

SDN-Actors: Modeling and Verification of SDN Programs*

Elvira Albert¹, Miguel Gómez-Zamalloa¹, Albert Rubio², Matteo Sammartino³, and Alexandra Silva³

¹ Complutense University of Madrid, Spain

² Universitat Politècnica de Catalunya, Spain

³ University College London, UK

Abstract. Software-Defined Networking (SDN) is a recent networking paradigm that has become increasingly popular in the last decade. It gives unprecedented control over the global behavior of the network and provides a new opportunity for formal methods. Much work has appeared in the last few years on providing bridges between SDN and verification. This paper advances this research line and provides a link between SDN and traditional work on formal methods for verification of distributed software—actor-based modelling. We show how SDN programs can be seamlessly modelled using *actors*, and thus existing advanced model checking techniques developed for actors can be directly applied to verify a range of properties of SDN networks, including consistency of flow tables, violation of safety policies, and forwarding loops.

1 Introduction

SDN is a novel networking architecture which is now widely used in industry, with many companies—such as Google and Facebook—using SDN to control their backbone networks and datacenters. The core principle in SDN is the separation of the control and data planes—there is a centralized *controller* which operates a collection of distributed interconnected switches. The controller can dynamically update switches’ policies depending on the observed flow of packets, which is a simple but powerful way to react to unexpected events in the network. Network verification has become increasingly popular since SDN was introduced, because in this new paradigm the amount of detailed information available about network events is rich enough and can be centrally gathered to check for properties, both statically and dynamically, of the network behavior. Moreover, the controller itself is a program which can be analyzed. The distributed and concurrent nature of network behavior makes the verification tasks challenging and has inspired much research in the verification and formal methods communities.

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This paper provides a new bridge between SDN and a strand of formal methods –actor-based modeling [2], which is a framework that was developed to analyze concurrent systems. Actors form the basic unit of computation in such framework, are equipped with a private memory, and can interact with others through *asynchronous* messages. This setup enables reasoning about local properties without knowledge of the whole program, which gives rise to more compositional and thus scalable methods. Actors provide the foundations for the concurrency model of languages used in industry, e.g., *Erlang* and *Scala*, and libraries used in mainstream languages, e.g., *Akka*.

Contributions. The main contributions of this paper are:

1. SDN-Actors: An encoding of all components of an SDN network into the actor-based language ABS [14]. One of the most challenging aspects to encode were the OpenFlow *barrier* messages, special instructions that the controller can use to force switches to execute all their queued tasks.
2. A soundness proof of the encoding (and implementation) of *barriers* (Th. 2).
3. Application of (context-sensitive) dynamic partial-order reduction (DPOR) techniques to model check SDN programs. We have implemented this model checker on top of the SYCO tool [4] for actors.
4. Several case studies of SDN and properties to illustrate the versatility and potential of the approach. We were able to find bugs related to programming errors in the controller, forwarding loops, and violation of safety policies.

Though we did not explore it in this paper, the encoding we provide opens the door to apply a range of techniques other than model checking. For instance, static analysis, runtime monitoring or simulation of network behavior can be done now using the ABS toolsuite [1]. Other tools and methods for verification of message-passing and concurrent-object systems could be also easily adapted [7, 9, 16, 17]. In addition, because the encoding is not very far from the original flow tables, both model extraction from existing network code and code generation from an actor model should be achievable with a small extension of the tool.

2 Overview

This section provides an overview of the contents of the paper through an extended example, that we also use to introduce some basic concepts and notations.

2.1 Concurrency errors in SDN networks

SDN is a networking architecture where a central software *controller* can dynamically change how network switches forward packets by monitoring the traffic. Switches can be connected to hosts and to other switches via bidirectional channels that may reorder packets. Each switch has a *flow table*, that is a collection of guarded forwarding rules to determine the route of incoming packets. Whenever a switch receives a packet, it checks if one of the flow table rules applies. If no rule applies, the switch sends a message to the controller via a dedicated link,

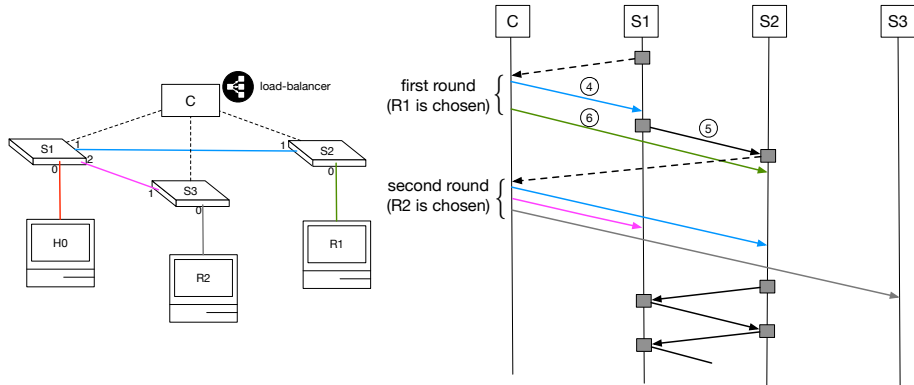


Fig. 1. Example SDN load-balancer. On the left: structure of the SDN. On the right: messages exchanged in a possible execution of a naive controller program. Coloured arrows stand for control messages to switches, indicating which flow rule to install (colours specify the link to be used for the forwarding). Grey boxes and arrows among them represent packet forwardings. Dashed arrows indicate messages to the controller.

and the packet is buffered until instructions arrive. Depending on its policy, the controller instructs the switch, and possibly other switches in the network, on how to update their flow tables. Such control messages between the controller and the switches can be processed in arbitrary order.

We now show how a simple load-balancer can be implemented in SDN (example taken from [12]) and how potential bugs can easily arise due to the concurrent behavior and asynchrony of message passing. Suppose we want to balance the traffic to a server by using two replicas R1 and R2 to which the controller alternates the traffic in a round-robin fashion. The structure of the SDN is shown in Fig. 1, on the left: H0 is any host that wants to communicate with the server and S1, S2 and S3 are switches (numbers on endpoints stand for port numbers).

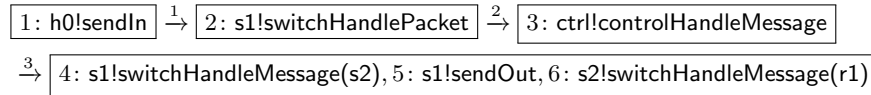
Even in this simple network, an incorrect implementation of the controller can lead to serious problems. In Fig. 1, on the right, we show an execution of a naive controller, which simply instructs switches to forward packets along the shortest path to the chosen replica. This implementation ignores the potential concurrency in actions taken by switches and controller, leading to a forwarding loop between S1 and S2. In the first round, when S1 queries the controller, R1 is chosen. The figure shows S1 forwarding the packet to S2 before the end of the first round, i.e., before a rule is installed on S2 (green arrow). This causes S2 to query the controller, which triggers the second round in which the controller chooses R2. Thus, it sends instructions to install rules on S2, S1 and S3 to forward the packet to S1, S3 and R2, resp. When the controller rules arrive at S1, it will have two contradictory instructions, telling to forward the packet either to S2 or to S3. In the former, the loop at the bottom of the figure occurs. This issue can be avoided if the implementation uses barriers –the controller will then guarantee that S2 receives and processes control messages before taking any other action.

2.2 Actor-based modeling of SDN networks

We now explain how we can automatically detect the above problem using actors and model checking. We use the object-oriented actor language ABS [1, 14], where each actor type is specified as a class, consisting of a set of fields and methods. Actors are instances of actor classes. For instance, the instructions: `Controller ctrl = new Controller(); Switch s1 = new Switch("S1",ctrl); Host h0 = new Host("H0",s1,0);` create three actors: a controller `ctrl`; a switch `s1` with name "S1" and a reference to `ctrl`; a host `h0`, with name "H0", connected to the switch `s1` via the port 0. The SDN in Fig. 1 can be modeled using one actor per component (additional data structures for network links will be shown later).

The execution model of actors is *asynchronous*. Each actor can be thought of as a processor, with a queue of pending tasks and a local memory. Actors are executed in parallel and, at each actor, one task is *nondeterministically* selected among all the pending ones and executed. The syntax `Fut<type> f=a!m(x)` spawns an asynchronous task `m(x)`, that is added to the queue of pending tasks of `a`, `type` is the type of the data returned by `m` or `Unit` if no data is returned. This task consists in executing the method `m` of `a` with arguments `x`. The variable `f` is a *future variable* [10] that will allow us to check if such task has been completed. *Synchronous* calls are written `a.m(x)`, we omit `a` if the target actor is `this`.

A partial trace of execution of our SDN actor model computed by the model checker is (the code that the tasks below execute will be given in Sec. 3):



Intuitively, a packet sending (`sendIn`) is executed on `h0` (label 1), which causes the packet to be forwarded to the switch `s1` (2), then `s1` sends a control message to the controller (3). Finally, the controller spawns the three tasks in the last state (parameters tell where to forward the packet). When executed, these tasks will produce the messages in Fig. 1 with the same numbers. Their execution order is arbitrary: if it is the one shown in Fig. 1, the execution trace may lead to a state exhibiting a forwarding cycle between `s1` and `s2`. As we will show later, this situation can be easily detected by our model checker via an exploration of a *reduced* execution tree, which avoids equivalent executions (Sec. 4).

The ABS language provides a convenient `await` primitive that will be used to model barriers and to rule out the behavior described above. The instruction `await f?` can be used to synchronize with the termination of the task associated to the future variable `f`, by releasing the processor (so that another task can be scheduled) if the task is not finished. Once the awaited task is finished, the suspended task can resume. The `await` can be used also with boolean conditions `await b?` to suspend the execution of the current active task until condition `b` holds. The formal semantics of the language can be found in the appendix of [5].

3 SDN-Actors: an actor based encoding of SDN programs

We present the concept of *SDN-Actor* in four steps: Sec. 3.1 describes the creation and initialization of the actors according to the topology. Sec. 3.2 provides the encoding of the operations and communication for *Switch* and *Host* actors. Sec. 3.3 proposes the encoding of the controller, and Sec. 3.4 the extension to implement barriers. Altogether, our encoding provides an actor-based semantics foundation of SDN networks that follow the OpenFlow specification [19].

3.1 Network topology

The topology can be given as a relation with two types of links:

- *SHlink*(s, h, o): switch s is connected to host h through the port o
- *SSLink*(s_1, i_1, s_2, i_2): switch s_1 is connected via port i_1 to port i_2 of switch s_2

from which we automatically generate the initial configuration as follows.

Definition 1 (initial configuration). *Let S and H be, respectively, the set of different switch and host identifiers available in the link relations that define the network topology. The initial configuration (method *main*) is defined as:*

- We create a controller actor `Controller ctrl=new Controller()`
- For each $sid \in S$, we create an actor `Switch s=new Switch(sid,ctrl)`
- For each $hid \in H$, we create an actor `Host h=new Host(hid,s,o)` where s is the reference to the switch actor, o the port identifier, that hid is connected to.
- The data structures `srefs` and `hrefs` store, resp., the relations between identifier in the topology and reference in the program, for all switches in S and hosts in H .
- The data structure `ntw` contains the link relations in the network topology.
- The synchronous call `ctrl.addConfig(srefs,hrefs,ntw)` initializes in the controller the topology relations and the references to switches and hosts s.t. the controller can send control messages to redirect the traffic to the involved links.

Example 1. By applying Def. 1 to the topology in Fig. 1, given as the relation: *SHlink*($S1, H0, 0$), *SHlink*($S2, R1, 0$), *SHlink*($S3, R2, 0$), *SSLink*($S1, 1, S2, 1$), *SSLink*($S1, 2, S3, 1$), we obtain the following initial configuration which constitutes the *main* method from which the execution starts:

```

1 main() { Controller ctrl = new Controller(); Switch s1 = new Switch("S1",ctrl);
2       Switch s2 = new Switch("S2",ctrl); Switch s3 = new Switch("S3",ctrl);
3       Host h0 = new Host("H0",s1,0); Host r1 = new Host("R1",s2,0);
4       Host r2 = new Host("R2",s3,0);
5       Map<SwitchId,Switch> srefs = {"S1":s1, "S2":s2, "S3":s3};
6       Map<HostId,Host> hrefs = {"H0":h0, "R1":r1, "R2":r2};
7       List<Link> ntw = [SHLink("S1","H0",0), SSLink("S1",1,"S2",1),...];
8       ctrl.addConfig(srefs,hrefs,ntw); }
```

The data structures `srefs` and `hrefs` are implemented using maps, and the network `ntw` as a heterogeneous list. The use of data structures is nevertheless orthogonal to the encoding as actors. We just assume standard functions to create, initialize, access them (like getters, put, lookup, etc.) that will appear in italics in the code.

```

9  type SwitchId=... type HostId=... type PortId=... type PacketId=...
10 type PacketH=... type Packet=... type Action=... type Link=...
11 type MatchF=(PacketH,PortId);

12 class Host(HostId hid, Switch s, PortId o) {
13   Unit sendIn(Packet p){ s!switchHandlePacket(p,o);}
14   Unit hostHandlePacket(Packet p){ /* output packet */}
15 }
16 class Switch(SwitchId sid, Controller ctrl) {
17   Map<MatchF,Action> flowT={};
18   Map<PacketId,(Packet,PortId)> buffer={};
19   Unit switchHandlePacket(Packet p, PortId o){
20     Action l=lookup(flowT,(getHeader(p),o));
21     if (isSwitch(l)) getSwitch(l)!switchHandlePacket(p,getPort(l));
22     else if (isHost(l)) getHost(l)!hostHandlePacket(p);
23     else { buffer=put(buffer,getId(p),(p,o));
24           ctrl!controlHandleMessage(sid,o,getId(p),getHeader(p)); } }
25   Unit sendOut(PacketId pi){
26     Packet p; PortId o; (p,o)=lookup(buffer,pi);
27     Action l=lookup(flowT,(getHeader(p),o));
28     if (isSwitch(l)) getSwitch(l)!switchHandlePacket(p,getPort(l));
29     else if (isHost(l)) getHost(l)!hostHandlePacket(p);
30     /* else packet is dropped */}
31   Unit switchHandleMessage(MatchF m, Action a){ flowT=put(flowT,m,a);}
32 }

```

Fig. 2. Type declarations (top) and actor-based host and switch classes (bottom)

3.2 The switch and host classes

Fig. 2 presents the actor-based Switch and Host classes. We include at the top some **type** declarations that are assumed and must be implemented (such as identifiers, packets and their headers, etc.). There are two main data structures that are implemented in more detail to make explicit the information they contain:

- the *buffer* at Line 18 (L18 for short) is a *map* that must contain pairs of packet and input port indexed by their `PacketId`.
- the flow table `flowT` (L17) is implemented as a *map* indexed by the so-called *match field* [19] represented by type `MatchF` in Fig. 2. The match field is composed by information stored in the header of a `Packet` (retrieved by function `getHeader`) and the input port. For a given matching, the flow table contains the `Action` the switch has to perform upon the reception of the `Packet`. An action `l` can be of three types: i) send the packet to a host `h`, ii) send the packet to the port `o` of a switch `s`, iii) drop the packet. Given an action `l`, function `isSwitch` resp. `isHost` succeeds if the action is of type ii) resp. i), and functions `getSwitch`, `getHost` and `getPort` return the `s`, `h` and `o` resp. The full implementation must allow duplicate entries (non-deterministically

selected), and the use of wildcards in the match fields, but these aspects are unrelated to the encoding of SDN actors, and skipped for simplicity.

Upon creation, hosts receive their identifier and a reference to the switch and the port identifier they are connected to (defined as class parameters that are initialized at the actor creation). Their method `sendIn` is used to send a packet to the switch, and method `hostHandlePacket` to receive a packet from the switch. Switches receive upon creation their identifier and a reference to the controller. They have as additional fields: (a) the flow table `flowT` (as described above) in which they store the actions to take upon receiving each kind of package, and (b) a buffer in which they store packets that are waiting for a response from the controller. Switches can perform three operations: (1) `switchHandlePacket` receives a packet, looks up in the flow table the action to be made L20, and, if there is an entry for the packet in the table, it asynchronously makes the corresponding action (either send it to a host L22 or to a switch L21). Otherwise, it sends a `controlHandleMessage` request and puts the packet and input port in the buffer (L23 and L24) until it can be handled later upon receipt of a `sendOut`; (2) `sendOut` receives a packet identifier that corresponds to a waiting packet, retrieves it from the buffer (L26), looks up the action `l` to be performed in the flow table, and makes the corresponding asynchronous call (as in `switchHandlePacket`); (3) `switchHandleMessage` corresponds to a message received from the controller with an instruction to update the flow table. Other switch operations like *forward packet*, that is similar to `sendOut` but directly tells the switch the action to be performed, or *flood*, that sends a packet through all ports except the input port, can be encoded similarly and are used in the experiments in Sec. 5.

Example 2. In `main`, after L8, we add `h0!sendIn(p)`, where `p` is a packet to be sent to the IP address of the replica servers (the information on the destination is part of the packet header). This is the only asynchronous task that `main` spawns. Its execution in turn spawns a new task `s1!switchHandlePacket(p,0)` at L13, that does not find an entry in `flowT` at L20 and spawns a `controlHandleMessage` task on the controller at L24, whose code is presented in the next section.

3.3 The controller

After creating the controller actor, the method `addConfig` is invoked synchronously to initialize the references to switches and hosts and set up the initial network topology (see L8). A simple controller is presented in Fig. 3, removing the blue lines 35, 36, 41, 44, 46, 48, 49 which provide the implementation of barriers. When a switch asynchronously invokes `controlHandleMessage`, the controller applies the current policy—`applyPolicy` must be implemented for each different type of controller. The implementation of the policy typically requires the definition of new data structures in the controller to store additional information (see Sec. 5). When applying the policy, we obtain a list of switch identifiers and corresponding actions to be applied to them. The while loop at L42 in `controlHandleMessage` asynchronously invokes `switchHandleMessage` at L45 on each of the switches in

```

33 class Controller() {
34   Map<SwitchId,Switch> srefs={}; Map<HostId,Host> href={}; List<Link> ntw=[];
35   Map<SwitchId,List<Fut<Unit>>> barrierMap={};
36   Set<SwitchId> barrierOn = ∅;
37   Unit addConfig(Map<SwitchId,Switch> sr, Map<HostId,Host> hr, List<Link> n){
38     /* references to switches and hosts and network topology initialized */
39   Unit controlHandleMessage(SwitchId sid, PortId o, PacketId p, PacketH h){
40     List<(SwitchId,MatchF,Action)> l=applyPolicy(sid,o,h);
41     List<SwitchId> ls = [];
42     while (not(isEmpty(l))) {
43       SwitchId s1; Action a1; MatchF m1; (s1,m1,a1)=head(l);
44       barrierWait(s1);
45       Fut<Unit> f=lookup(srefs,s1)!switchHandleMessage(m1,a1);
46       barrierMap=put.Add(barrierMap,s1,f); ls = add(ls,s1);
47       l=tail(l);}
48     while (not(isEmpty(ls))) {barrierRequest(head(ls)); ls=tail(ls);}
49     barrierWait(sid);
50     lookup(srefs,sid)!sendOut(p);
51   }
52   List<(SwitchId,MatchF,Action)> applyPolicy(SwitchId sid, PortId o, PacketH h) {
53     /* implementation of specific policy */
54   }

```

Fig. 3. Controller class w/o barriers in black (w/ barriers extended in blue)

the list, and passes as parameter the corresponding action to be applied for the given match entry. Finally, it notifies at L50 the switch from which the packet came that the packet can already be sent out. More sophisticated controllers that build upon this encoding are described in Sec. 5.

Example 3. In the example, `applyPolicy` corresponds to the load-balancer described in Sec. 2, which directs external requests to a chosen replica in a round-robin fashion. For the call `applyPolicy(s1,0,h)`, it chooses `r1` and thus, it returns in L40 two actions: $(s1 \rightarrow s2)$, $(s2 \rightarrow r1)$, i.e., one action to install in `s1` the rule to send the packet to `s2`, and the second to install in `s2` the rule to send it to `r1`. For simplicity, we assume that the Action just contains the location to which the packet has to be sent (without including the port). The while loop thus spawns two asynchronous calls, `s1!switchHandleMessage(m1,s2)` and `s2!switchHandleMessage(m1,r1)`. Besides, it sends a `s1!sendOut(p)` in L50. Several problems may arise in this implementation. One problem, as explained in Sec. 2, is that the packet is sent from `s1` to `s2` before the control message is processed by `s2`. Then, `s2` gets the packet and it does not find any matching rule, thus it sends a `controlHandleMessage` to the controller. Applying the above policy, the controller chooses now as replica `r2` and returns the actions: $(s2 \rightarrow s1)$, $(s1 \rightarrow s3)$, $(s3 \rightarrow r2)$, i.e., the packet should be sent to `r2` by first sending from `s2` to `s1` (first action), and so on. This might create the circularity depicted in Fig. 1.


```

55 Unit barrierWait (SwitchId sid){
56     await not(contains(barrierOn,sid));
57 }
58 Unit barrierRequest (SwitchId sid){
59     barrierOn=add(barrierOn,sid);
60     List<Fut<Unit>> futSid=lookup(barrierMap,sid);
61     while (not(isEmpty(futSid)) {
62         Fut<Unit> fi=head(futSid);
63         await fi?;
64         futSid=tail(futSid); }
65     barrierOn=delete(barrierOn,sid);
66 }

```

Fig. 4. Implementation of barriers (part of class Controller)

The following theorem ensures the soundness of our modeling. Essentially we guarantee that, for a given SDN network that follows the OpenFlow specification, any execution in the network has an equivalent execution in the SDN-Actor model. An execution in the network is characterized by the messages in the queues of the switches, hosts, and controller and the state of their data structures. An *equivalent* execution in the model will thus ensure the same messages in the actors queues and the same state in actors data structures.

Theorem 1 (soundness). *Given a SDN network N , consider its SDN-Actor model N^a with an initial configuration *main* obtained by Def. 1, and the **Switch**, **Host** and **Controller** classes in Figs. 2 and 3. Then, for each execution in N , there exists an equivalent execution trace in N^a using the semantics in the appendix of [5].*

3.4 Barriers

Barriers [19] have been designed to force a switch to handle previous control messages, and thus avoid problems such as the one described above.

Definition 2 (OF barrier). *Following OpenFlow [19], upon receipt of a barrier message, the switch must finish processing all previously-received controller messages, before executing any messages beyond the barrier message.*

Figs. 3 and 4 show our modeling that intuitively consists in the controller not sending further messages to any switch on which a barrier has been activated, until this switch acknowledges that all previous control messages have been already processed. The main points in the implementation are: (1) the controller creates a future variable at L45 for every asynchronous task that it posts on all switches; (2) it keeps in `barrierMap` the list of future variables (not yet acknowledged) for each of the switches (`putAdd` in L46 adds the future variable to the list indexed by `s1` in the map); (3) it keeps in `barrierOn` the set of switches with

an active barrier; (4) a barrier on a switch consists in the controller awaiting on the list of future variables that the switch needs to acknowledge to ensure that its control messages have already been processed (method `barrierRequest`); (5) all control messages must be now preceded by an invocation to `barrierWait` that checks if the corresponding switch has an active barrier, L56. This is because while suspended in a barrier, the controller can start to process another `controlHandleMessage` unrelated to the previous one, but which affects (some of) the same switches for which a barrier was set. So, we cannot send messages to them until their barriers are set to off. Note that this is not a restriction on the type of controllers we model, but rather an effective way to encode barriers using actors and `await` instructions that ensures the behaviour of OpenFlow barriers.

Theorem 2 (soundness of barriers). *Methods `barrierRequest` and `barrierWait` provide a sound encoding of the OF barrier messages in Def. 2.*

4 DPOR-based model checking of SDN-Actors

Model checking tools deal with a combinatorial blow-up of the state space (a.k.a. the state space problem) that must be faced to solve real-world problems. As for model checking SDN programs, the problem is exacerbated because of the concurrent and distributed nature of networks: all network components (switches, hosts, controllers) are distributed nodes that run in parallel and whose concurrent tasks can interact. As we have seen, a controller message sent from a switch can change the state of another switch, and affect the route of an incoming packet. Thus, a model checker needs to explore all possible reorderings of *dependent* tasks (i.e., those whose execution might interfere with each other) leading to a huge number of possible executions even for networks with few nodes and few packets. Besides, the space is unbounded because hosts may generate unboundedly many packets that could be simultaneously traversing the network.

There are two *incomplete* approaches to handle unbounded inputs: one is to impose a bound k on the number of packets of each type (as e.g. in [8]) and the other one is to use abstraction (as e.g. in [18]). In the former, the search space is exhausted for the considered input, but there could be bugs that only show up when more packets are considered. In the latter, abstraction requires to lose information and bugs may only show up when the omitted information is considered. Therefore, the sources of incompleteness are different, and the approaches can complement each other. Our implementation uses the former, e.g., in Ex. 2 we have considered one packet (limit $k = 1$). The rest of the section presents the key features of our approach assuming such a k bound.

4.1 DPOR-based model checking in actors

DPOR [13] is able to dynamically identify and avoid the exploration of redundant executions and prune the search space exponentially. It is based on the idea of initially exploring an arbitrary interleaving of the various concurrent tasks,

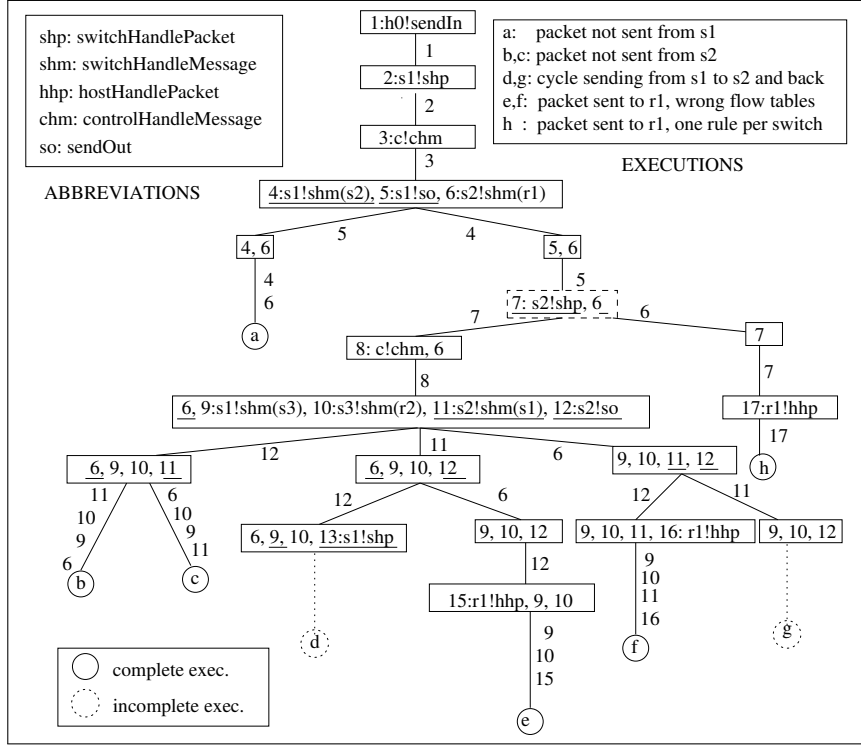


Fig. 5. Search tree for running example w/o barriers (rightmost branch w/ barriers)

and *dynamically* tracking dependent interactions between them to identify backtracking points where alternative paths in the state space need to be explored. Two tasks are *independent* when changing their order of execution will not affect their combined effect. When DPOR is applied to actor systems, there are inherent reductions [23] because: (i) we can atomically execute each task (without re-orderings) until a return or an **await** instruction are found, because concurrency is non-preemptive and the active task cannot be interrupted. This avoids having to consider the reorderings at the level of instructions (as one must do in thread-based concurrency), and allows us to work at the level of tasks. (ii) Besides that, two tasks can have a dependency only if they belong to the same actor. This is because only the actor itself can modify its private memory.

Example 4. Fig. 5 shows the search tree computed by DPOR for our SDN-Actor program without barriers. It has no redundancy, i.e., each execution corresponds to a different behavior on the packet arrival and/or the actions installed in the flow tables (see top right descriptions). At each node (i.e., state), we show the available tasks. A task is given an identifier the first time it appears, and afterwards only its identifier is shown. Method names are abbreviated as shown in the top left, and parameters are omitted except in tasks executing `switchHandleMessage`, for which we only include the switch identifier that is part

of the `Action` to be installed. For instance, `4:s1!shm(s2)` is a task with identifier 4, that will execute method `switchHandleMessage` on `s1` and will add to its flow table the information that the packet must be sent to `s2`. Labels on the edges show the task(s) that have been executed. At each state, we underline the tasks which have an interacting dependency. The execution starts by executing the `main` method in Ex. 1 with the instruction `sendIn` added in Ex. 2 which appears in the root. The next two steps have one task available, but in the fourth state we have tasks 4 and 5, belonging to the same actor, whose reordering needs to be considered (leading to branching), while 6 is independent of them. Out of the 8 branches of the tree, only the rightmost execution (h) corresponds to the correct behavior in which the packet is actually sent to `r1` and the actions are installed in the flow tables in the expected order. In execution (a) the packet does not arrive at the destination because the `sendOut` is executed before the action has been installed. Executions (d) and (g) correspond to the cycle described in Sec. 2, each of them with different installations of actions.

Importantly, we do not need specific optimizations to use the DPOR algorithm in [3] to model check SDN-Actors. The use of `await` (is already covered by DPOR and) does not require any change either and, as expected, the search tree for the implementation with barriers only contains branch (h). The difference arises from task 3 in the tree: in the presence of barriers, this leads to a state in which we have the asynchronous calls 4 and 6 and task 3 suspended at the `await` in L63 (awaiting first the termination of 4 and then that of 6). Therefore, the dependent tasks 4 and 5 will not coexist because 5 is not spawned until 4 and 6 terminate.

4.2 Entry-level and context-sensitive independence

When two tasks that belong to the same actor are found, in the context of DPOR techniques independence is commonly over-approximated by requiring that actor fields accessed by one task are not modified by the other. In our model, all tasks posted on a given switch access its flow table, namely `sendOut` and `switchHandlePacket` read it and `switchHandleMessage` writes it. Thus, in principle, any task executing `switchHandleMessage` is considered dependent on the other two. This explains the tasks underlinings in the figure and the branching in the tree. When there are multiple packets traversing the network it is usually the case that the different packets access distinct entries in the flow table. This results in the inaccurate detection of many dependencies hence producing redundant executions. Using Context-sensitive DPOR [3], we alleviate this state explosion:

1. *Entry-level independence.* We adopt a finer-grained notion of *entry-level independence* for which an access to entry i is independent from an access to j if $i \neq j$. This aspect is not visible when considering a single packet as in the example, as all accesses to the flow table refer to the same entry. However, by simply adding another packet to the erroneous program, the state explosion is huge and the system times out if entry-level independence is not implemented, while it computes 92 executions (exploring 761 states) with entry-level independence.

2. *Context-sensitiveness.* Even when two tasks t and p access the same entry, Context-sensitive DPOR introduces some further checks that execute the considered tasks from the current state S in the two orders $t \cdot p$ and $p \cdot t$. If they lead to the same state, one of the derivations is pruned and further exploration from it is thus avoided. For instance, executing two consecutive `switchHandleMessage` on the same entry might lead to the same state if the flow table may contain duplicate entries, as our implementation allows.

4.3 Comparison of DPOR reductions with related work

Other model checkers for SDN programs have used DPOR-based algorithms before [8, 18]. According to the experiments in the NICE tool, DPOR only achieves a 20% reduction of the search space because even the finest granularity does not distinguish independent flows. The reason for this modest reduction might be that it does not take advantage of the inherent independence of the code executed by the distributed elements of the network (switches, host, clients), nor to the fact that barriers allow removing dependencies, as our actor-based SDN model does. In Kuai [18], a number of optimizations are defined to take advantage of these aspects. Such optimizations must be (1) identified and formalized in the semantics, (2) proven correct and, (3) implemented in the model checker. Instead, due to our formalization using actors, the optimizations are already implicit in the model and handled by the model checker without requiring any extension. Another main difference with Kuai is that they make two important simplifications to the kind of SDNs they can handle: (i) they assume a simplified model of switches in which a switch gets suspended (i.e., does not process further packets nor controller messages) while awaiting a controller request. The error showed in Ex. 1 would thus not be captured. We do not make any simplification and thus a switch can start to process a new packet while awaiting the controller and can also receive other controller actions (triggered by other switches). (ii) It works on a class of SDNs in which the size of the controller queue is one. Therefore, it will not capture potential errors that arise due to the reordering of messages by the controller. In contrast, our model checker works on the general model of SDN networks.

5 Checking SDN properties in case studies

We have built the extension for property checking on top of SYCO [4], a system that implements context-sensitive DPOR exploration. To evaluate our approach, we have implemented a series of standard SDN benchmarks used in previous work [6, 12, 18]. In order to check property P we add to the controller a new method called `error_message` and encode P as a Boolean function F_p using the programming language itself. Then, in all places where the property has to hold, we add an `if` statement checking the negation of F_p and if it holds we call asynchronously to `error_message` on the controller. Then property holds for the given input if and only if there is no trace in the execution tree including a call to `error_message`.

Name	Switch x Host x Packet	Execs	States	Time
LB	3x3x1/3x4x2	8/92	64/761	15/263
LBB	3x4x2/3x7x5/3x10x8/3x12x10	3/21/171/683	48/482/3996/16028	13/212/3542/22941
SSHE	2x2x(1ssh/1oth/2each/2cor)	9/21/2648/1201	56/135/24116/9406	14/37/12308/3276
SSHB	2x2x2/2x2x3	27/2013	318/23643	119/13261
MI	1x5x(8/10/11)	122/753/1506	2710/17613/35870	1003/11800/34894
MIB	1x5x(8/10/11)	138/831/1653	3215/20640/41512	1668/18591/53349
LE	3x3x(2/5)/6x3x2	10/46/40	178/1269/1239	59/467/649
	6x3x5/9x2x2	132/944	5765/12339	3798/12230

Table 1. Experimental evaluation

Our goal is on the one hand to show the versatility of our approach to check properties that are handled using different approaches in the literature (e.g., programming errors in the controller as in [6], safety policy violations as in [6,18], or loop detection as in [12]). And, on the other hand, to show that we are able to handle networks at least as large as (and sometimes larger than) in related systems [18], but without requiring simplifications to the SDN models, nor extensions for DPOR reduction, and in spite of using a non-distributed model checker. We should note that a precise comparison of figures is not possible due to the differences described in Sec. 4.3 and the use of different implementations of controllers. Our system can be tried online at <http://costa.ls.fi.upm.es/syco> using the option CS-DPOR, where the benchmarks can be also found in the folder FM18.

Table 1 shows a summary of the experimental results. Times are obtained on an Intel Core i7 at 3.4Ghz with 8GB of RAM (Linux Kernel 3.2). For each benchmark, we show in the second column the number of switches, hosts and packets, **Execs** corresponds to the number of different executions (i.e., branches in the search tree), **States** to the number of nodes in the search tree, and **Time** is the time taken by the analysis in ms. Although entry-level independence can be proved automatically, this is not yet implemented in SYCO and we have used annotations to declare it. As an example, in method `switchHandleMsg`, the annotation: `[indep(switchHandlePacket(pin,pkt),!matchHeaderAndPort(getHeader(pkt),pin,m))]` states that tasks executing `switchHandleMessage(m,a)` are independent of those executing `switchHandlePacket(pin,pkt)` if the match field of the message does not match the header and the input port of the packet (the condition is checked by the auxiliary function `matchHeaderAndPort`).

Controller with load balancer [12] (LB/LBB). This corresponds to the controller of [12], similar to our running example. It performs stateless load balancing among a set of replica identified by a virtual IP (VIP) address. When receiving packets destined to a VIP, the controller selects a particular host and installs flow rules along the entire path. For a buggy controller without barriers (LB) and a network with 3 switches and 3 hosts, we detect that there is a forwarding loop (i.e., that a packet reaches a switch more than once) in 15ms. For this, we have added to the switches a field to store the packet identifiers that they have already received, and when the same packet reaches it, it sends an error message, which is observable from the final state. When we add a second packet with the same header and another host, as expected, the number

of dependencies increases and, many reorderings need to be tried, leading to 92 different executions and 761 states. Once we check the correct version with barriers (LBB), we are able to scale up to 12 hosts and 10 packets. As it can be observed, for the largest network, 16028 states are explored and in all cases we verify that the traffic is balanced. The experiments in [12] do not specify the time to detect the bug for this controller (they only mentioned that their analysis finishes in less than 32s in the vast majority of cases). Nevertheless, the underlying techniques to find the bugs are unrelated (see Sec. 6), and thus time comparison is not meaningful.

SSH controller [18] (SSHE/SSHB). This is based on a controller that dynamically modifies the behaviors of the switches as follows: it can update the switches with a rule that states that no SSH packets are forwarded, and another that states that all non-SSH packets are forwarded. We have two versions of the SSH controller. In the row SSHE, the first three evaluations correspond to an erroneous SSH controller that installs the rule to forward packets and the rule to drop SSH packets with the same priority, and thus the safety policy can be violated. As in [18], we evaluate a network with 2 switches and 2 hosts. As for packets, we write `1ssh`, `1other`, and `2each` to indicate that we send one SSH packet, one non-SSH packet and one of each type. We detect the error by checking in the switch if two contradictory drop and forward packet actions are received for the same entry. The results that we obtain for 1 packet are in the same order of magnitude as [18]: they produce 13 executions, while we produce 9 or 21, depending on the type of packet. Analysis times are also similar: 0.1s in their case versus 0.014s or 0.037s in our case. This is as expected because there is almost no redundancy using plain DPOR, thus no need for our entry-independence or context-sensitiveness. When we add more packets, the number of dependencies grows exponentially. This is because the controller receives 2 requests from the 2 messages, and sends dependent control messages to all switches. Therefore, all reorderings must be tried and the state explosion is huge. The last evaluation `2cor` corresponds to the correct SSH controller for which we achieve a notable improvement as we have now less tasks that match the same entry (as priority is different). The row SHHB is a correct implementation with barriers that reduces the number of executions for 2 packets notably because it guarantees that forward rules are installed and thus switches will not send further requests.

Firewall with migration [6] (MI/MIB). MI is the implementation of a firewall that supports migration of trusted hosts. A host is trusted if it either sent/received (on some switch) a message through/from port 1. Thus, when a trusted host migrates to a new switch, the controller will remember it was trusted before and will allow communication from either port. For the same network `1x5` as [6], we can scale the number of packets up to 11 packets that actually modify the data base for trusted hosts. We can keep on adding more packets if those do not affect the shared data base. In MIB, we introduce the same bug in the controller as [6], which forgets to check if trusted on events from port 2. We detect the error by checking in the final state of the derivations that a packet

arrives to a host that is not in the trusted data base. The scalability of MI and MIB are rather similar. Both [6] and us find the bug in a negligible time.

Network authentication with learning [6, 18] (LE). This implements a composition of a learning switch with authentication in [6]. Also, [18] evaluates a MAC learning controller but using a different implementation. LE implements a controller with barriers for which we can verify that the packet flows satisfy the intended policy and that the flow tables are consistent. We have considered configurations of 3x3, 6x3 and 9x2. When compared to [18], we handle similar sizes for networks but we explore less **States** in less **Time**. We note that this might be due to different implementations of the controller and the differences pointed out in Sec. 4.3.

6 Conclusions and Related Work

We have proposed an actor-based framework to model and verify SDN programs. A unique feature of our approach is that we can use existing advanced verification algorithms without requiring any specific extension to handle SDN features. The last years have witnessed the development of many static and dynamic techniques for verification that are closely related to our approach. Using static approaches, one has the main advantage that, when the property can be proved, it is ensured for any possible execution, while using dynamic analysis only guarantees the property for the considered inputs. As a counterpart, in order to cover all possible behaviors, static analysis needs to perform abstraction, that can give a don't-know answer, and, possibly, false positives. In [6], the work on Horn-based verification is lifted to the SDN programming paradigm, but excluding barriers. Using this kind of verification, one can prove safety invariants on the program. Using our framework, we can furthermore check liveness invariants (e.g., loop detection) by inspecting the traces computed by the model checker. In [20], a particular type of attacks in the context of SDN networks has been modeled in Maude using the so-called hierachically structured composite actor systems described in [11]. This work does not provide a general model for SDN networks and, besides, barriers are not considered. On the other hand, it applies a statistical model checker, which requires to have a given scheduler for the messages. Such scheduler determines the exact order in which messages are handled while our framework captures all possible behaviours. Hence, both their aim and their SDN model are radically different from ours. As regards dynamic techniques, our work is mostly related to the model checkers NICE and Kuai for SDN programs, which have been compared in detail in Sec. 4.3. Our approach could be adapted to apply abstractions that bound the size of buffers [18] and to consider environment messages [22]. The approach of [12, 15] is fundamentally different from ours because it is based on analyzing dynamically given snapshots of the network from real executions. Instead, our approach tries to find programming errors by inspecting only the SDN program and considering all possible execution traces, thus enabling verification at system design time.

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