## Enhancing network diagnosis with reflection in Prolog

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## 1 Introduction

The use of formal methods has helped transform network diagnosis, alongside software-defined networking (SDN) [28] and programmable networks [6], from a black art into a more disciplined practice [22]: Trial-and-error guesswork with distributed protocols has been replaced by systematic software engineering [29], rudimentary troubleshooting methods of the past, such as ping and traceroute, have been supplemented, if not entirely overtaken, by formal verification and synthesis [5,17,18,14,16,30,33,1,9]. A notable example is lightning fast reachability analysis tools deployed in today's hyper-scale datacenters [16,14,24]. Indeed, with carefully crafted network representations and highly effective reasoning engines, formal methods-based diagnosis flourished, thanks to the rise of the clean-slate networks — over-provisioned datacenters in particular -—- that assume well-defined control software and well-measured workloads.

But networks in the wild remain mundane. Consider the public Internet, enterprise networks, or smart-spaces; they are all evolving with unanticipated requirements while operating continuously and are not stand-alone or wellplanned. The clean-slate diagnosis alone is inadequate in this context: A reachability checker outperforms humans by orders of magnitudes in catching an anomaly (property violation) in a network's forwarding states, but it is still up to the human expert to explain how the network procedure (protocols or SDN software) actually produces that anomaly. Similarly, state-of-art tools scale to hyper-scale networks with millions of nodes, but only a human expert can direct the course of diagnosis to changing circumstances, new concerns, and past results — a specific context, so to speak — discriminating between important and less relevant cases so the diagnosis retains a sharp focus. One key missing in tools but achieved by humans is the ability to reflect [26] — the capability to reason not only about networks but also about the reasoning process itself.

Can we, then, bring in some form of reflection as a means to more effective network diagnosis? Can we go beyond "what properties a network state hold" and reflect on the increasingly complex procedures [7,9,11] that manipulate those states, explaining why and how a certain (unintended) state is encountered [10,7]? While today's diagnosis are performed in isolation and are optimized for fixed metrics such as maximum coverage, can we make a more active use of a problem's context, by using that extra knowledge to better frame and scope the diagnosis and reflecting on the diagnosis (reasoning) process itself, enable diagnosis formulation and test generation that directly reflect the context [32,4,34]? These are just a few possibilities, of course. This extended abstract presents an initial study of reflective network diagnosis, discussing its effectiveness and feasibility.

## 2 Ongoing work

We identify two reflective use cases: the first complements current diagnosis that focuses on *what* the network states are (detecting anomalies). We instead reason about *how* and *why* the network arrives at an anomaly by reflecting on the state-manipulating procedures. The second case seeks to go beyond context-free tools developed in isolation. By developing an explicit account of context — such as a motivating concern or a related operation that do not easily reflector into traditional problem formulation — within diagnosis, and seek to bring into the diagnosis a sharper focus.

Non-monotonic diagnosis of network procedures Network verification [9,35,30], the most advanced tool today, reasons about network forwarding states (data), but does not reflect on the procedures — protocols or software (data-manipulation procedures) — that produce the states. Those state manipulation programs in real networks, however, are interesting by themselves. A notable example is the so called oscillation problem of Internet routing [12,13], in which the path computation of a set of uncoordinated routers (e.g., with conflicting path preferences) fails to converge. Figure1 (left) depicts a subtle oscillation scenario reported in [23]. Built atop this example, we propose reflective diagnosis Case I: Reflect on how a network arrives at certain state, even when the procedure (e.g., protocols, control software) generating the states is non-deterministic or non-terminating.



Fig. 1: (left) iBGP oscillation in AS1: reflectors Ra and Rd make route decisions based on IGP path cost (in gray) and MED (in parenthesis). (right)  $c_1$  can send packets to  $s_2$  and bypass the filter at 3.

Context-aware debugging of network states A second limitation we seek to address is that existing diagnosis solutions often assume a well-defined problem in a vacuum, but networks are "mundane", and real problems almost always arise from a specific context. To see the subtlety of "context", consider the simple network in Figure 1 (right). A network of 4 nodes (routers) is carrying traffic between clients  $c_1, c_2$  and servers  $s_1, s_2$  that are divided into 4 flows (group of packets), as shown in the table (so the first class  $h_1$  are those from  $c_1$  (source) to  $\mathbf{s}_1$ ). The arrows denote the next-hop of the forwarding action, and the  $\mathbf{h}_x \to \mathbf{h}_y$ label of a node says the header rewrite (of either a packet's source or destination field). So in addition to the usual packet forwarding (to the next-hop), node 1 turns flow  $h_1$  into  $h_2$ . Node 3 also drops any packet in  $h_4$ , thus acting as a firewall blocking  $h_4$ . Suppose the rewrites at 1,4 are recently introduced, the operator wants to know the impact of them on the firewall 3. Such context does two seemingly innocent rewrites collectively viloate a firewall? — does not easily translate to well-supported diagnosis problems today. For example, reachability diagnosis typically checks for certain (by default all) packets entering a network at certain entry points. What are the right (relevant) flows and entries to test? More generally, we propose reflective diagnosis Case II: Raise contexts to first-class objects in the diagnosis process by (as a first step) using contexts natively in the problem specification and directly in test generation, saving the user from manually refactoring them in.

Implementation We built a prototype of the above reflective cases by enhanced meta-interpreters in prolog [2,3,15]. Our key insight is that reflection [8,26] is a specific form of meta-reasoning: reasoning about another reasoning process which happens to be itself. Reflection thus aligns well with meta-programming, meta-interpreters in particular, where a program treats another program (or itself) as object data, which is well supported in Prolog [20,27,19,21], because it does not distinguish between data and programs like its more conventional counterparts and includes first-class meta-level constructs. In addition, Prolog has a clear procedural reading -—- a sequential execution model — that makes it remarkably suitable for capturing the operational complexities of network procedures (e.g., routing). Based on these observations, we use meta-interpreters as a reflection engine and an injection point for enhancements tailored to the new proposed functions.

All implementations are fully tested on the latest stable version of XSB 5.0 (May 12, 2022) [31], and are publicly available [25]. The # of clauses (in parenthesis) for the two cases is: iBGP (77), data-plane (19); Three enhanced meta-interpreters for iBGP explaination (10), Two data-plane test generations (5 for each). We also implemented a total of 46 utility clauses such as length/2 (for returning the length of a list) to avoid processing external libraries in the meta-interpreter, and additional facilities like pretty\_print to display an explanation.

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