
NewPush( $I, T, P, \mathbb{F}_k$ ) {
1  NewClauses := true;
2   $F_{k+1} := P$ 
3  while (NewClauses) {
4    NewClauses := false;
5    foreach  $C \in (F_k \setminus P)$  {
6      if ( $C \in (F_{k+1} \setminus P)$ ) continue;
7       $s := SAT(F_k \wedge T \wedge \overline{C})$ ;
8      if ( $s = nil$ ) {
9         $F_{k+1} := F_{k+1} \cup \{C\}$ 
10       continue; }
11     ( $\mathbb{F}_k, t$ ) := ExclState( $s, I, T, P, \mathbb{F}_k$ );
12     if ( $t \neq nil$ ) return( $C, t$ );
13     NewClauses := true;}
14 return( $nil, nil$ ); }

```

Fig. 1. The *NewPush* procedure

B. Description of *NewPush*

The pseudo-code of *NewPush* is given in Fig. 1. At this point *IC4* has finished generation of F_k . In particular, no bad state can be reached from an F_k -state in one transition. *NewPush* tries to push every inductive clause of F_k to F_{k+1} . If a clause $C \in F_k$ is unpushable, *NewPush* returns C and a trace t leading to a state falsified by clause C . Trace t proves the unpushability of C and hence the fact that F_k cannot be turned into an inductive invariant by adding more clauses. If every clause of F_k can be pushed to F_{k+1} , then F_k is an inductive invariant and *NewPush* returns (nil, nil) instead of clause C and trace t .

NewPush consists of two nested loops. A new iteration of the outer loop (lines 3-13) starts if variable *NewClauses* equals *true*. The value of this variable is set in the inner loop (lines 5-13) depending on whether new clauses are added to F_k . In every iteration of the inner loop, *NewPush* checks the pushing condition (line 7) for an inductive clause of F_k that is not in F_{k+1} . If it holds, then C is pushed to F_{k+1} .

If the pushing condition fails, an F_{k+1} -state s is generated that falsifies clause C . Then *NewPush* tries to check if s is reachable exactly as *IC3* does this when looking for a counterexample. The only difference is that s is a good state⁶. As we mentioned above, if s is reachable by a trace t , *NewPush* terminates returning C and t . Otherwise, it sets variable *NewClauses* to *true* and starts a new iteration of the inner loop.

V. BETTER CONVERGENCE RATE OF *IC4*

As we mentioned in Section II, an upper bound on $ConvRate(P)$ is $|P\text{-states}|$. Below, we show that using procedure *NewPush* described in Section IV brings the upper bound on $ConvRate(P)$ for *IC4* down to $Diam(\xi)$. (Note that if property P holds, $Diam(\xi) \leq |P\text{-states}|$.)

⁶Recall that at this point of the algorithm, no bad state can be reached from an F_k -state in one transition.

Let F_k be a formula for which *NewPush* is called when $k \geq Diam(\xi)$. At this point $F_k \wedge T \rightarrow P'$ holds. Let s be a state breaking the pushing condition for a clause C of F_k . That is s falsifies C (and hence it is not an F_k -state) but is reachable from an F_k -state in one transition.

Recall that F_k is an over-approximation of the set of states that can be reached in at most k -transitions. Since s falsifies F_k , reaching it from an initial state of ξ requires at least $k+1$ transitions. However, this is impossible since $k+1 > Diam(\xi)$ and hence state s is unreachable. This means that every F_k -state that is a predecessor of s can be excluded by an inductive clause added to F_k . So eventually, *NewPush* will fix the pushing condition for C . After fixing all broken pushing conditions for clauses of F_k , *NewPush* will turn F_k into an inductive invariant.

VI. NUMBER OF REACHABLE STATES TO GENERATE

The number of generated reachable states depends on which of the three versions of *IC4* is considered (see Subsection IV-A). Let k denote the maximal number of time frames unfolded by *IC4*. In the case of the minimal *IC4*, the upper bound on the number of reachable states for proving property P is equal⁷ to $k * (k + 1)/2$. For the maximal *IC4*, the upper bound is $k * |Unpush(F)|$ where $F = F_1 \cup \dots \cup F_k$ and $Unpush(F)$ is the subset of F consisting of unpushable clauses. Indeed, an inductive clause $C \in F_i$ is proved unpushable only once. This proof consists of a trace to a state falsified by F_i . The length of this trace is equal to i and hence bounded by k . The upper bound for the maximal *IC4* above is loose because one assumes that

- the length of every trace proving unpushability equals k
- two (or more) clauses cannot be proved unpushable by the same reachable state.

Re-using reachable states can dramatically reduce the total number of reachable states one needs to generate. For instance, for the minimal *IC4*, this number can drop as low as k . For the maximal *IC4*, the total number of reachable states can go as low as $m + k$ where m is the total number of reachable states generated to prove the unpushability of clauses of $Unpush(F)$.

VII. A FEW ARGUMENTS IN FAVOR OF *IC4*

In this section, we give some arguments in favor of *IC4*. The main argument is given in Subsection VII-A where we relate *IC4* with a model checker called *QUIP*. The latter was introduced⁸ in [1] in 2015. In Subsections VII-B and VII-C, we describe a few potential advantages of *IC4* that were not discussed in [1] (in terms of *QUIP*).

⁷For every formula F_i , $i = 1, \dots, k$, *IC4* generates one reachable state s falsifying a clause of F_i . To reach s , one needs to generate a trace of i states. So the number of reachable states generated for F_i is equal to i . The total number of reachable states is equal to $1 + 2 + \dots + k$.

⁸As we mentioned in the introduction, at the time of writing the first version of our paper we were not aware of *QUIP*.

A. IC4 and QUIP

As we mentioned in the introduction, *QUIP* makes an extra effort to push clauses to future time frames. To show that a clause cannot be pushed, *QUIP* generates a reachable state. Although the premise of *QUIP* is that the strategy above may lead to a faster generation of an inductive invariant, this claim has not been justified theoretically. The advantage of *QUIP* over *IC3* is shown in [1] in terms of better run times and a greater number of solved problems. So, no *direct* experimental data is provided on whether *QUIP* has a better convergence rate than *IC3*. (As mentioned in [1] and in the first version of our paper, having at one’s disposal reachable states facilitates construction of better inductive clauses⁹. So one cannot totally discard the possibility that the performance of *QUIP* is mainly influenced by this “side effect”.) Nevertheless, great experimental results of *QUIP* is an encouraging sign.

B. Proving weak properties

In this subsection, we argue that *IC4* should have more robust performance than *IC3* on weak properties. Let F_i be an over-approximation of the set of states reachable in at most i transitions and P be the property to prove. As we mentioned earlier, there are two conditions one needs to satisfy to turn F_i into an inductive invariant: $F_i \wedge T \rightarrow P'$ and $F_i \wedge T \rightarrow F_i'$. We will refer to a state s breaking the first condition (respectively second condition) as a state of the first kind (respectively second kind). Only states of the first kind (i.e. F_i -states from which there is a transition to a bad state) are *explicitly* excluded by *IC3*. States of the second kind are excluded *implicitly* via generalization of inductive clauses. On the other hand, *IC4* excludes states of both kinds explicitly and implicitly (via generalization of inductive clauses).

First, assume that P is a *strong* property meaning that there is a lot of bad states. Then by excluding states of the first kind coupled with generalization of inductive clauses, *IC3* also excludes many states of the second kind. Now assume that P is a *weak* property that has, say, only one bad state. Let us also assume that excluding states reaching this bad state is easy. Intuitively, in this case, *IC3* is less effective in excluding the states of the second kind (because their exclusion is just a *side effect* of excluding states of the first kind). On the other hand, *IC4* does not have this problem and so arguably should have a more robust behavior than *IC3* when proving weak properties.

C. Test generation

Formal verification of *some* properties of transition system ξ does not guarantee that the latter is correct¹⁰. In this case, testing is employed to get more confidence in correctness of ξ . Traces generated by *IC4* can be used as tests in two scenarios. First, one can check that reachable states found by *IC4* satisfy

⁹By avoiding the exclusion of known reachable states, one increases the chance for an inductive clause to be a part of an inductive invariant.

¹⁰Moreover, ξ can be incorrect even if a supposedly complete set of properties P_1, \dots, P_n is proved true [4], [3]. For instance, the designer may “misdefine” a property and so instead of verifying the right property P_i' (that does not hold) a formal tool checks a *weaker* property P_i (that holds).

```

IC4-PD(I, T, P){
1  Inv := ∅
2  while (true) {
3    s := CheckSat(Inv ∧  $\overline{P}$ )
4    if (s = nil) return(Inv, nil)
5    Q := FormProp(s)
6    (J, Cex) := IC4*(I, T, P, Inv, Q)
7    if (Cex ≠ nil) return(nil, Cex)
8    if (J = Q)
9      J := Strengthen(I, T, Inv, J)
10   Inv := Inv ∧ J } }

```

Fig. 2. The *IC4-PD* procedure

the properties that formal verification tools failed to prove. Second, one can just inspect the states visited by ξ and the outputs produced in those states to check if they satisfy some (formal or informal) criteria of correctness.

VIII. INTRODUCING IC4-PD

In this section, we present *IC4-PD*, a version of *IC4* employing property decomposition. In Subsection VIII-A, we describe two obstacles one has to overcome to make property decomposition work. Subsection VIII-B introduces a straightforward implementation of *IC4-PD*.

A. Property decomposition: two obstacles to overcome

As we mentioned in the introduction, an appealing feature of *IC3* is its ability to generate property-specific proofs. Let P be a hard property to prove. Let P be represented as $P_1 \wedge \dots \wedge P_k$ (i.e. P is decomposed into k weaker properties). Let J_k be an inductive invariant for property P_k . Then $J_1 \wedge \dots \wedge J_k$ is an inductive invariant for property P . So one can prove P via finding property-specific proofs J_i , $i = 1, \dots, k$.

To make the idea of property decomposition work one has to overcome at least two obstacles. The first obstacle¹¹ is that the search space one has to examine to prove P_i is, in general, not a subset¹² of the search space for P . In [5], we show that this issue can be addressed by using the machinery of local proofs¹³.

The second obstacle is as follows. As we argued in Subsection VII-B, weak properties are more likely to expose the convergence rate problem of *IC3*. For that reason, replacing a strong property P with weaker properties P_i may actually lead to performance degradation if properties P_i are proved by *IC3*. On the other hand, *IC4* should be more robust when solving weak properties. So one can address the second obstacle by using *IC4* (rather than *IC3*) to prove properties P_i .

¹¹This obstacle is of a general nature and is not caused by using *IC3*.

¹²The reason is that when proving P_i one may need to consider traces that contain two and more \overline{P} -states. These traces break property P without breaking property P_i .

¹³To prove that P_i holds *globally* one needs to show that no trace of P_i -states reaches a \overline{P}_i -state. Proving P_i *locally* means showing that no trace of P -states (rather than P_i -states) reaches a \overline{P}_i -state. As we show in [5], if P is false, there is property P_i that breaks both globally and locally. So if every P_i holds locally, then it does globally too and P is true.

B. Description of IC4-PD

The pseudocode of *IC4-PD* is shown in Fig. 2. *IC4-PD* accepts formulas I, T, P specifying the initial states, the transition relation and the property to prove respectively. *IC4-PD* returns either an inductive invariant Inv or a counterexample Cex . Computation is performed in a *while* loop. First, *IC4-PD* checks if there is a \bar{P} -state s breaking $Inv \rightarrow P$ (line 3). If not, then Inv is an inductive invariant proving P (line 4). Otherwise, *IC4-PD* forms a new property Q to prove (line 5). Q consists of one clause, namely, the longest clause falsified by s . So, the latter is the only \bar{Q} -state.

Then *IC4-PD* calls *IC4**, a version of *IC4* that proves Q locally¹⁴ with respect to the target property P (see Subsection VIII-A). That is *IC4** checks if there is a trace of P -states (rather than Q -states) leading to the \bar{Q} -state. If not, then Q holds locally. *IC4** uses the current Inv as a constraint¹⁵. Namely, *IC4** looks for a formula J satisfying $Inv \wedge J \wedge T \rightarrow J'$ (rather than $J \wedge T \rightarrow J'$).

If *IC4** finds a counterexample Cex , then Q and hence P fail (line 7). Otherwise, *IC4** returns an inductive invariant J . If Q is itself an inductive property (and so $J = Q$), *IC4* tries to strengthen J like an inductive clause is strengthened by *IC3* (line 9). This is done to avoid enumerating \bar{P} -states one by one if many properties Q turn out to be inductive. If J is already strengthened (and so $J \neq Q$), then Inv is replaced with $Inv \wedge J$ and a new iteration begins.

REFERENCES

- [1] A. Ivrii and A. Gurfinkel. Pushing to the top. FMCAD-15, pages 65–72, 2015.
- [2] A. R. Bradley. Sat-based model checking without unrolling. In *VMCAI*, pages 70–87, 2011.
- [3] E. Goldberg. Complete test sets and their approximations. In *FMCAD-18*. To be published.
- [4] E. Goldberg. Complete test sets and their approximations. Technical Report arXiv:1808.05750 [cs.LO], 2018.
- [5] E. Goldberg, M. Gdemann, D. Kroening, and R. Mukherjee. Efficient verification of multi-property designs (the benefit of wrong assumptions). In *DATE '18*, pages 43–48, Dresden, Germany, 2018.

¹⁴Proving Q locally addresses the first obstacle mentioned in Subsection VIII-A. The second obstacle is addressed by using *IC4* instead of *IC3*.

¹⁵It is safe to do because all reachable states satisfy Inv .