Kleene Algebra Modulo Theories

MICHAEL GREENBERG, Pomona College

RYAN BECKETT, Microsoft Research

1 2 3

4

5

6 7

8

9

10

26

27

28

ERIC CAMPBELL, Cornell University

Kleene algebras with tests (KATs) offer sound, complete, and decidable equational reasoning about regularly structured programs. Interest in KATs has increased greatly since NetKAT demonstrated how well extensions of KATs with domain-specific primitives and extra axioms apply to computer networks. Unfortunately, extending a KAT to a new domain by adding custom primitives, proving its equational theory sound and complete, and coming up with an efficient implementation is still an expert's task.

11 We present a general framework for deriving KATs we call Kleene algebra modulo theories: given primitives 12 and a notion of state, we can automatically derive a corresponding KAT's semantics, prove its equational theory 13 sound and complete with respect to a tracing semantics, use term normalization from the completeness proof 14 to create a decision procedure for equivalence checking. Our framework is based on *pushback*, a generalization 15 of weakest preconditions that specifies how predicates and actions interact. We offer several case studies, 16 showing tracing variants of theories from the literature (bitvectors, NetKAT) along with novel compositional 17 theories (products, temporal logic, and sets). We derive new results over unbounded state, reasoning about monotonically increasing, unbounded natural numbers. We provide an OCaml implementation of both decision 18 19 procedures that closely matches the theory: with only a few declarations, users can automatically compose KATs with complete decision procedures. We offer a fast path to a "minimum viable model" for those wishing 20 to explore KATs formally or in code. 21

²² CCS Concepts: • Software and its engineering \rightarrow Formal language definitions; Frameworks; Formal soft-²³ ware verification; Correctness; Automated static analysis; • Theory of computation \rightarrow Regular languages.

ACM Reference Format:

Michael Greenberg, Ryan Beckett, and Eric Campbell. 2020. Kleene Algebra Modulo Theories. *ACM Trans. Program. Lang. Syst.* 1, 1, Article 1 (January 2020), 47 pages.

1 INTRODUCTION

Kleene algebras with tests (KATs) provide a powerful framework for reasoning about regularly
 structured programs. Modeling simple programs with while loops, KATs can handle a variety
 of analysis tasks [3, 7, 12–14, 41] and typically enjoy sound, complete, and decidable equational
 theories. Interest in KATs has increased recently as they have been applied to the domain of computer
 networks: NetKAT, a language for programming and verifying Software Defined Networks (SDNs),
 was the first remarkably successful extension of KAT [1], followed by many other variations and
 extensions [4, 8, 22, 42, 44, 56].

Considering KAT's success in networks, we believe other domains would benefit from program ming languages where program equivalence is decidable. However, extending a KAT for a particular
 domain remains a challenging task even for experts familiar with KATs and their metatheory. To
 build a custom KAT, experts must craft custom domain primitives, derive a collection of new

Authors' addresses: Michael Greenberg, Pomona College, michael@cs.pomona.edu; Ryan Beckett, Microsoft Research,
 Ryan.Beckett@microsoft.com; Eric Campbell, Cornell University, ehc86@cornell.edu.

- ⁴⁶ © 2020 Copyright held by the owner/author(s).
- 47 0164-0925/2020/1-ART1
- 48 https://doi.org/
- 49

Permission to make digital or hard copies of part or all of this work for personal or classroom use is granted without fee
 provided that copies are not made or distributed for profit or commercial advantage and that copies bear this notice and

the full citation on the first page. Copyrights for third-party components of this work must be honored. For all other uses, contact the owner/author(s).

domain-specific axioms, prove the soundness and completeness of the resulting algebra, and imple-50 ment a decision procedure. For example, NetKAT's theory and implementation was developed over 51 several papers [1, 23, 60], after a long series of papers that resembled, but did not use, the KAT 52 framework [21, 31, 45, 51]. Yet another challenge is that much of the work on KATs applies only to 53 abstract, purely propositional KATs, where the actions and predicates are not governed by a set 54 of domain-specific equations but are left abstract [15, 39, 46, 50]. Propositional KATs have limited 55 applicability for domain-specific reasoning because domain-specific knowledge must be encoded 56 57 manually as additional equational assumptions. In the presence of such equational assumptions, program equivalence becomes undecidable in general [12]. As a result, decision procedures have 58 limited support for reasoning over domain-specific primitives and axioms [12, 37]. 59

We believe domain-specific KATs will find more general application when it becomes possible to 60 cheaply build and experiment with them. Our goal in this paper is to democratize KATs, offering a 61 general framework for automatically deriving sound, complete, and decidable KATs with tracing 62 semantics for client theories. To demonstrate the effectiveness of our approach, we not only repro-63 duce results from the literature (e.g., tracing variants of bit vectors and NetKAT), but we also derive 64 new KATs that go behind the existing, finite-state KATs to KATs using monotonically increasing, 65 unbounded naturals. The proof obligations of our approach are relatively mild and our approach 66 is compositional: a client can compose smaller theories to form larger, more interesting KATs 67 than might be tractable by hand. Our completeness proof corresponds directly to an equivalence 68 decision procedure. Our OCaml implementation allows users to compose a KAT with both decision 69 procedures from small theory specifications. We offer a fast path to a "minimum viable model" for 70 those wishing to explore KATs formally or in code. 71

1.1 What is a KAT?

From a bird's-eye view, a Kleene algebra with tests is a first-order language with loops (the Kleene algebra) and interesting decision making (the tests). Formally, a KAT consists of two parts: a Kleene algebra $\langle 0, 1, +, \cdot, * \rangle$ of "actions" with an embedded Boolean algebra $\langle 0, 1, +, \cdot, \neg \rangle$ of "predicates". KATs capture While programs: the 1 is interpreted as skip, \cdot as sequence, + as branching, and * for iteration. Simply adding opaque actions and predicates gives us a While-like language, where our domain is simply traces of the actions taken. For example, if α and β are predicates and π and ρ are actions, then the KAT term $\alpha \cdot \pi + \neg \alpha \cdot (\beta \cdot \rho)^* \cdot \neg \beta \cdot \pi$ defines a program denoting two kinds of traces: either α holds and we simply run π , or α doesn't hold, and we run ρ until β no longer holds and then run π . i.e., the set of traces of the form $\{\pi, \rho^*\pi\}$. Translating the KAT term into a While program, we write: if α then π else $\{$ while β do $\{ \rho \}; \pi \}$. Moving from a While program to a KAT, consider the following program—a simple loop over two natural-valued variables i and j:

87 88

72 73

74

75

76

77

78

79

80

81

82

83

84

85

86

89 90

91

assume i < 50 while (i < 100) { i := i + 1; j := j + 2 } assert j > 100

To model such a program in KAT, one replaces each concrete test or action with an abstract representation. Let the atomic test α represent the test i < 50, β represent i < 100, and γ represent j > 100; the atomic actions p and q represent the assignments i := i + 1 and j := j + 2, respectively. We can now write the program as the KAT expression $\alpha \cdot (\beta \cdot p \cdot q)^* \cdot \neg \beta \cdot \gamma$. The complete equational theory of KAT makes it possible to reason about program transformations and decide equivalence between KAT terms. For example, KAT's theory can prove that the assertion j > 100 must hold

after running the while loop by proving that the set of traces where this does not hold is empty:

103 104 105

124 125

$$\alpha \cdot (\beta \cdot p \cdot q)^* \cdot \neg \beta \cdot \neg \gamma \equiv 0$$

or that the original loop is equivalent to its unfolding:

$$\alpha \cdot (\beta \cdot p \cdot q)^* \cdot \neg \beta \cdot \gamma \equiv \alpha \cdot (1 + \beta \cdot p \cdot q \cdot (\beta \cdot p \cdot q)^*) \cdot \neg \beta \cdot \gamma$$

KATs are naïvely propositional: the algebra understands nothing of the underlying domain or the 106 semantics of the abstract predicates and actions. For example, the fact that $(j := j + 2 \cdot j > 200) \equiv$ 107 $(j > 198 \cdot j := j + 2)$ does not follow from the KAT axioms and must be added manually to any 108 proof as an equational assumption. Yet the ability to reason about the equivalence of programs in 109 the presence of particular domains is critical for reasoning about real programs and domain-specific 110 languages. To allow for reasoning with respect to a particular domain (e.g., the domain of natural 111 numbers with addition and comparison), one typically must extend KAT with additional axioms 112 that capture the domain-specific behavior [1, 4, 8, 30, 40]. Unfortunately, it remains an expert's 113 task to extend the KAT with new domain-specific axioms, provide new proofs of soundness and 114 completeness, and develop the corresponding implementation. 115

As an example of such a domain-specific KAT, NetKAT showed how packet forwarding in 116 computer networks can be modeled as simple While programs. Devices in a network must drop 117 or permit packets (tests), update packets by modifying their fields (actions), and iteratively pass 118 packets to and from other devices (loops). NetKAT extends KAT with two actions and one predicate: 119 an action to write to packet fields, $f \leftarrow v$, where we write value v to field f of the current packet; 120 an action dup, which records a packet in a history log; and a field matching predicate, f = v, which 121 determines whether the field f of the current packet is set to the value v. Each NetKAT program is 122 denoted as a function from a packet history to a set of packet histories. For example, the program: 123

$$dstIP \leftarrow 192.168.0.1 \cdot dstPort \leftarrow 4747 \cdot dup$$

takes a packet history as input, updates the current packet to have a new destination IP address and 126 port, and then records the current packet state. The original NetKAT paper defines a denotational 127 semantics not just for its primitive parts, but for the various KAT operators; they explicitly restate 128 the KAT equational theory along with custom axioms for the new primitive forms, prove the 129 theory's soundness, and then devise a novel normalization routine to reduce NetKAT to an existing 130 KAT with a known completeness result. Later papers [23, 60] then developed the NetKAT automata 131 theory used to compile NetKAT programs into forwarding tables and to verify networks. NetKAT's 132 power comes at a cost: one must prove metatheorems and develop an implementation-a high 133 barrier to entry for those hoping to apply KAT in their domain. 134

We aim to make it easier to define new KATs. Our theoretical framework and its correspond-135 ing implementation allow for quick and easy composition of sound and complete KATs with 136 normalization-based decision procedures when given arbitrary domain-specific theories. Our 137 framework, which we call Kleene algebras modulo theories (KMT) after the objects it produces, 138 allows us to derive metatheory and implementation for KATs based on a given theory. The KMT 139 framework obviates the need to deeply understand KAT metatheory and implementation for a 140 large class of extensions; a variety of higher-order theories allow language designers to compose 141 new KATs from existing ones, allowing them to rapidly prototype their KAT theories. 142

We offer some cartoons of KMTs here; see Sec. 2 for technical details.

Consider P_{set} (Fig. 1b), a program defined over both naturals and a *set* data structure with two operations: insertion and membership tests. The insertion action insert(x, j) inserts the value of an expression (*j*) into a given set (*x*); the membership test in(x, c) determines whether a constant

147

148	assume i < 50	assume $0 \le j < 4$	i := 0
149	while (i < 100) do	while (i < 10) do	parity := false
150	i := i + 1	i := i + 1	while(true)do
151	j := j + 2	j := (j << 1) + 3	odd[i]:=parity
152	end	if $i < 5$ then	i := i + 1
153	assert j > 100	insert(X,j)	parity:=!parity
154		end	end
155		<pre>assert in(X, 9)</pre>	assert odd[99]
156	(a) P .	(b) P	(c) P
157	(a) I nat	(b) I set	(C) ¹ map
158		Fig. I. Example simple while programs.	

(*c*) is included in a given set (*x*). An axiom characterizing pushback for this theory has the form:

159

 $\operatorname{insert}(x, e) \cdot \operatorname{in}(x, c) \equiv ((e = c) + \operatorname{in}(x, c)) \cdot \operatorname{insert}(x, e)$

Our theory of sets works for expressions *e* taken from another theory, so long as the underlying theory supports tests of the form e = c. For example, this would work over the theory of naturals since a test like j = 10 can be encoded as $(j > 9) \cdot \neg (j > 10)$.

Finally, P_{map} (Fig. 1c) uses a combination of mutable *boolean* values and a *map* data structure. 166 Just as before, we can craft custom theories for reasoning about each of these types of state. For 167 booleans, we can add actions of the form b := t and b := f and tests of the form b = t and b = f. The 168 axioms are then simple equivalences like $(b := t \cdot b = f) \equiv 0$ and $(b := t \cdot b = t) \equiv (b := t)$. To model 169 map data structures, we add actions of the form X[e] := e and tests of the form X[c] = c. Just as with 170 171 the set theory, the map theory is parameterized over other theories, which can provide the type of keys and values-here, integers and booleans. In Pmap, the odd map tracks whether certain natural 172 numbers are odd or not by storing a boolean into the map's index. A sound axiom characterizing 173 pushback in the theory of maps has the form: 174

 $(X[e_1] := e_2 \cdot X[c_1] = c_2) \equiv (e_1 = c_1 \cdot e_2 = c_2 + X[c_1] = c_2) \cdot X[e_1] := e_2$

Each of the theories we have described so far—naturals, sets, booleans, and maps—have tests that only examine the *current* state of the program. However, we need not restrict ourselves in this way. Primitive tests can make dynamic decisions or assertions based on any previous state of the program. As an example, consider the theory of past-time, finite-trace linear temporal logic (LTL_f) [16, 17]. Linear temporal logic introduces new operators such as: $\bigcirc a$ (in the last state a), $\Diamond a$ (in some previous state a), and $\square a$ (in every state a); we use finite-time LTL because finite traces are a reasonable model in most domains modeling programs.

Finally, we can encode a tracing variant of NetKAT, a system that extends KAT with actions of the form $f \leftarrow v$, where some value v is assigned to one of a finite number of fields f, and tests of the form f = v where field f is tested for value v. It also includes a number of axioms such as $f \leftarrow v \cdot f = v \equiv f \leftarrow v$. The NetKAT axioms can be captured in our framework with minor changes. Further extending NetKAT to Temporal NetKAT is captured trivially in our framework as an application of the LTL_f theory to NetKAT's theory, deriving Beckett et al.'s [8] completeness result compositionally (in fact, we can strengthen it—see Sec. 2.5).

192 1.2 Using our framework: obligations for client theories

Our framework takes a *client theory* and produces a KAT, but what must one provide in order to know that the generated KAT is deductively complete, or to derive an implementation? We require, at a minimum, a description of the theory's predicates and actions along with how these apply to

196

191

1:4

some notion of state. We call these parts the *client theory*; the client theory's predicates and actions are *primitive*, as opposed to those built with the KAT's composition operators. We call the resulting KAT a *Kleene algebra modulo theory* (KMT). Deriving a trace-based semantics for the KMT and proving it sound isn't particularly hard—it amounts to "turning the crank". Proving the KMT is complete and decidable, however, can be much harder. We take care of much of the difficulty, lifting simple operations in the client theory generically to KAT.

Our framework hinges on an operation relating predicates and operations called *pushback*, first 203 204 used to prove relative completeness for Temporal NetKAT [8]. Pushback is a generalization of weakest preconditions: we translate programs to a normal form with all predicates at the front (i.e., 205 all predicates become pre-conditions). Pushback generalizes weakest preconditions because we 206 alter the program as we go, possibly changing its commands or structure. Given a primitive action 207 π and a primitive predicate α , the client theory must be able to compute weakest preconditions, 208 telling us how to go from $\pi \cdot \alpha$ to some set of terms: $\sum_{i=0}^{n} \alpha_i \cdot \pi = \alpha_0 \cdot \pi + \alpha_1 \cdot \pi + \dots$ That is, the 209 client theory must be able to take any of its primitive tests and "push it back" through any of its 210 primitive actions. Given the client's notion of weakest preconditions, we can alter programs to 211 take an *arbitrary* term and normalize it into a form where *all* of the predicates appear only at the 212 front of the term, a convenient representation both for our completeness proof (Sec. 3.4) and our 213 214 implementation (Sec 4).

The client theory's pushback should have two properties: it should be sound, (i.e., the resulting expression is equivalent to the original one); and none of the resulting predicates should be any bigger than the original predicates, by some measure (see Sec. 3). If the pushback has these two properties, we can use it to define a normal form for the KMT generated from the client theory—and we can use that normal form to prove that the resulting KMT is complete and decidable.

As an example, in NetKAT, for different fields f and f', we can use the network axioms to derive the equivalence: $(f \leftarrow v \cdot f' = v') \equiv (f' = v' \cdot f \leftarrow v)$, which satisfies the pushback requirements. For Temporal NetKAT, which adds rich temporal predicates such as $\Diamond \bigcirc$ (dstPort = 4747) (the destination port was 4747 at some point before the previous state), we can use the domain axioms to prove the equivalence $(f \leftarrow v \cdot \Diamond \bigcirc a) \equiv (\Diamond \bigcirc a + a) \cdot f \leftarrow v$, which also satisfies the pushback requirements of equivalence and non-increasing measure (because *a* is a subterm of $\Diamond \bigcirc a$).

Formally, the client must provide the following for our normalization routine (part of completeness): primitive tests and actions (α and π), semantics for those primitives (states σ and functions pred and act), a function identifying each primitive's subterms (sub), a weakest precondition relation (WP) justified by sound domain axioms (\equiv), and restrictions on WP term size growth.

The client's domain axioms extend the standard KAT equations to explain how the new primitives behave. In addition to these definitions, our client theory incurs a few proof obligations: \equiv must be sound with respect to the semantics; the pushback relation should never push back a term that's larger than the input; the pushback relation should be sound with respect to \equiv ; we need a satisfiability checking procedure for a Boolean algebra extended with the primitive predicates. Given these things, we can construct a sound and complete KAT with a normalization-based equivalence procedure.

1.3 Example: incrementing naturals

We can model programs like the While program over i and j from earlier by introducing a new client theory for natural numbers (Fig. 2). First, we extend the KAT syntax with actions x := n and inc_x (increment x) and a new test x > n for variables x and natural number constants n. First, we define the client semantics. We fix a set of variables, \mathcal{V} , which range over natural numbers, and the program state σ maps from variables to natural numbers. Primitive actions and predicates are interpreted over the state σ by the act and pred functions (where t is a trace of states).

245

237

Michael Greenberg, Ryan Beckett, and Eric Campbell

Syntax	Semantics	5
$\alpha \qquad ::= x > n$ $\pi \qquad ::= \operatorname{inc}_{x} x := n$ $\operatorname{sub}(x > n) = \{x > m \mid m \le n\}$	$n \in \mathbb{N} \qquad x \in$ State = \mathcal{V} pred $(x > n, t)$ = last act (inc_x, σ) = $\sigma[x$ act $(x := n, \sigma)$ = $\sigma[x$	$ \begin{array}{l} \mathcal{V} \\ \rightarrow \mathbb{N} \\ t(t)(x) > n \\ t \mapsto \sigma(x) + 1 \\ t \mapsto n \end{array} $
Weakest precondition $x := n \cdot (x > m) \text{ WP } (n > m)$ $\text{inc}_{y} \cdot (x > n) \text{ WP } (x > n)$ $\text{inc}_{x} \cdot (x > n) \text{ WP } (x > n - 1)$ $\text{when } n \neq 0$ $\text{inc}_{x} \cdot (x > 0) \text{ WP } 1$	Axioms $\neg(x > n) \cdot (x > m) \equiv 0 \text{ when } n \leq m$ $x := n \cdot (x > m) \equiv (n > m) \cdot x := n$ $(x > m) \cdot (x > n) \equiv (x > \max(m, n))$ $\operatorname{inc}_{y} \cdot (x > n) \equiv (x > n) \cdot \operatorname{inc}_{y}$ $\operatorname{inc}_{x} \cdot (x > n) \equiv (x > n - 1) \cdot \operatorname{inc}_{x} \text{ when } n > 0$ $\operatorname{inc}_{x} \cdot (x > 0) \equiv \operatorname{inc}_{x}$	GT-Contra Asgn-GT GT-Min GT-Comm Inc-GT Inc-GT-Z

Fig. 2. IncNat, increasing naturals

Proof obligations. The WP relation provides a way to compute the weakest precondition for any primitive action and test. For example, the weakest precondition of $\text{inc}_x \cdot x > n$ is x > n - 1 when nis not zero. We must have domain axioms to justify the weakest precondition relation. For example, the domain axiom: $\text{inc}_x \cdot (x > n) \equiv (x > n - 1) \cdot \text{inc}_x$ ensures that weakest preconditions for inc_x are modeled by the equational theory. The other axioms are used to justify the remaining weakest preconditions that relate other actions and predicates. Additional axioms that do not involve actions, such as $\neg(x > n) \cdot (x > m) \equiv 0$, are included to ensure that the predicate fragment of IncNat is complete in isolation. The deductive completeness of the model shown here can be reduced to Presburger arithmetic.

For the relative ease of defining IncNat, we get real power—we've extended KAT with unbounded state! It is sound to add other operations to IncNat, like multiplication or addition by a scalar. So long as the operations are monotonically increasing and invertible, we can still define a WP and corresponding axioms. It is *not* possible, however, to compare two variables directly with tests like x = y—to do so would not satisfy the requirement that weakest precondition does not grow the size of a test. It would be bad if it did: the test x = y can encode context-free languages! The (inadmissible!) term $x := 0 \cdot y := 0$; (inc $_x$)* \cdot (inc $_y$)* $\cdot x = y$ describes programs with balanced increments of x and y. For the same reason, we cannot safely add a decrement operation dec $_x$. Either of these would allow us to define counter machines, leading inevitably to undecidability.

Implementation. Users implement KMT's client theories by defining OCaml modules; users give the types of actions and tests along with functions for parsing, computing subterms, calculating weakest preconditions for primitives, mapping predicates to an SMT solver, and deciding predicate satisfiability (see Sec. 4 for more detail).

Our example implementation starts by defining a new, recursive module called IncNat. Recursive 285 modules allow the author of the module to access the final KAT functions and types derived after 286 instantiating KA with their theory within their theory's implementation. For example, the module K 287 on the second line gives us a recursive reference to the resulting KMT instantiated with the IncNat 288 theory; such self-reference is key for higher-order theories, which must embed KAT predicates 289 inside of other kinds of predicates (Sec. 2). The user must define two types: a for tests and p for 290 actions. Tests are of the form x > n where variable names are represented with strings, and values 291 with OCaml ints. Actions hold either the variable being incremented (inc_x) or the variable and 292 value being assigned (x := n). 293

281

282

283

284

294

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

```
type a = Gt of string * int
                                        (* alpha ::= x > n *)
295
296
      type p = Increment of string (* pi
                                                  ::= inc x *)
297
298
      module rec IncNat : THEORY with type A.t = a and type P.t = p = struct
299
       (* generated KMT, for recursive use *)
300
       module K = KAT (IncNat)
301
       (* boilerplate necessary for recursive modules, hashconsing *)
302
       module P : CollectionType with type t = p = struct ... end
303
       module A : CollectionType with type t = a = struct ... end
304
        (* extensible parser; pushback; subterms of predicates *)
305
       let parse name es = ...
306
       let push_back p a =
307
        match (p,a) with
308
        | (Increment _x, Gt (_, j)) when 1 > j \rightarrow PSet.singleton ~cmp:K.Test.compare (K.one ())
309
310
        | (Increment x, Gt (y, j)) when x = y \rightarrow
311
          PSet.singleton ~cmp:K.Test.compare (K.theory (Gt (y, j - 1)))
312
        | (Assign (x,i), Gt (y,j)) when x = y \rightarrow PSet.singleton ~cmp:K.Test.compare (if i > j then K.one () else
313
         ] \_ \rightarrow PSet.singleton ~ cmp:K.Test.compare (K.theory a) 
314
       let rec subterms x =
315
        match x with
316
        | Gt (_, 0) \rightarrow PSet.singleton ~cmp:K.Test.compare (K.theory x)
317
        | Gt (v, i) \rightarrow PSet.add (K.theory x) (subterms (Gt (v, i - 1)))
318
        (* decision procedure for the predicate theory *)
319
       let satisfiable (a: K.Test.t) = ...
320
321
      end
```

The first function, parse, allows the library author to extend the KAT parser (if desired) to include new kinds of tests and actions in terms of infix and named operators. The other functions, subterms and push_back, follow from the KMT theory directly. Finally, the user must implement a function that decides satisfiability of theory tests.

The implementation obligations—syntactic extensions, subterms functions, WP on primitives, a satisfiability checker for the test fragment—mirror our formal development. We offer more client theories in Sec. 2 and more detail on the implementation in Sec. 4.

1.4 A case study: network routing protocols

As a final example demonstrating the kinds of theories supported by KMT, we turn our attention 333 to modeling network routing protocols. While NetKAT uses Kleene algebra to define simple, 334 stateless forwarding tables of networks, the most common network routing protocols are distributed 335 algorithms that actually compute paths in a network by passing messages between devices. As 336 an example the Border Gateway Protocol (BGP) [52], which allows users to define rich routing 337 policy, has become the de facto internet routing protocol used to transport data between between 338 autonomous networks under the control of different entities (e.g. Verizon, Comcast). However, the 339 combination of the distributed nature of BGP, the difficulty of writing policy per-device, and the 340 fact that network devices can and often do fail [28] all contribute to the fact that network outages 341 caused by BGP misconfiguration are common [2, 29, 33, 43, 48, 58, 63]. By encoding BGP policies 342

343

322 323

324

325

326

327

328

329

330 331



in our framework, it immediately follows that we can decide properties about networks running BGP such as "will router A always be able to reach router B after at most 1 link failure".

Fig. 3a shows an example network that is configured to run BGP. In BGP, devices exchange messages between neighbors to determine routes to a destination. In the figure, router A is connected to an end host (the line going to the left) and wants to tell other routers how to get to this destination.

In the default behavior of the BGP protocol, each router selects the shortest path among all of its neighbors and then informs each of its neighbors about this route (with the path length increased by one). In effect, the devices will compute the shortest paths through the network in a distributed fashion. We can model shortest paths routing in a KMT using the theory of natural numbers: in P_{SP} (Fig. 3b), each router maintains a distance to the destination. Since A knows about the destination, it will start with a distance of 0, while all other routers start with distance ∞ . Then, iteratively, each other router updates its distance to be 1 more than the minimum of each of its peers, which is captured by the min+ operator. The behavior of min+ can be described by pushback equivalences like:

$$B := \min + (A, C, D) \cdot B < 3 \equiv (A < 2 + C < 2 + D < 2) \cdot B := \min + (A, C, D)$$

BGP gets interesting when users go beyond shortest path routing and also define router-local 374 policy. In our example network, router C is configured with local policy (Fig. 3a): router C will 375 block messages received from D and will prioritize paths received from neighbor B over those from 376 A (using distance as a tie breaker). In order to accommodate this richer routing behavior, we must extend our model to PBGP (Fig. 3c). Now, each router is associated with a variable storing a tuple of 378 both the distance and whether or not the router has a path to the destination; we write C_1 for the 379 "does C have a path" boolean and C_0 for the length of that path, if it exists. We can then create a 380 separate update action for each device in the network to reflect the semantics of the device's local policy (updateC, etc.). Further, suppose we have a boolean variable fail X, Y for each link between 382 routers X and Y indicating whether or not the link is failed. The update action for router C's local policy can be captured with the following type of equivalence: 384

$$\mathsf{updateC} \cdot C_0 < 3 \equiv (\neg\mathsf{fail}_{A,C} \cdot (\neg B_1 + \mathsf{fail}_{B,C}) \cdot A_1 \cdot (A_0 < 2) + \neg\mathsf{fail}_{B,C} \cdot B_1 \cdot (B_0 < 2)) \cdot \mathsf{updateC}$$

In order for router C to have a path length < 3 to the destination after applying the local update 387 function, it must have either been the case that B did not have a route to the destination (or the 388 B-C link is down) and A had a route with length < 2 and the A-C link is not down, or B had a 389 route with length < 2 and the B-C link is not down. Similarly, we would need an axiom to capture 390 when router C will have a path to the destination based on equivalences like: updateC $\cdot C_1 \equiv$ 391

357 358

359

360

361

362

363

364

365

366

367

368

369 370

371

372 373

377

381

383

 $(A_1 \cdot \neg fai|_{A,C} + B_1 \cdot \neg fai|_{B,C}) \cdot updateC-C$ has a path to the destination if any of its neighbors has a path to the destination and the corresponding link is not failed.

It is now possible to ask questions such as "if there is any single network link failure, will C ever have a path with length greater than 2?". Assuming the network program is encoded as ρ , we can answer this question by checking language non-emptiness for

$$(\operatorname{fail}_{A,C} \cdot \neg \operatorname{fail}_{B,C} + \neg \operatorname{fail}_{A,C} \cdot \operatorname{fail}_{B,C}) \cdot \rho \cdot (C_0 > 2) \equiv 0$$

While we have in a sense come back to a per-program world $-P_{BGP}$ requires definitions and axioms for each router's local policy—we can reason in a *very* complex domain.

1.5 Contributions

402

403 404

405

406

418

428

429

430

431

432

433

434

435

436

437

438

We claim the following contributions:

- A compositional framework for defining KATs and proving their metatheory, with a novel development of the normalization procedure used in completeness (Sec. 3). Completeness yields a decision procedure based on normalization.
- Several case studies of this framework (Sec. 2), including a strengthening of Temporal NetKAT's completeness result, theories for unbounded state (naturals, sets, maps), distributed routing protocols, and, most importantly, compositional theories that allow designers to experiment new, complex theories. Several of these theories use unbounded state (e.g., naturals, sets, and maps), going beyond what the state of the art in KAT metatheory is able to accommodate.
- An implementation of KMT (Sec. 4) mirroring our proofs; we derive a normalization-based equivalence decision procedure for client theories from just a few definitions. Our implementation is efficient enough for experimentation with small programs (Sec. 5).
- Finally, our framework offers a new way in for those looking to work with KATs. Researchers comfortable with inductive relations from, e.g., type theory and semantics, will find a familiar friend in pushback, our generalization of weakest preconditions—we define it as an inductive relation. To restate our contributions for readers more deeply familiar with KAT: Our framework is similar to Schematic KAT, a KAT extended with first order theories. However, Schematic KAT is incomplete in general. Our framework shows that a subset of Schematic KATs is complete—those with tracing semantics and a monotonic pushback.

The core technique we discuss here was first developed in Beckett et al.'s work on Temporal NetKAT [8]. Our work here is a significant extension of that work:

- We explicitly define the normalization routine using inference rules (Section 3.3); in Temporal NetKAT, normalization is implicit in its completeness proof.
- The Temporal NetKAT proof of completeness is a morass, simultaneously proving the correctness and termination of normalization. In our framework, we prove those theorems separately (Theorems 3.34 and 3.35).
 - Our treatment of negation is improved; we prove a new KAT theorem (PUSHBACK-NEG).
- We present a general *framework* for proving completeness, while the Temporal NetKAT development is specialized to a particular instance—tracing NetKAT with LTL_f.
- The Temporal NetKAT proof achieves only network-wide completeness because of its limited understanding of LTL_f; we are able to achieve completeness.

Beckett et al. handles compilation to forwarding decision diagrams [60], while our presentation
 doesn't discuss compilation.

Michael Greenberg, Ryan Beckett, and Eric Campbell

442	Syntax	Semantics
443	α ::= $b = t$	$b \in \mathcal{B}$
444	$\pi ::= b := \mathfrak{t} b := \mathfrak{f}$	State = $\mathcal{B} \to {\mathfrak{t}, \mathfrak{f}}$
445	$sub(\alpha) = \{\alpha\}$	pred(b = t, t) = last(t)(b)
446		$\operatorname{act}(b := t, \sigma) = \sigma[b \mapsto t]$
447		$\operatorname{act}(b := \mathfrak{f}, \sigma) = \sigma[b \mapsto \mathfrak{f}]$
448	Weakest precondition	Axioms
449	$b := t \cdot b = t WP 1$	$(b := t) \cdot (b = t) \equiv (b := t)$ Set-Test-True-True
450	$b := \mathbf{\tilde{f}} \cdot b = \mathbf{t} \ \mathbf{WP} \ 0$	$(b := f) \cdot (b = t) \equiv 0$ Set-Test-False-True
451		

Fig. 4. BitVec, theory of bitvectors

2 CASE STUDIES

In this section, we define KAT client theories for bitvectors and networks, as well as higher-order 456 theories for products of theories, sets over theories, and temporal logic over theories. To give a 457 sense of the range and power of our framework, we offer these case studies before the formal details 458 of the framework itself (Section 3). We start with a simple theory (bit vectors in Sec. 2.1), building 459 up to unbounded state from naturals (Sec. 1.3) to sets and maps parameterized over a notion of 460 value and variable (Sec. 2.3). As an example of a higher-order theory, we define LTL on finite traces 461 (a/k/a LTL_f; Sec. 2.5), extending the predicate language with temporal operators like $\bigcirc a$, meaning 462 "the predicate *a* holds in the previous state of the trace". 463

2.1 Bit vectors

The simplest KMT is bit vectors: we extend KAT with some finite number of bits, each of which can 466 be set to true or false and tested for their current value (Fig. 4). The theory adds actions b := t and 467 b := f for boolean variables b, and tests of the form b = t, where b is drawn from some set of names 468 $\mathcal B$. Since our bit vectors are embedded in a KAT, we can use KAT operators to build up encodings 469 on top of bits: $b = \mathfrak{f}$ desugars to $\neg (b = \mathfrak{t})$; flip b desugars to $(b = \mathfrak{t} \cdot b := \mathfrak{f}) + (b = \mathfrak{f} \cdot b := \mathfrak{t})$. We could 470 go further and define numeric operators on collections of bits, at the cost of producing larger terms. 471 We are not limited to just numbers, of course; once we have bits, we can encode any bounded data 472 structure we like. 473

KAT+B! [30] develops a nearly identical theory, though our semantics admit different equations. We use a *trace* semantics, where we distinguish between $(b := t \cdot b := t)$ and (b := t). Even though the final states are equivalent, they produce different traces because they run different actions. KAT+B!, on the other hand, doesn't distinguish based on the trace of actions, so they find that $(b := t \cdot b := t) \equiv (b := t)$. It's difficult to say whether one model is better than the other—we imagine that either could be appropriate, depending on the setting. For example, our trace semantics is useful for answering model-checking-like questions (Sec. 2.5).

2.2 Disjoint products

Given two client theories, we can combine them into a disjoint product theory, $\operatorname{Prod}(\mathcal{T}_1, \mathcal{T}_2)$, where the states are products of the two sub-theory's states and the predicates and actions from \mathcal{T}_1 can't affect \mathcal{T}_2 and vice versa (Fig. 5). We explicitly give definitions for pred and act that defer to the corresponding sub-theory, using t_i to project the trace state to the *i*th component. It may seem that disjoint products don't give us much, but they in fact allow for us to simulate much more interesting languages in our derived KATs. For example, $\operatorname{Prod}(\operatorname{BitVec}, \operatorname{IncNat})$ allows us to program with both variables valued as either booleans or (increasing) naturals; the product theory lets us directly

481

482

1:10

452 453 454

455

464

Kleene Algebra Modulo Theories

491	Syntax	Semantics
492	$\alpha := \alpha_1 \mid \alpha_2$	State = $State_1 \times State_2$
493	$\pi := \pi_1 \mid \pi_2$	$pred(\alpha_i, t) = pred_i(\alpha_i, t_i)$
494	$sub(\alpha_i) = sub_i(\alpha_i)$	$\operatorname{act}(\pi_i, \sigma) = \sigma[\sigma_i \mapsto \operatorname{act}_i(\pi_i, \sigma_i)]$
495	Weakest precondition extending \mathcal{T}_1 and \mathcal{T}_2	Axioms extending \mathcal{T}_1 and \mathcal{T}_2
496	$\pi_1 \cdot \alpha_2 WP \alpha_2 = \pi_2 \cdot \alpha_1 WP \alpha_1$	$\pi_1 \cdot \alpha_2 \equiv \alpha_2 \cdot \pi_1$ I-R-COMM
497	n_1 a_2 \dots a_2 n_2 a_1 \dots a_1	$\pi_1 \alpha_2 = \alpha_2 \pi_1 \exists \ R COMM$ $\pi_2 \cdot \alpha_1 \equiv \alpha_1 \cdot \pi_2 R-L-COMM$
498		
499	Fig. 5. $Prod(\mathcal{T}_1, \mathcal{T}_2)$, product	s of two disjoint theories
500		
501	Syntax	Semantics
502	$\alpha := x[e] = c e = c \alpha_0$	$c \in C$
503	$\pi ::= x[c] := e \mid \pi_c$	$e \in \mathcal{E}$
504	$pred(x[e] = c), t) = last(t)_1(x, last(t)_2(e)) = c$	$x \in \mathcal{V}$
505	$\operatorname{pred}(\alpha_e, t) = \operatorname{pred}(\alpha_e, t_2)$	State = $(\mathcal{V} \to \mathcal{C} \to \mathcal{C}) \times (\mathcal{E} \to \mathcal{C})$
506	$sub(x[e] = c) = \{x[e] = c\} \cup$	$\operatorname{act}(x[c] := e), \sigma) = \sigma[\sigma_1[x[c \mapsto \sigma_2(e)]]]$
507	$sub(\neg(e = c'))$	$\operatorname{act}(\pi_e, \sigma) = \sigma[\sigma_2 \mapsto \operatorname{act}(\pi_e, \sigma_2)]$
508	sub(e = c) = sub(e = c)	
509	$sub(\alpha_e) = sub(\alpha_e)$	
510	Pushback ex	tending \mathcal{E}
511	$(x[c] := e) \cdot \alpha_e$ WP α_e	
512	$(y[c_1] := e_1) \cdot (x[e_2] = c_2) \text{ WP } x[e_2] = c_2$	c_2
513	$(x[c_1] := e_1) \cdot (x[e_2] = c_2) \text{ WP } (e_2 = c_1)$	$e_1 = c_2$ + ($\neg (e_2 = c_1) \cdot x[e_2] = c_2$)
514	Axioms ext	rending &
515		(a[a] a a) = (a a[a] a) E Course
516		$(x[c] := e \cdot \alpha_e) \equiv (\alpha_e \cdot x[c] := e) \text{E-COMM}$
517	$(y[c_1] := e_1 \cdot x[e_2] = c_2) = ((e_2 - c_1 \cdot e_1 - c_2) + z_2)$	$ [s_{2} - c_{2}] = (x[e_{2}] - c_{2} \cdot y[c_{1}] := e_{1}) \text{MAP-NEQ} $ $ (e_{2} - c_{1}) \cdot x[e_{2}] = c_{2}) \cdot x[c_{1}] := e_{1} \text{MAP-FO} $
518	$(x_1c_{11}) - c_1 \cdot x_1c_{21} - c_2) = ((c_2 - c_1 \cdot c_1 - c_2) + \neg$	$(c_2 - c_1) = x_1 c_2 - c_2 + x_1 c_1 - c_1 = 0$ MIAP-EQ
519	Fig. 6. Map(\mathcal{E}), unbounded maps over	er arbitrary expressions/constants
520		
521		

express the sorts of programs that Kozen's early static analysis work had to encode manually, i.e., loops over boolean and numeric state [37].

2.3 Unbounded sets

We define a KMT for unbounded sets parameterized on a theory of expressions \mathcal{E} (Fig. 7). The set data type supports just one operation: add(x, e) adds the value of expression e to set x (we could add del(x, e), but we omit it to save space). It also supports a single test: in(x, c) checks if the constant c is contained in set x. The idea is that $e \in \mathcal{E}$ refers to expressions with, say, variables xand constants c. We allow arbitrary expressions e in some positions and constants c in others. (If we allowed expressions in all positions, WP wouldn't necessarily be non-increasing.)

To instantiate the Set theory, we need a few things: expressions \mathcal{E} , a subset of *constants* $C \subseteq \mathcal{E}$, and predicates for testing (in)equality between expressions and constants (e = c and $e \neq c$). (We can not, in general, expect tests for equality of non-constant expressions, as it may cause us to accidentally define a counter machine.) We treat these two extra predicates as inputs, and expect that they have well behaved subterms. Our state has two parts: $\sigma_1 : \mathcal{V} \to \mathcal{P}(C)$ records the current sets for each set in \mathcal{V} , while $\sigma_2 : \mathcal{E} \to C$ evaluates expressions in each state. Since each state has its own evaluation function, the expression language can have actions that update σ_2 .

522

523 524

540	Syntax		Semantics
541	$\alpha ::= in(x, c) \mid e = c \mid \alpha_e$	с	$\in C$
542	$\pi ::= \operatorname{add}(x, e) \mid \pi_e$	e	$\in \mathcal{E}$
543	$\operatorname{sub}(\operatorname{in}(x,c)) = {\operatorname{in}(x,c)} \cup \operatorname{sub}(\neg(e =$	c)) x	$\in \mathcal{V}$
544	sub(e = c) = sub(e = c)	State	$= (\mathcal{V} \to \mathcal{P}(\mathcal{C})) \times (\mathcal{E} \to \mathcal{C})$
545	$sub(\alpha_e) = sub(\alpha_e)$	pred(in(x, c), t)	$= \operatorname{last}(t)_2(c) \in \operatorname{last}(t)_1(x)$
546		pred(α_e, t) act(add(x, e), σ)	$= \operatorname{pred}(\alpha_e, t_2)$ $= \sigma[\sigma_1[x \mapsto \sigma_1(x) \cup \{\sigma(e)\}]]$
547		$\operatorname{act}(\pi_e,\sigma)$	$= \sigma[\sigma_2 \mapsto \operatorname{act}(\pi_e, \sigma_2)]$
548	Washast presendition artending 8	Aviomo or	tonding 8
549	weakest precondition extending C	AXIOIIIS EX	
550	$add(y, e) \cdot in(x, c) WP in(x, c)$	$add(y, e) \cdot in(x, c) \equiv$	$in(x, c) \cdot add(y, e)$ Ард-Сомм
551	$\operatorname{add}(x, e) \cdot \operatorname{in}(x, c) \operatorname{WP}(e = c) + \operatorname{in}(x, c)$	$\operatorname{add}(x, e) \cdot \operatorname{in}(x, c) \equiv ((e = c) + \operatorname{i})$	$n(x,c)) \cdot add(x,e)$ ADD-IN
552	$\operatorname{add}(x,e) \cdot \alpha_e \text{ WP } \alpha_e$	$\operatorname{add}(x,e)\cdot a$	$\alpha_e \equiv \alpha_e \cdot \operatorname{add}(x, e) \operatorname{Add-Comm2}$

Fig. 7. Set(\mathcal{E}), unbounded sets over expressions

For example, we can have sets of naturals by setting $\mathcal{E} ::= n \in \mathbb{N} \mid i \in \mathcal{V}'$, where our constants $C = \mathbb{N}$ and \mathcal{V}' is some set of variables distinct from those we use for sets. We can update the variables in \mathcal{V}' using lncNat's actions while simultaneously using set actions to keep sets of naturals. Our KMT can then prove that the term $(\text{inc}_i \cdot \text{add}(x, i))^* \cdot (i > 100) \cdot \text{in}(x, 100)$ is non-empty by pushing tests back (and unrolling the loop 100 times). The set theory's sub function calls the client theory's sub function, so all in(x, e) formulae must come *later* in the global well ordering than any of those generated by the client theory's e = c or $e \neq c$.

2.4 Unbounded maps

Maps aren't much different from sets; rather than having simple membership tests, we instead 565 check to see whether a given key maps to a given constant (Fig. 6). Our writes use constant keys 566 and expression values, while our reads use variable keys but constant values. We could have flipped 567 this arrangement-writing to expression keys and reading from constant ones-but we cannot allow 568 both reads and writes to expression keys. Doing so would allow us to compare variables, putting us 569 in the realm of context-free languages and foreclosing on the possibility of a complete theory. We 570 could add other operations (at the cost of even more equational rules/pushback entries), like the 571 ability to remove keys from maps or to test whether a key is in the map or not. Just as for $Set(\mathcal{E})$, 572 we must put all x[e] = c and $x[e] \neq c$ formulae *later* in the global well ordering than any of those 573 generated by the client theory's e = c or $e \neq c$. 574

2.5 Past-time linear temporal logic

Past-time linear temporal logic on finite traces (LTL_f) is a *higher-order theory*: LTL_f is itself parameterized on a theory \mathcal{T} , which introduces its own predicates and actions—any \mathcal{T} test can appear inside of LTL_f 's predicates (Fig. 8). For information on LTL_f , we refer the reader to work by Baier and McIlraith, De Giacomo and Vardi, Roşu, and Beckett et al., and Campbell and Greenberg [5, 8, 10, 11, 16, 17, 53].

LTL_f adds just two predicates: $\bigcirc a$, pronounced "last a", means a held in the prior state; and a S b, pronounced "a since b", means b held at some point in the past, and a has held since then. There is a slight subtlety around the beginning of time: we say that $\bigcirc a$ is false at the beginning (what can be true in a state that never happened?), and a S b degenerates to b at the beginning of time. The last and since predicates together are enough to encode the rest of LTL_f; encodings are given below the syntax. The pred definitions mostly defer to the client theory's definition of pred (which may

553

554 555

563

564

575

589	Syntax	Sem	antics
590	$\alpha ::= \bigcirc a \mid a S b \mid a$	State	= State T
591	$\pi ::= \pi_{\mathcal{T}}$	$pred(\bigcirc a, \langle \sigma, l \rangle)$	= f
592	$sub(\bigcirc a) = \{\bigcirc a\} \cup \underline{sub(a)}$	$\operatorname{pred}(\bigcirc a, t\langle \sigma, l \rangle)$	$= \operatorname{pred}(a, t)$
593	$sub(a S b) = \{a S b\} \cup sub(a) \cup sub(b)$	$\operatorname{pred}(a \ \mathcal{S} \ b, \langle \sigma, l \rangle)$	$= \operatorname{pred}(b, \langle \sigma, l \rangle)$
594	$\operatorname{act}(\pi,\sigma) = \operatorname{act}(\pi,\sigma)$	$\operatorname{pred}(a \ S \ b, t\langle \sigma, l \rangle)$	$= \operatorname{pred}(b, t\langle \sigma, l \rangle) \lor$
595		$(\operatorname{pred}(a,t)\sigma)$	$(a \mathcal{S} b, t)$ \land pred $(a \mathcal{S} b, t)$
596	$\bullet a = \neg \bigcirc \neg a \qquad a \ \mathcal{B} \ b = a \ \mathcal{S} \ b + \Box a$		
597	start = $\neg \bigcirc 1$ $\Diamond a = 1 S a$ $\Box a = \neg \Diamond \neg a$		
598	Weakest precondition extending ${\mathcal T}$	Axioms exter	nding ${\mathcal T}$
599	$\pi \cdot \bigcirc a \; WP \; a$	inherited from ${\cal T}$	
600		$\bigcirc (a \cdot b) \equiv \bigcirc a \cdot \bigcirc b$	LTL-Last-Dist-Seq
601	$\pi \cdot a \operatorname{PB}^{\bullet}_{\mathcal{T}} a' \cdot \pi \qquad \pi \cdot b \operatorname{PB}^{\bullet}_{\mathcal{T}} b' \cdot \pi$	$\bigcirc(a+b) \equiv \bigcirc a + \bigcirc b$	LTL-Last-Dist-Plus
602	$\pi \cdot (a \ S \ b) \ WP \ b' + a' \cdot (a \ S \ b)$	$\bullet \ 1 \equiv 1$	LTL-WLAST-ONE
603		$a \mathcal{S} b \equiv b + a \cdot \bigcirc (a \mathcal{S} b)$	LTL-Since-Unroll
604		$\neg(a \mathcal{S} b) \equiv (\neg b) \mathcal{B} (\neg a \cdot \neg b)$	LTL-Not-Since
		$a \leq igodot a \cdot b \rightarrow a \leq \Box b$	LTL-Induction
605			
605 606		$\Box a \leq \Diamond(start \cdot a)$	LTL-Finite

Fig. 8. $LTL_f(\mathcal{T})$, linear temporal logic on finite traces over an arbitrary theory

recursively reference the LTL_f pred function), unrolling S as it goes (LTL-SINCE-UNROLL). Weakest preconditions uses inference rules: to push back S, we unroll a S b into $a \cdot \bigcirc (a S b) + b$; pushing last through an action is easy, but pushing back a or b recursively uses the PB[•] judgment. Adding these rules leaves our judgments monotonic, and if $\pi \cdot a \text{ PB}^{\bullet} x$, then $x = \sum a_i \pi$ (Lemma 3.33). In this case, our implementation's recursive modules are critical-they allow us to use the derived pushback inside our definition of weakest preconditions.

The equivalence axioms come from Temporal NetKAT [8]; the deductive completeness result for these axioms comes from Campbell and Greenberg's work, which proves deductive completeness for an axiomatic framing and then relates those axioms to our equations [10, 11]; we could have also used Roşu's proof with coinductive axioms [53].

As a use of LTL_f , recall the simple While program from Sec. 1. We may want to check that, before the last state after the loop, the variable j was always less than or equal to 200. We can capture this with the test $\bigcirc \Box$ (j ≤ 200). We can use the LTL_f axioms to push tests back through actions; for example, we can rewrite terms using these LTL_f axioms alongside the natural number axioms:

$$j := j + 2 \cdot \Box(j \le 200) \equiv j := j + 2 \cdot (j \le 200 \cdot \bigcirc \Box(j \le 200))$$
$$\equiv (j := j + 2 \cdot j \le 200) \cdot \bigcirc \Box(j \le 200)$$
$$\equiv (j \le 198) \cdot j := j + 2 \cdot \bigcirc \Box(j \le 200)$$
$$\equiv (j \le 198) \cdot \Box(j \le 200) \cdot j := j + 2$$

Pushing the temporal test back through the action reveals that j is never greater than 200 if before the action j was not greater than 198 in the previous state and j never exceeded 200 before the action as well. The final pushed back test $(j \le 198) \cdot \Box (j \le 200)$ satisfies the theory requirements for pushback not yielding larger tests, since the resulting test is only in terms of the original test and its subterms. Note that we've embedded our theory of naturals into LTL_f : we can generate a complete equational theory for LTL_f over any other complete theory.

The ability to use temporal logic in KAT means that we can model check programs by phrasing model checking questions in terms of program equivalence. For example, for some program r, we

Michael Greenberg, Ryan Beckett, and Eric Campbell

638	Syntax	Semantics
639	α ::= $f = v$	F = packet fields
640	π ::= $f \leftarrow v$	V = packet field values
641	$sub(\alpha) = \{\alpha\}$	State $= F \rightarrow V$
642		pred(f = v, t) = last(t).f = v
643		$\operatorname{act}(f \leftarrow v, \sigma) = \sigma[f \mapsto v]$
644	Weakest precondition	Axioms
645	$f \leftarrow v \cdot f = v \text{ WP } 1$	$f \leftarrow v \cdot f' = v' \equiv f' = v' \cdot f \leftarrow v$ PA-Mod-Comm
646	$f \leftarrow v \cdot f = v' \text{ WP } 0 \text{ when } v \neq v'$	$f \leftarrow v \cdot f = v \equiv f \leftarrow v$ PA-Mod-Filter
647	$f' \leftarrow v \cdot f = v \text{ WP } f = v$	$f = v \cdot f = v' \equiv 0$, if $v \neq v'$ PA-Contra
648	•	$\sum_{v} f = v \equiv 1$ PA-MATCH-ALL

Fig. 9. Tracing NetKAT a/k/a NetKAT without dup

can check if $r \equiv r \cdot \bigcirc [j \leq 200)$. In other words, if there exists some program trace that does not satisfy the test, then it will be filtered-resulting in non-equivalent terms. If the terms are equal, then every trace from *r* satisfies the test. Similarly, we can test whether $r \cdot \bigcirc \Box (j \le 200)$ is empty—if so, there are *no* satisfying traces.

In addition to model checking, temporal logic is a useful programming language feature: programs can make dynamic program decisions based on the past more concisely. Such a feature is useful for Temporal NetKAT (Sec. 2.7 below), but could also be used for, e.g., regular expressions with lookbehind or even a limited form of back-reference.

2.6 Tracing NetKAT

We define NetKAT as a KMT over packets, which we model as functions from packet fields to values (Fig. 9). KMT's trace semantics diverge slightly from NetKAT's: like KAT+B! (Sec. 2.1; [30]), NetKAT normally merges adjacent writes. If the policy analysis demands reasoning about the history of packets traversing the network-reasoning, for example, about which routes packets actually take-the programmer must insert dups to record relevant moments in time. Typically, dups are automatically inserted at the topology level, i.e., before a packet enters a switch, we record its state by running dup. From our perspective, NetKAT very nearly has a tracing semantics, but the traces are selective. If we put an implicit dup before *every* field update, NetKAT has our tracing semantics. The upshot is that our "tracing NetKAT" has a slightly different equational theory from conventional NetKAT, rejecting the following NetKAT laws as unsound for trace semantics:

$$\begin{array}{ll} f = v \cdot f \leftarrow v \equiv f = v & \text{PA-Filter-Mod} \\ f \leftarrow v \cdot f \leftarrow v' \equiv f \leftarrow v' & \text{PA-Mod-Mod} \\ f \leftarrow v \cdot f' \leftarrow v' \equiv f' \leftarrow v' \cdot f \leftarrow v & \text{PA-Mod-Mod-Comm} \end{array}$$

In principle, one can abstract our semantics' traces to find the more restricted NetKAT traces, but we can't offer any formal support in our framework for abstracted reasoning. Just as for BitVec, It is possible that ideas from Kozen and Mamouras could apply here [40]; see Sec. 6.

Temporal NetKAT 2.7

We derive Temporal NetKAT as LTL_f (NetKAT), i.e., LTL_f instantiated over tracing NetKAT; the 682 combination yields precisely the system described in the Temporal NetKAT paper [8]. Our LTL_f 683 theory can now rely on Campbell and Greenberg's proof of deductive completeness for LTL_f [10, 11], 684 we can automatically derive a stronger completeness result for Temporal NetKAT than that from 685

650 651 652

653

654

655

656

657

658

659

660 661

662

663

664

665

666

667

668

669

670

671

677

678

679 680

687	Syntax	Semantics
688	α ::= $x < n$	$n \in \mathbb{N} \cup \{\infty\}$
689	π ::= $x := \min(\vec{x})$	$x \in \mathcal{V}$
690	pred(x < n, t) = last(t)(x) < n	State = $\mathcal{V} \to \mathbb{N}$
691	$sub(x < n) = \{x_i < m \mid m \le n, x_i \in \mathcal{V}\}\$	
692	$\operatorname{act}(x := \min + (\vec{x}), \sigma) = \sigma[x \mapsto 1 + \min(\sigma(\vec{x}))]$	
693	Marshant mussen lition anions a	identical to much hash
694	weakest precondition axions an $r := \min_{x \in \mathcal{A}} (x \in \infty) WP \Sigma_{x}(x \in \infty)$	e identical to pushback
695	$\mathbf{x} := \min\{(\mathbf{x}) \cdot (\mathbf{x} < \infty) \text{ with } \Sigma_{l}(\mathbf{x}_{l} < \infty)$ $\mathbf{x} := \min\{(\mathbf{x}) \cdot (\mathbf{x} < n) \text{ WP } \Sigma_{i}(\mathbf{x}_{i} < n-1)$	
696	$x : \min(x) (x < i) \mapsto Z_i(x_i < i = 1)$	
697	Fig. 10. SP, shortest paths in	a graph
698		
699	Syntax	Semantics
700	$\alpha ::= C_0 < n \mid C_1 \mid fail_{R_1, R_2}$	R = Routers
701	π ::= updateC	$L = R \times R$ Links
702	$pred(C_1, t) = last(t)_1(C)_1$	$n \in \mathbb{N}$
703	$\operatorname{pred}(C_0 < n, t) = \operatorname{last}(t)_1(C)_0 < n$	$x \in \mathbb{R}$
704	$\operatorname{pred}(\operatorname{fail}_{R_1,R_2},t) = \operatorname{last}(t)_2(R_1,R_2)$	State = $R \rightarrow \mathbb{N} \times \{t, f\}$
705	$sub(fail_{R_1,R_2}) = \{fail_{R_1,R_2}\}$	$\times L \to \{t,f\}$
706	$sub(C_1) = \{A_1, B_1, tail_{A,C}, tail_{B,C}\}$	
707	$sub(C_0 < n) = \{A_0 < n - 1, B_0 < n - 1, A_0 < n - 1, $	$[1, B_1, \text{fall}_{A,C}, \text{fall}_{B,C}]$
708	$(1 + \sigma(B)_0, true)$) path(B)
709	act(updateC), σ) = $\sigma C \mapsto \{ (1 + \sigma(A)_0, true) \} \}$) else if path(A)
710	$\left[\left(\sigma(C)_0, \sigma(C)_1 \right) \right]$	otherwise
711	where $path(X) = \sigma(X)_1 \land$	$\sigma((X,C))_1$
712	Weakest presendition	a are identical to pushbash
713	$(\pi, fail_{n-n})$ WP fail_n n	is are identical to pushback
714	$(n + \operatorname{ran}_{R_1, R_2})$ where $\operatorname{ran}_{R_1, R_2}$ (undate $(-D_1)$ WP D_1	
715	(updateC C_1) WP \neg fail ₄ $C \cdot A_1 + \neg$ fai	$B_{C} \cdot B_{1}$
716	$(updateC \cdot D_0 < n)$ WP $(D_0 < n)$	
717	$(\text{updateC} \cdot C_0 < n)$ WP $\neg \text{fail}_{A,C} \cdot (\neg B_1 + \text{fail}_{A,C})$	$\operatorname{il}_{B,C} \cdot A_1 \cdot (A_0 < n - 1) +$
718	$\neg fail_{B,C} \cdot B_1 \cdot (B_0 < $	(n-1)
719		
720	Fig. 11. BGP, protocol theory for router C fr	om the network in Fig. 3
721		
722	the paper, which showed completeness only for "network	x-wide" policies, i.e., those with start at
723	the front.	
724		

725 2.8 Distributed routing protocols

The theory for naturals with the min+ operator used for shortest path routing is shown in Fig. 10. The theory is similar to the IncNat theory but for some minor differences. First, the domain is now over $\mathbb{N} \cup \{\infty\}$. Second, there is a new axiom and pushback relation relating min+ to a test of the form x < n. Third, the subterms function is now defined in terms of all other variables, which are infinite in principle but finite in any given term (e.g., the number of routers in a given network).

The theory for the BGP protocol instance with local router policy described in Fig. 3 is now shown in Fig. 11. For brevity, we only show the theory for router C in the network. The state has two parts: the first part maps each router to a pair of a natural number describing the path length to the destination for that router, and a boolean describing whether or not the router has a route

Predicates 7	Predicates $\mathcal{T}_{\text{pred}}^*$		Actions	
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	additive identity multiplicative identity negation b disjunction primitive predicates (T_{α})	$\begin{array}{ccc} p,q & ::= \\ & \\ & \\ & \\ & \\ & \end{array}$	$a p + q p \cdot q p^* \pi$	embedded predicates parallel composition sequential composition Kleene star primitive actions (T_{π})

Fig. 12. \mathcal{T}^* : generalized KAT syntax over a client theory \mathcal{T} (client parts highlighted)

to the destination; the second part maps links to a boolean representing whether the link is up or not. We require new axioms corresponding to each of the pushback operations shown. The action updateC commutes with unrelated tests, and otherwise behaves as described in Sec. 1.

3 THE KMT FRAMEWORK

The rest of our paper describes how our framework takes a client theory and generates a KAT. We emphasize that you need not understand the following mathematics to use our framework—we do it once and for all, so you don't have to. We first explain the structure of our framework for defining a KAT in terms of a client theory. While we have striven to make this section accessible to non-expert readers, those completely new to KATs may do well to skip our discussion of pushback (Sec. 3.3.2 on) and read our case studies (Sec. 2). We highlight provide.

We derive a KAT \mathcal{T}^* (Fig. 12) on top of a client theory \mathcal{T} where \mathcal{T} has two fundamental parts predicates $\alpha \in \mathcal{T}_{\alpha}$ and actions $\pi \in \mathcal{T}_{\pi}$. These are the *primitives* of the client theory. We refer to the Boolean algebra over the client theory as $\mathcal{T}^*_{\text{pred}} \subseteq \mathcal{T}^*$.

Our framework can provide results for \mathcal{T}^* in a pay-as-you-go fashion: given a notion of state and an interpretation for the predicates and actions of \mathcal{T} , we derive a trace semantics for \mathcal{T}^* (Sec. 3.1); if \mathcal{T} has a sound equational theory with respect to our semantics, so does \mathcal{T}^* (Sec. 3.2); if \mathcal{T} has a complete equational theory with respect to our semantics, and satisfies certain weakest precondition requirements, then \mathcal{T}^* has a complete equational theory (Sec. 3.4); and finally, with just a few lines of code defining the structure of \mathcal{T} , we can provide a decision procedure for equivalence (Sec. 4)using the normalization routine from completeness (Sec. 3.4).

The key to our general, parameterized proof is a novel *pushback* operation that generalizes weakest preconditions (Sec. 3.3.2): given an understanding of how to push primitive predicates back to the front of a term, we can normalize terms for our completeness proof (Sec. 3.4).

773 3.1 Semantics

772

784

The first step in turning the client theory \mathcal{T} into a KAT is to define a semantics (Fig. 13). We can 774 give any KAT a *trace semantics*: the meaning of a term is a trace t, which is a non-empty list of log 775 entries l. Each log entry records a state σ and (in all but the initial state) a primitive action π . The 776 client assigns meaning to predicates and actions by defining a set of states State and two functions: 777 one to determine whether a predicate holds (pred) and another to determine an action's effects 778 (act). To run a \mathcal{T}^* term on a state σ , we start with an initial state $\langle \sigma, \bot \rangle$; when we're done, we'll 779 have a set of traces of the form $\langle \sigma_0, \perp \rangle \langle \sigma_1, \pi_1 \rangle \dots$, where $\sigma_i = \operatorname{act}(\pi_i, \sigma_{i-1})$ for i > 0. (A similar 780 semantics shows up in Kozen's application of KAT to static analysis [37].) 781

A reader new to KATs should compare this definition with that of NetKAT or Temporal NetKAT [1,
 8]: defined recursively over the syntax, the denotation function collapses predicates and actions

744 745 746

747

748

749 750

785 786

787

788

789

790

791

792

793

794

795

796

797

798 799

800

801

802

803

804

805

806

807

808

809

810

811

812

813 814

820

821

822

823

833

Trace definitions \in State σ l ∈ Log $\langle \sigma, \bot \rangle \mid \langle \sigma, \pi \rangle$::= Trace = Log^+ t F **Trace semantics** Ø [0](t)= [1](t)= $\{t\}$ $[\alpha](t)$ $\{t \mid \operatorname{pred}(\alpha, t) = t\}$ = $\llbracket \neg a \rrbracket(t)$ = $\{t \mid \llbracket a \rrbracket(t) = \emptyset\}$ $\{t\langle\sigma',\pi\rangle \mid \sigma' = \operatorname{act}(\pi,\operatorname{last}(t))\}$ $[\pi](t)$ = $[[p]](t) \cup [[q]](t)$ [[p+q]](t)= $\llbracket p \cdot q \rrbracket(t)$ = $(\llbracket p \rrbracket \bullet \llbracket q \rrbracket)(t)$ $[p^*](t)$ = $\bigcup_{0 \leq i} \llbracket p \rrbracket^{l}(t)$ Kleene Algebra axioms **Boolean Algebra axioms** $p + (q + r) \equiv (p + q) + r$ **KA-Plus-Assoc** $p + q \equiv q + p$ KA-Plus-Comm KA-Plus-Zero $p + 0 \equiv p$ KA-Plus-Idem $p + p \equiv p$ $p \cdot (q \cdot r) \equiv (p \cdot q) \cdot r$ **KA-Seq-Assoc** KA-Seq-One $1 \cdot p \equiv p$ KA-One-Seq $p \cdot 1 \equiv p$ $p \cdot (q+r) \equiv p \cdot q + p \cdot r$ KA-DIST-L $(p+q) \cdot r \equiv p \cdot r + q \cdot r$ KA-DIST-R $0 \cdot p \equiv 0$ KA-Zero-Seq $p \cdot 0 \equiv 0$ KA-Seq-Zero $1 + p \cdot p^* \equiv p^*$ KA-UNROLL-L $1 + p^* \cdot p \equiv p \ast$ KA-UNROLL-R $q + p \cdot r \le r \rightarrow p^* \cdot q \le r$ KA-LFP-L $p + q \cdot r \leq q \rightarrow p \cdot r^* \leq q$ KA-LFP-R $p \le q \Leftrightarrow p + q \equiv q$

```
pred : \mathcal{T}_{\alpha} \times \text{Trace} \to \{t, f\}
            : \mathcal{T}_{\pi} \times \text{State} \to \text{State}
  act
```

$$\begin{split} \hline \llbracket - \rrbracket : \mathcal{T}^* &\to \mathrm{Trace} \to \mathcal{P}(\mathrm{Trace}) \\ (f \bullet g)(t) &= \bigcup_{t' \in f(t)} g(t') \\ f^0(t) &= \{t\} \qquad f^{i+1}(t) = (f \bullet f^i)(t) \\ \mathrm{last}(\dots \langle \sigma, _\rangle) &= \sigma \end{split}$$

$a + (b \cdot c) \equiv (a + b) \cdot (a + c)$ **BA-PLUS-DIST** $a + 1 \equiv 1$ **BA-Plus-One** BA-Excl-Mid $a + \neg a \equiv 1$ $a \cdot b \equiv b \cdot a$ ВА-Ѕео-Сомм BA-Contra $a \cdot \neg a \equiv 0$ BA-Seq-Idem $a \cdot a \equiv a$ Consequences $p \cdot a \equiv b \cdot p \iff p \cdot \neg a \equiv \neg b \cdot p$ PUSHBACK-NEG $p \cdot (q \cdot p)^* \equiv (p \cdot q)^* \cdot p$ SLIDING $(p+q)^* \equiv p^* \cdot (q \cdot p^*)^*$ Denesting $p \cdot a \equiv a \cdot q + r \rightarrow$ $p^* \cdot a \equiv (a + p^* \cdot r) \cdot q^*$ Star-Inv $p \cdot a \equiv a \cdot q + r \rightarrow$ $p \cdot a \cdot (p \cdot a)^* \equiv (a \cdot q + r) \cdot (q + r)^*$ STAR-EXPAND

Fig.	13.	Semantics	and	equational	theory	for	\mathcal{T}
· ·		00		equational			

into a single semantics, using Kleisli composition (written •) to give meaning to sequence and an infinite union and exponentiation (written $-^{n}$) to give meaning to Kleene star. We've generalized the way that predicates and actions work, though, deferring to two functions that must be defined by the client theory: pred and act.

The client's pred function takes a primitive predicate α and a trace – predicates can examine the 824 entire trace – returning true or false. When the pred function returns t, we return the singleton 825 set holding our input trace; when pred returns f, we return the empty set. (Composite predicates 826 follow this same pattern, always returning either a singleton set holding their input trace or the 827 empty set(Lemma 3.4).) It's acceptable for the pred function to recursively call the denotational 828 semantics, though we have skipped the formal detail here. This way we can define composite 829 primitive predicates as in, e.g., temporal logic (Sec. 2.7). 830

The client's act function takes a primitive action π and the last state in the trace, returning a new 831 state. Whatever new state comes out is recorded in the trace, along with the action just performed. 832

П

834 3.2 Soundness

Proving that the equational theory is sound is relatively straightforward: we only depend on the client's act and pred functions, and none of our KAT axioms (Fig. 13) even mention the client's primitives. Pushback negation is a novel KAT theorem (PUSHBACK-NEG); it generalizes the result that theorem that $b \cdot p \equiv p \cdot b \leftrightarrow b \cdot p \cdot \neg b + \neg b \cdot p \cdot b \equiv 0$ from Kozen [36].

Lemma 3.1 (Pushback negation (Pushback-Neg)). $p \cdot a \equiv b \cdot p \text{ iff } p \cdot \neg a \equiv \neg b \cdot p$.

PROOF. We show that both sides $p \cdot \neg a$ and $\neg b \cdot p$ are equivalent to $\neg b \cdot p \cdot \neg a$ by way of BA-Excl-MID:

$p \cdot \neg a \equiv$	$(b + \neg b) \cdot p \cdot \neg a$	(KA-Seq-One, BA-Excl-Mid)
≡	$b \cdot p \cdot \neg a + \neg b \cdot p \cdot \neg a$	(KA-Dist-L)
≡	$p \cdot a \cdot \neg a + \neg b \cdot p \cdot \neg a$	(assumption)
≡	$p \cdot 0 + \neg b \cdot p \cdot \neg a$	(BA-Contra)
≡	$\neg b \cdot p \cdot \neg a$	(KA-Plus-Comm, KA-Plus-Zero)
≡	$0 \cdot p + \neg b \cdot p \cdot \neg a$	(BA-Contra)
≡	$\neg b \cdot b \cdot p + \neg b \cdot p \cdot \neg a$	(assumption)
≡	$\neg b \cdot p \cdot a + \neg b \cdot p \cdot \neg a$	(KA-Dist-R)
≡	$\neg b \cdot p \cdot (a + \neg a)$	(KA-One-Seq, BA-Excl-Mid)
≡	$\neg b \cdot p$	

The other direction of the proof is symmetric, with the two terms meeting at
$$b \cdot p \cdot a$$
.

Our soundness proof naturally enough requires that any equations the client theory adds need to be sound in our trace semantics. We do need to use several KAT theorems in our completeness proof (Fig. 13, Consequences), the most complex being star expansion (STAR-EXPAND), which we take from Temporal NetKAT [8]; we believe PUSHBACK-NEG is a novel theorem that holds in all KATs.

Lemma 3.2 (Kleisli composition is associative). $\llbracket p \rrbracket \bullet (\llbracket q \rrbracket \bullet \llbracket r \rrbracket) = (\llbracket p \rrbracket \bullet \llbracket q \rrbracket) \bullet \llbracket r \rrbracket$.

⁸⁶² 863 PROOF. By direct computation.

Lemma 3.3 (Exponentiation commutes). $\llbracket p \rrbracket^{i+1} = \llbracket p \rrbracket^i \bullet \llbracket p \rrbracket$

PROOF. By induction on *i*. When i = 0, both yield [[p]]. In the inductive case, we compute:

866 $\llbracket p \rrbracket^{i+2} = \llbracket p \rrbracket \bullet \llbracket p \rrbracket^{i+1}$ 867 = $\llbracket p \rrbracket \bullet (\llbracket p \rrbracket^i \bullet \llbracket p \rrbracket)$ by the IH 868 = $(\llbracket p \rrbracket \bullet \llbracket p \rrbracket^i) \bullet \llbracket p \rrbracket$ by Lemma 3.2 869 = $(\llbracket p \rrbracket^{i+1}) \bullet \llbracket p \rrbracket$ by Lemma 3.2 870 871 872 LEMMA 3.4 (PREDICATES PRODUCE SINGLETON OR EMPTY SETS). $[[a]](t) \subseteq \{t\}$. 873 874 PROOF. By induction on *a*, leaving *t* general. 875 THEOREM 3.5 (SOUNDNESS OF \mathcal{T}^*). If \mathcal{T} 's equational reasoning is sound $(p \equiv_{\mathcal{T}} q \Rightarrow [\![p]\!] = [\![q]\!])$ 876 then \mathcal{T}^* 's equational reasoning is sound $(p \equiv q \Rightarrow \llbracket p \rrbracket = \llbracket q \rrbracket)$. 877 878 **PROOF.** By induction on the derivation of $p \equiv q$. 879 (KA-PLUS-ASSOC) We have $p + (q + r) \equiv (p + q) + r$; by associativity of union. 880 (KA-PLUS-COMM) We have $p + q \equiv q + p$; by commutativity of union. 881 882

1:18

840 841

842

854 855

856

857

858

859

860

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

(KA-PLUS-ZERO) We have $p + 0 \equiv p$; immediate, since $[0](t) = \emptyset$. 883 884 (KA-Plus-IDEM) By idempotence of union $p + p \equiv p$. 885 (KA-Seq-Assoc) We have $p \cdot (q \cdot r) \equiv (p \cdot q) \cdot r$; by Lemma 3.2. 886 (KA-SEQ-ONE) We have $1 \cdot p \equiv p$; immediate, since $[1](t) = \{t\}$. 887 888 (KA-ONE-SEQ) We have $p \cdot 1 \equiv p$; immediate, since $[1](t) = \{t\}$. 889 (KA-DIST-L) We have $p \cdot (q + r) \equiv p \cdot q + p \cdot r$; we compute: 890 $[\![p \cdot (q+r)]\!](t) = \bigcup_{t' \in [\![p]\!](t)} [\![q+r]\!](t')$ 891 $= \bigcup_{t' \in [[p]](t)} [[q]](t') \cup [[r]](t')$ 892 893 $= \bigcup_{t' \in [[p]](t)} [[q]](t') \cup \bigcup_{t' \in [[p]](t)} [[r]](t')$ 894 $= \llbracket p \cdot q \rrbracket(t) \cup \llbracket p \cdot r \rrbracket(t)$ 895 $= \llbracket p \cdot q + p \cdot r \rrbracket(t)$ 896 (KA-DIST-R) As for KA-DIST-L. 897 898 (KA-ZERO-SEQ) We have $0 \cdot p \equiv 0$; immediate, since $[0](t) = \emptyset$. 899 (KA-Seq-Zero) We have $p \cdot 0 \equiv 0$; immediate, since $[0](t) = \emptyset$. 900 (KA-UNROLL-L) We have $p^* \equiv 1 + p \cdot p^*$. We compute: 901 902 $[[p^*]](t) = \bigcup_{0 \le i} [[p]]^i(t)$ 903 $= [\![1]\!](t) \cup \bigcup_{1 \leq i} [\![p]\!]^i(t)$ 904 $= [[1]](t) \cup [[p]](t) \cup \bigcup_{2 \le i} [[p]]^{i}(t))$ 905 $= [[1]](t) \cup ([[p]] \bullet [[1]])(t) \cup \bigcup_{1 \le i} ([[p]] \bullet [[p]]^{i})(t)$ 906 $= \llbracket 1 \rrbracket (t) \cup (\llbracket p \rrbracket \bullet \llbracket 1 \rrbracket) (t') \cup (\llbracket p \rrbracket \bullet \bigcup_{1 \le i} \llbracket p \rrbracket^{i}) (t)$ 907 $= [[1]](t) \cup ([[p]]] \bullet \bigcup_{0 \le i} [[p]]^{i})(t)$ 908 $= [[1]](t) \cup [[p \cdot p^*]](t))$ 909 $= [1 + p \cdot p^*](t)$ 910 911 (KA-UNROLL-R) As for KA-UNROLL-L. 912 (KA-LFP-L) We have $p^* \cdot q \leq r$, i.e., $p^* \cdot q + r \equiv r$. By the IH, we know that $[\![q]\!](t) \cup ([\![p]\!] \bullet [\![r]\!])(t) \cup ([\![p]\!] \bullet [\![r]\!])(t)$ 913 [[r]](t) = [[r]](t). We show, by induction on *i*, that $([[p]]^i \bullet [[q]])(t) \cup [[r]](t) = [[r]](t)$. 914 (i = 0) We compute: 915 916 $(\llbracket p \rrbracket^0 \bullet \llbracket q \rrbracket)(t) \cup \llbracket r \rrbracket(t)$ 917 $= ([[1]] \bullet [[q]])(t) \cup [[r]](t)$ 918 $= [[q]](t) \cup [[r]](t)$ 919 $= [[q]](t) \cup ([[q]](t) \cup ([[p]] \bullet [[r]])(t) \cup [[r]]) \text{ by the outer IH}$ 920 $= [[q]](t) \cup ([[p]] \cdot [[r]])(t) \cup [[r]](t)$ 921 = [[r]](t) by the outer IH again 922 923 (i = i' + 1) We compute: 924 $(\llbracket p \rrbracket^{i'+1} \bullet \llbracket q \rrbracket)(t) \cup \llbracket r \rrbracket(t)$ 925 $= (\llbracket p \rrbracket \bullet \llbracket p \rrbracket^{i'} \bullet \llbracket q \rrbracket)(t) \cup \llbracket r \rrbracket(t)$ 926 $= (\llbracket p \rrbracket \bullet \llbracket p \rrbracket)^{i'} \bullet \llbracket q \rrbracket)(t) \cup (\llbracket q \rrbracket(t) \cup (\llbracket p \rrbracket \bullet \llbracket r \rrbracket)(t) \cup \llbracket r \rrbracket(t))$ by the outer IH 927 $= \bigcup_{t' \in [[p]](t)} (\bigcup_{t'' \in [[p]]^{i'}(t')} [[q]](t') \cup [[r]](t')) \cup ([[q]](t) \cup [[r]](t))$ 928 $= ([[p]] \bullet [[r]])(t) \cup ([[q]](t) \cup [[r]](t))$ by the inner IH 929 = [[r]](t) by the outer IH again 930 931

1:19

Michael Greenberg, Ryan Beckett, and Eric Campbell

 $\llbracket p^* \cdot q + r \rrbracket(t) = (\bigcup_{0 \le i} \llbracket p \rrbracket)^i \bullet \llbracket q \rrbracket)(t) \cup \llbracket r \rrbracket(t) = \bigcup_{0 \le i} (\llbracket p \rrbracket)^i \bullet \llbracket q \rrbracket)(t) \cup \llbracket r \rrbracket(t)) = \bigcup_{0 \le i} \llbracket r \rrbracket(t) = \llbracket r \rrbracket(t)$ 934 935 (KA-LFP-R) As for KA-LFP-L. 936 (BA-PLUS-DIST) We have $a + (b \cdot c) \equiv (a + b) \cdot (a + c)$. We have $\llbracket a + (b \cdot c) \rrbracket (t) = \llbracket a \rrbracket (t) \cup (\llbracket b \rrbracket \bullet \llbracket c \rrbracket) (t)$. 937 By Lemma 3.4, we know that each of these denotations produces either $\{t\}$ or \emptyset , 938 where \cup is disjunction and \bullet is conjunction. By distributivity of these operations. 939 940 (BA-PLUS-ONE) We have $a + 1 \equiv 1$; we have this directly by Lemma 3.4. 941 (BA-ExcL-MID) We have $a + \neg a \equiv 1$; we have this directly by Lemma 3.4 and the definition of 942 negation. 943 (BA-SEQ-COMM) $a \cdot b \equiv b \cdot a$; we have this directly by Lemma 3.4 and unfolding the union. 944 (BA-CONTRA) We have $a \cdot \neg a \equiv 0$; we have this directly by Lemma 3.4 and the definition of 945 negation. 946 947 (BA-SEQ-IDEM) $a \cdot a \equiv a$; we have this directly by Lemma 3.4 and unfolding the union. 948 949 For the duration of Sec. 3, we assume that any equations \mathcal{T} adds are sound and, so, \mathcal{T}^* is sound by 950 Theorem 3.5. 951 952 3.3 Normalization via pushback 953 In order to prove completeness (Sec. 3.4), we reduce our KAT terms to a more manageable subset 954 of normal forms. Normalization happens via a generalization of weakest preconditions; we use 955 a *pushback* operation to translate a term p into an equivalent term of the form $\sum a_i \cdot m_i$ where 956 each m_i does not contain any tests. Once in this form, we can use the completeness result provided 957 by the client theory to reduce the completeness of our language to an existing result for Kleene 958 algebra. 959 In order to use our general normalization procedure, the client theory \mathcal{T} must define two things: 960 (1) a way to extract subterms from predicates, to define an ordering on predicates that serves as 961 the termination measure on normalization (Sec. 3.3.1); and 962 (2) weakest preconditions for primitives (Sec. 3.3.2). 963 964 Once we've defined our normalization procedure, we can use it prove completeness (Sec. 3.4). 965 3.3.1 Normalization and the maximal subterm ordering. Our normalization algorithm works by 966 "pushing back" predicates to the front of a term until we reach a normal form with *all* predicates at 967 the front. The pushback algorithm's termination measure is a complex one. For example, pushing a 968 predicate back may not eliminate the predicate even though progress was made in getting predicates 969 to the front. More trickily, it may be that pushing test *a* back through π yields $\sum a_i \cdot \pi$ where each 970 of the a_i is a copy of some subterm of *a*-and there may be *many* such copies! 971 Let the set of *restricted actions* \mathcal{T}_{RA} be the subset of \mathcal{T}^* where the only test is 1. We will use 972 metavariables m, n, and l to denote elements of \mathcal{T}_{RA} . Let the set of normal forms \mathcal{T}_{nf}^* be a set of 973 pairs of tests $a_i \in \mathcal{T}_{pred}^*$ and restricted actions $m_i \in \mathcal{T}_{RA}$. We will use metavariables t, u, v, w, x, y, 974 and z to denote elements of \mathcal{T}_{nf}^* ; we typically write these sets not in set notation, but as sums, i.e., 975 $x = \sum_{i=1}^{k} a_i \cdot m_i$ means $x = \{(a_1, m_1), (a_2, m_2), \dots, (a_k, m_k)\}$. The sum notation is convenient, but 976 it is important that normal forms really be treated as sets-there should be no duplicated terms in 977 the sum. We write $\sum_i a_i$ to denote the normal form $\sum_i a_i \cdot 1$. We will call a normal form *vacuous* 978 when it is the empty set (i.e., the empty sum, which we interpret conventionally as 0) or when 979 980

932 933 So, finally, we have:

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.



Fig. 14. Maximal tests and the maximal subterm ordering

all of its tests are 0. The set of normal forms, \mathcal{T}_{nf}^* , is closed over parallel composition by simply joining the sums. The fundamental challenge in our normalization method is to define sequential composition and Kleene star on \mathcal{T}_{nf}^* .

The definitions for the maximal subterm ordering are complex (Fig. 14), but the intuition is: seqs gets all the tests out of a predicate; tests gets all the predicates out of a normal form; sub gets subterms; mt gets "maximal" tests that cover a whole set of tests; we lift mt to work on normal forms by extracting all possible tests; the relation $x \leq y$ means that y's maximal tests include all of x's maximal tests. Maximal tests indicate which test to push back next in order to make progress towards normalization. For example, the subterms of $\langle x > 1$ are defined by the client theory (Sec. 2.5) as { $\langle x > 1, x > 1, x > 0, 1, 0$ }, which represents the possible tests that might be generated pushing back $\langle x > 1$; the maximal tests of $\langle x > 1$ are just { $\langle x > 1$ }; the maximal tests of the set { $\langle x > 1, x > 0, y > 6$ } are { $\langle x > 1, y > 6$ } since these tests are not subterms of any other test. Therefore, we can choose to push back either of $\langle x > 1$ or y > 6 next and know that we will continue making progress towards normalization.

1020 Lemma 3.6 (Terms are subterms of themselves). $a \in sub(a)$

PROOF. By induction on *a*. All cases are immediate except for $\neg a$, which uses the IH.

Lemma 3.7 (0 is a subterm of all terms). $0 \in sub(a)$

¹⁰²⁵ PROOF. By induction on *a*. The cases for 0, 1, and α are immediate; the rest of the cases follow ¹⁰²⁶ by the IH.

LEMMA 3.8 (MAXIMAL TESTS ARE TESTS). $mt(A) \subseteq seqs(A)$ for all sets of tests A.

PROOF. We have by definition: $mt(A) = \{b \in seqs(A) \mid \forall c \in seqs(A), c \neq b \Rightarrow b \notin sub(c)\}$ \subseteq seqs(A) LEMMA 3.9 (MAXIMAL TESTS CONTAIN ALL TESTS). $seqs(A) \subseteq sub(mt(A))$ for all sets of tests A. **PROOF.** Let an $a \in \text{seqs}(A)$ be given; we must show that $a \in \text{sub}(\text{mt}(A))$. If $a \in \text{mt}(A)$, then $a \in sub(mt(A))$ (Lemma 3.6). If $a \notin mt(A)$, then there must exist a $b \in mt(A)$ such that $a \in sub(b)$. But in that case, $a \in sub(b) \cup \bigcup_{a \in mt(A) \setminus \{b\}} sub(mt(a))$, so $a \in sub(mt(A))$. LEMMA 3.10 (seqs distributes over union). $seqs(A \cup B) = seqs(A) \cup seqs(B)$ PROOF. We compute: $\begin{aligned} \operatorname{seqs}(A \cup B) &= \bigcup_{c \in A \cup B} \operatorname{seqs}(c) \\ &= \bigcup_{c \in A} \operatorname{seqs}(c) \cup \bigcup_{c \in B} \operatorname{seqs}(c) \\ &= \operatorname{seqs}(A) \cup \operatorname{seqs}(B) \end{aligned}$ LEMMA 3.11 (seqs is idempotent). seqs(a) = seqs(seqs(a))**PROOF.** By induction on *a*. We can lift Lemma 3.11 to sets of terms, as well. LEMMA 3.12 (SEQUENCE EXTRACTION). If seqs(a) = $\{a_1, \ldots, a_k\}$ then $a \equiv a_1 \cdot \ldots \cdot a_k$. **PROOF.** By induction on *a*. The only interesting case is when $a = b \cdot c$. We have: $\{a_1, \ldots, a_k\} = \operatorname{seqs}(a) = \operatorname{seqs}(b \cdot c) = \operatorname{seqs}(b) \cup \operatorname{seqs}(c).$ Furthermore, seqs(*b*) (resp. seqs(*c*)) is equal to some subset of the $a_i \in seqs(a)$, such that seqs(*b*) \cup seqs(c) = seqs(a). By the IH, we know that $b \equiv \prod_{b_i \in seqs(b)} b_i$ and $c \equiv \prod_{c_i \in seqs(c)} c_i$, so we have: $= \left(\prod_{b_i \in \text{seqs}(b)} b_i\right) \cdot \left(\prod_{b_i \in \text{seqs}(b)} b_i\right) \quad \text{(BA-SEQ-IDEM)}$ $= \prod_{a_i \in \text{seqs}(b) \cup \text{seqs}(c)} a_i \quad \text{(BA-SEQ-COMM)}$ $= \prod_{i=1}^k a_i$ $a \equiv b \cdot c$ COROLLARY 3.13 (MAXIMAL TESTS ARE INVARIANT OVER TESTS). mt(A) = mt(seqs(A))**PROOF.** We compute: $\mathsf{mt}(A) = \{b \in \mathsf{seqs}(A) \mid \forall c \in \mathsf{seqs}(A), c \neq b \Longrightarrow b \notin \mathsf{sub}(c)\}$ (Lemma 3.11) $= \{b \in \operatorname{seqs}(\operatorname{seqs}(A)) \mid \forall c \in \operatorname{seqs}(\operatorname{seqs}(A)), c \neq b \Longrightarrow b \notin \operatorname{sub}(c)\}$ = mt(seqs(A)) LEMMA 3.14 (SUBTERMS ARE CLOSED UNDER SUBTERMS). If $a \in sub(b)$ then $sub(a) \subseteq sub(b)$. **PROOF.** By induction on *b*, letting some $a \in sub(b)$ be given.

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

LEMMA 3.15 (SUBTERMS DECREASE IN SIZE). If $a \in sub(b)$, then either $a \in \{0, 1, b\}$ or a comes before b in the global well ordering.

PROOF. By induction on *b*.

LEMMA 3.16 (MAXIMAL TESTS ALWAYS EXIST). If A is a non-empty set of tests, then $mt(A) \neq \emptyset$.

PROOF. We must show there exists at least one term in mt(A).

If seqs(A) = $\{a\}$, then a is a maximal test. If seqs(A) = $\{0, 1\}$, then 1 is a maximal test. If seqs(A) = $\{0, 1, \alpha\}$, then α is a maximal test. If seqs(A) isn't any of those, then let aseqsA be the term that comes last in the well ordering on predicates.

To see why $a \in mt(A)$, suppose (for a contradiction) we have $b \in mt(A)$ such $b \neq a$ and $a \in sub(b)$. By Lemma 3.15, either $a \in \{0, 1, b\}$ or a comes before b in the global well ordering. We've ruled out the first two cases above. If a = b, then we're fine-a is a maximal test. But if a comes before b in the well ordering, we've reached a contradiction, since we selected *a* as the term which comes latest in the well ordering.

As a corollary, note that a maximal test exists even for vacuous normal forms, where $mt(x) = \{0\}$ when *x* is vacuous.

LEMMA 3.17 (MAXIMAL TESTS GENERATE SUBTERMS). $sub(mt(A)) = \bigcup_{a \in seas(A)} sub(a)$

PROOF. Since $mt(A) \subseteq seqs(A)$ (Lemma 3.8), we can restate our goal as:

$$\operatorname{sub}(\operatorname{mt}(A)) = \bigcup_{a \in \operatorname{mt}(A)} \operatorname{sub}(a) \cup \bigcup_{a \in \operatorname{seqs}(A) \setminus \operatorname{mt}(A)} \operatorname{sub}(a)$$

We have $sub(mt(A)) = \bigcup_{a \in mt(A)} sub(a)$ by definition; it remains to see that the latter union is subsumed by the former; but we have $seqs(A) \subseteq sub(mt(A))$ by Lemma 3.9.

LEMMA 3.18 (UNION DISTRIBUTES OVER MAXIMAL TESTS). $sub(mt(A \cup B)) = sub(mt(A)) \cup sub(mt(B))$

PROOF. We compute:

$$sub(mt(A \cup B)) = \bigcup_{a \in seqs(A \cup B)} sub(a)$$
(Lemma 3.17)
$$= \bigcup_{a \in seqs(A) \cup seqs(B)} sub(a)$$

$$= \left[\bigcup_{a \in seqs(A)} a \right] \cup \left[\bigcup_{b \in seqs(B)} sub(b) \right]$$

$$= sub(mt(A)) \cup sub(mt(B))$$
(Lemma 3.17)

LEMMA 3.19 (MAXIMAL TESTS ARE MONOTONIC). If $A \subseteq B$ then sub(mt(A)) \subseteq sub(mt(B)).

PROOF. We have
$$sub(mt(B)) = sub(mt(A \cup B)) = sub(mt(A)) \cup sub(mt(B))$$
 (by Lemma 3.18).

COROLLARY 3.20 (SEQUENCES OF MAXIMAL TESTS). $sub(mt(a \cdot b)) = sub(mt(a)) \cup sub(mt(b))$

PROOF.

1121	SI	$ub(mt(c \cdot d))$	
1122	= si	$ub(mt(seqs(c \cdot d)))$	(Corollary 3.13)
1123	= si	$ub(mt(seqs(c) \cup seqs(d)))$	
1124	= si	$ub(mt(seqs(c))) \cup sub(mt(seqs(d)))$	(distributivity; Lemma 3.18)
1125	= si	$ub(mt(c)) \cup sub(mt(d))$	(Corollary 3.13)
1126			

Michael Greenberg, Ryan Beckett, and Eric Campbell

1128 1129			$nnf:\mathcal{T}^*_{pred}\to\mathcal{T}^*_{pred}$
1130			
1131	nnf(0) = 0	$nnf(\neg 0)$	= 1
1132	nnf(1) = 1	$nnf(\neg 1)$	= 0
1133	$nnf(\alpha) = \alpha$	$nnf(\neg \alpha)$	$= \neg \alpha$
1134	nnf(a+b) = nnf(a) + nnf(b)	$nnf(\neg \neg a)$	= nnf(a)
1135	$\operatorname{nnf}(a \cdot b) = \operatorname{nnf}(a) \cdot \operatorname{nnf}(b)$	$nnt(\neg(a+b))$	$= nnf(\neg a) \cdot nnf(\neg b)$ $= nnf(\neg a) + nnf(\neg b)$
1136		$nnt(\neg(a \cdot b))$	$= \operatorname{nnf}(\neg a) + \operatorname{nnf}(\neg b)$
1137			
1138	Fig. 15. Neg	gation normal form	
1139			
1140	To handle negation, we translate predicate	es into a <i>negation normal</i>	form where only primitive
1141	predicates α can be negated (Figure 15). The	e translation nnf uses D	e Morgan's laws to push
1142	negations inwards. These possibly negated pro-	edicates are commonly cal	lled "atoms". In our setting,
1143	it is important that negation normal form is r	nonotonic in the maximal	subterm ordering (\leq).
1144	LENGA 2 21 (NECATION NORMAL FORM IC)	(1) (1) (1) (1) (1) (1) (1) (1) (1) (1) (1)	$nnf(-a) \prec -h$
1145	LEMMA 5.21 (NEGATION NORMAL FORM IS M	$ONOTONIC). If u \leq v then$	$\min(\neg a) \leq \neg b.$
1146	PROOF. By induction on <i>a</i> .		
114/	$(a = 0)$ We have nnf $(\neg 0) = 1$ and $1 \leq$	$\neg b$ by definition.	
1140	$(a = 1)$ We have nnf $(\neg 1) = 0$ and $0 \le$	$\neg b$ by definition.	
1150	$(a = \alpha)$ We have $nnf(\neg \alpha) = \neg \alpha$; since	ce $a \leq b$, it must be that	$\alpha \in \operatorname{sub}(\operatorname{mt}(b))$, so $\neg \alpha \in$
1151 1152	$\operatorname{sub}(\operatorname{mt}(\neg b))$. We have $\alpha \in \operatorname{sub}(\neg b)$	$b(\neg b)$, since $\alpha \in sub(b)$.	
1153 1154	$(a = \neg c)$ We have $nnf(\neg \neg c) = nnf(c)$ $sub(mt(b))$, so $nnf(c) \le \neg b$ by	since $c \in sub(a)$ and a the IH.	$\leq b$, it must be that $c \in$
1155 1156	$(a = c + d)$ We have $nnf(\neg(c + d)) = nnf$ $a \le b, \neg c$ and $\neg d$ must be in s	$(\neg c) \cdot \operatorname{nnf}(\neg d)$; since <i>c</i> an ub(mt($\neg b$)), and we are d	d d are subterms of a and one by the IHs.
1157 1158	$(a = c \cdot d)$ We have $nnf(\neg(c \cdot d)) = nnf(a \leq b, \neg c \text{ and } \neg d \text{ must be in s})$	$(\neg c) + nnf(\neg d)$; since c an $ub(mt(\neg b))$ and we are d	Id <i>d</i> are subterms of <i>a</i> and one by the IHs
1159		ub(int(¹⁰)), and we are a	
1160			
1161	Lemma 3.22 (Normal form ordering). For	r all tests a, b, c and norma	l forms x, y, z, the following
1162	inequalities hold:		
1163	(1) $a \leq a \cdot b$ (extension);		
1164	(2) if $a \in \text{tests}(x)$, then $a \leq x$ (subsumption));	
1165	(3) $x \approx \sum_{a \in \text{tests}(x)} a$ (equivalence);		
1166	(4) if $x \le x'$ and $y \le y'$, then $x + y \le x' + y$	y' (normal-form parallel co	ongruence);
1167	(5) if $x + y \le z$, then $x \le z$ and $y \le z$ (invert	rsion);	
1168	(6) if $a \le a'$ and $b \le b'$, then $a \cdot b \le a' \cdot b'$	(test sequence congruence);	;
1169	(7) if $a \le x$ and $b \le x$ then $a \cdot b \le x$ (test be	ounding);	
1170	(8) if $a \le b$ and $x \le c$ then $a \cdot x \le b \cdot c$ (mix	<i>ced sequence congruence);</i>	
1171	(9) If $a \le b$ then $nnt(\neg a) \le \neg b$ (negation no	ormal-form monotonic).	
1173	Each of the above equalities also hold replacing	$g \leq with \prec$, excluding the e	equivalence (3).
1174	PROOF. We prove each properly independe	ntly and in turn. Each pro	operty can be proved using
1175	the foregoing lemmas and set-theoretic reaso	ning.	

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

1178

1189

1196 1197

1198

1199

1200

1201

1202

1203 1204

1205 1206

1207

1208

LEMMA 3.23 (TEST SEQUENCE SPLIT). If $a \in mt(c)$ then $c \equiv a \cdot b$ for some $b \prec c$. 1177

PROOF. We have $a \in seqs(c)$ by definition. Suppose $seqs(c) = \{a, c_1, \ldots, c_k\}$. By sequence 1179 extraction, we have $c \equiv a \cdot c_1 \cdot \cdots \cdot c_k$ (Lemma 3.12). So let $b = c_1 \cdot \cdots \cdot c_k$; we must show b < c, i.e., 1180 $sub(mt(b)) \subsetneq sub(mt(c))$. Note that $\{c_1, \ldots, c_k\} = seqs(b)$. We find: 1181

 $sub(mt(b)) \subseteq sub(mt(c))$ (Corollary 3.13) $sub(mt(seqs(b))) \subseteq sub(mt(seqs(c)))$ $sub(mt(\{c_1, \dots, c_k\})) \subseteq sub(mt(\{a, c_1, \dots, c_k\}))$ (distributivity; Lemma 3.18) $\bigcup_{i=1}^k sub(mt(\{c_i\})) \subseteq sub(mt(a)) \cup \bigcup_{i=1}^k sub(mt(\{c_i\}))$ 1182 1183 1184 1185 1186 1187 1188

Since $a \in mt(c)$, we know that $a \notin sub(mt(c_i))$ for all *i*. But terms are subterms of themselves 1190 (Lemma 3.6), so $a \in sub(a) = sub(mt(a))$. 1191

1192 LEMMA 3.24 (MAXIMAL TEST INEQUALITY). If $a \in mt(y)$ and $x \leq y$ then either $a \in mt(x)$ or x < y. 1193

PROOF. Since $a \in mt(y)$, we have $a \in sub(mt(y))$. Since $x \leq y$, we know that $sub(mt(x)) \subseteq$ 1194 sub(mt(y)). We go by cases on whether or not $a \in mt(x)$: 1195

 $(a \in mt(x))$ We are done immediately.

 $(a \notin mt(x))$ In this case, we show that $a \notin sub(mt(x))$ and therefore $x \prec y$. Suppose, for a contradiction, that $a \in sub(mt(x))$. Since $a \notin mt(x)$, there must exist some $b \in a$ sub(mt(x)) where $a \in sub(b)$. But since $x \leq y$, we must also have $b \in sub(mt(y))$... and so it couldn't be that case that $a \in mt(y)$). We can conclude that it must, then, be the case that $a \notin sub(mt(x))$ and so $x \prec y$.

We can take a normal form x and *split* it around a maximal test $a \in mt(x)$ such that we have a pair of normal forms: $a \cdot y + z$, where both y and z are smaller than x in our ordering, because a (1) appears at the front of y and (2) doesn't appear in z at all.

LEMMA 3.25 (SPLITTING). If $a \in mt(x)$, then there exist y and z such that $x \equiv a \cdot y + z$ and y < xand $z \prec x$.

PROOF. Suppose $x = \sum_{i=1}^{k} c_i \cdot m_i$. We have $a \in mt(x)$, so, in particular:

$$a \in \operatorname{seqs}(\operatorname{tests}(x)) = \operatorname{seqs}(\operatorname{tests}(\sum_{i=1}^k c_i \cdot m_i)) = \operatorname{seqs}(\{c_1, \ldots, c_k\}) = \bigcup_{i=1}^k \operatorname{seqs}(c_i)$$

That is, $a \in seqs(c_i)$ for at least one *i*. We can, without loss of generality, rearrange *x* into two sums, 1214 where the first *j* elements have *a* in them but the rest don't, i.e., $x \equiv \sum_{i=1}^{j} c_i \cdot m_i + \sum_{i=j+1}^{k} c_i \cdot m_i$ 1215 where $a \in seqs(c_i)$ for $1 \le i \le j$ but $a \notin seqs(c_i)$ for $j + 1 \le i \le k$. By subsumption (Lemma 3.22), 1216 we have $c_i \leq x$. Since $a \in mt(x)$, it must be that $a \in mt(c_i)$ for $1 \leq i \leq j$ (instantiating Lemma 3.24) 1217 with the normal form $c_i \cdot 1$). By test sequence splitting (Lemma 3.23), we find that $c_i \equiv a \cdot b_i$ with 1218 $b_i < c_i \leq x$ for $1 \leq i \leq j$, as well. 1219

We are finally ready to produce *y* and *z*: they are the first *j* tests with *a* removed and the remaining 1220 tests which never had a, respectively. Formally, let $y = \sum_{i=1}^{J} b_i \cdot m_i$; we immediately have that 1221 $a \cdot y \equiv \sum_{i=1}^{j} c_i \cdot m_i$; let $z = \sum_{i=j+1}^{k} c_i \cdot m_i$. We can conclude that $x \equiv a \cdot y + z$. 1222

It remains to be seen that y < x and z < x. The argument is the same for both; presenting it 1223 for y, we have $a \notin seqs(y)$ (because of sequence splitting), so $a \notin sub(mt(y))$. But we assumed 1224 1225

 $a \in mt(x)$, so $a \in sub(mt(x))$, and therefore $y \prec x$. The argument for z is nearly identical but needs no recourse to sequence splitting—we never had any $a \in seqs(c_i)$ for $j + 1 \le i \le k$. □

Splitting is the key lemma for making progress pushing tests back, allowing us to take a normal
 form and slowly push its maximal tests to the front; its proof follows from a chain of lemmas given
 in the supplementary material.

Pushback. In order to define normalization—necessary for completeness (Sec. 3.4)—the client theory must have a *weakest preconditions* operation that respects the subterm ordering.

1235 Definition 3.26 (Weakest preconditions). The weakest precondition operation of the client theory is 1236 a relation $WP \subseteq \mathcal{T}_{\pi} \times \mathcal{T}_{\alpha} \times \mathcal{P}(\mathcal{T}_{\text{pred}}^*)$, where \mathcal{T}_{π} are the primitive actions and \mathcal{T}_{α} are the primitive 1237 predicates of \mathcal{T} . We write the relation as $\pi \cdot \alpha$ WP $\sum a_i \cdot \pi$ and read it as " α pushes back through π 1238 to yield $\sum a_i \cdot \pi$ "; the second π is redundant but written for clarity. We require that if $\pi \cdot \alpha$ WP 1239 $\{a_1, \ldots, a_k\} \cdot \pi$, then $\pi \cdot \alpha \equiv \sum_{i=1}^k a_i \cdot \pi$, and $a_i \leq \alpha$.

Given the client theory's weakest-precondition relation WP, we define a normalization procedure for \mathcal{T}^* by extending the client's WP relation to a more general *pushback* relation, PB (Fig. 16). The client's WP relation need not be a function, nor do the a_i need to be obviously related to α or π in any way. Even when the WP relation is a function, the PB relation will generally not be a function. While WP computes the classical weakest precondition, the PB relations do something different: when pushing back we have the freedom to *change the program itself*—not normally an option for weakest preconditions (see Sec. 6).

We define the top-level normalization routine with the *p* norm *x* relation (Fig. 16), a syntax directed relation that takes a term *p* and produces a normal form $x = \sum_i a_i m_i$. Most syntactic forms are easy to normalize: predicates are already normal forms (PRED); primitive actions π are normal forms where there's just one summand and the predicate is 1 (ACT); and parallel composition of two normal forms means just joining the sums (PAR). But sequence and Kleene star are harder: we define judgments using PB to lift these operations to normal forms (SEQ, STAR).

For sequences, we can recursively take $p \cdot q$ and normalize p into $x = \sum a_i \cdot m_i$ and q into $y = \sum b_j \cdot n_j$. But how can we combine x and y into a new normal form? We can concatenate and rearrange the normal forms to get $\sum_{i,j} a_i \cdot m_i \cdot b_j \cdot n_j$. If we can push b_j back through m_i to find some new normal form $\sum c_k \cdot l_k$, then $\sum_{i,j,k} a_i \cdot c_k \cdot l_k \cdot n_j$ is a normal form (JOIN); we write $x \cdot y \text{ PB}^J z$ to mean that the concatenation of x and y is equivalent to the normal form z—the \cdot is suggestive notation, as are other operators that appear on the left-hand side of the PB judgments.

For Kleene star, we can take p^* and normalize p into $x = \sum a_i \cdot m_i$, but x^* isn't a normal form—we 1260 need to somehow move all of the tests out of the star and to the front. We do so with the PB* 1261 relation (Fig. 16), writing $x^* PB^* y$ to mean that the Kleene star of x is equivalent to the normal 1262 form y-the * on the left is again suggestive notation. The PB* relation is more subtle than PB^J. 1263 There are four possible ways to treat x, based on how it splits (Lemma 3.25): if x = 0, then our work 1264 is trivial since $0^* \equiv 1$ (STARZERO); if x splits into $a \cdot x'$ where a is a maximal test and there are no 1265 other summands, then we can either use the KAT sliding lemma (Lemma 3.29)to pull the test out 1266 when a is strictly the largest test in x (SLIDE) or by using the KAT expansion lemma (Lemma 3.32) 1267 otherwise (EXPAND); if x splits into $a \cdot x' + z$, we use the KAT denesting lemma (Lemma 3.30)to 1268 pull *a* out before recurring on what remains (DENEST). 1269

The bulk of the pushback's work happens in the PB[•] relation, which pushes a test back through a restricted action; PB^R and PB^T use PB[•] to push tests back through normal forms and normal forms back through restricted actions, respectively. We write $m \cdot a$ PB[•] y to mean that pushing the test a back through restricted action m yields the equivalent normal form y. The PB[•] relation

1274

Kleene Algebra Modulo Theories



¹³¹⁶ works by analyzing both the action and the test. The client theory's WP relation is used in PB[•] ¹³¹⁷ when we try to push a primitive predicate α through a primitive action π (PRIM); all other KAT ¹³¹⁸ predicates can be handled by rules matching on the action or predicate structure, deferring to ¹³¹⁹ other PB relations. To handle negation, the function nnf translates predicates to *negation normal* ¹³²⁰ *form*, where negations only appear on primitive predicates (Fig. 15); PUSHBACK-NEG justifies the ¹³²¹ PRIMNEG case(PUSHBACK-NEG); we use nnf to respect the maximal subterm ordering.

Definition 3.27 (Negation normal form). The negation normal form of a term p is a term p' such 1324 that $p \equiv p'$ and negations occur only on primitive predicates in p'. 1325

LEMMA 3.28 (Terms are equivalent to their negation-normal forms). $nnf(p) \equiv p$ and nnf(p) is in negation normal form.

1329 **PROOF.** By induction on the size of p. The only interesting case is when $p = \neg a$; we go by cases 1330 on a. 1331

(a = 0) We have $\neg 0 \equiv 1$ immediately, and the latter is clearly negation free.

(a = 1) We have $\neg 1 \equiv 0$; as above.

- $(a = \alpha)$ We have $\neg alpha$, which is in normal form.
- 1335 (a = b + c) We have $\neg(b + c) \equiv \neg b \cdot \neg c$ as a consequence of BA-ExcL-MID and soundness 1336 (Theorem 3.5). By the IH on $\neg b$ and $\neg c$, we find that $nnf(\neg b) \equiv \neg b$ and $nnf(\neg c) \equiv b$ 1337 $\neg c$ —where the left-hand sides are negation normal. So transitively, we have $\neg (b + b) = b$ 1338 c) = nnf($\neg b$) · nnf($\neg c$), and the latter is negation normal. 1339
 - $(a = b \cdot c)$ We have $\neg (b \cdot c) \equiv \neg b + \neg c$ as a consequence of BA-ExcL-MID and soundness (Theorem 3.5). By the IH on $\neg b$ and $\neg c$, we find that $nnf(\neg b) \equiv \neg b$ and $nnf(\neg c) \equiv b$ $\neg c$ —where the left-hand sides are negation normal. So transitively, we have $\neg (b \cdot c) \equiv$ $nnf(\neg b) + nnf(\neg c)$, and the latter is negation normal.

1344 To elucidate the way PB[•] handles structure, suppose we have the term $(\pi_1 + \pi_2) \cdot (\alpha_1 + \alpha_2)$. One of 1345 two rules could apply: we could split up the tests and push them through individually (SEQPARTEST), 1346 or we could split up the actions and push the tests through together (SEOPARACTION). It doesn't 1347 particularly matter which we do first: the next step will almost certainly be the other rule, and in 1348 any case the results will be equivalent from the perspective of our equational theory. It *could* be 1349 the case that choosing a one rule over another could give us a smaller term, which might yield a 1350 more efficient normalization procedure. Similarly, a given normal form may have more than one 1351 maximal test-and therefore be splittable in more than one way (Lemma 3.25)-and it may be that 1352 different splits produce more or less efficient terms. We haven't yet studied differing strategies for 1353 pushback. 1354

LEMMA 3.29 (SLIDING). $p \cdot (q \cdot p)^* \equiv (p \cdot q)^* \cdot p$.

PROOF. Following Kozen [35], as a corollary of a related result: if $p \cdot x \equiv x \cdot q$ then $p^* \cdot x \equiv x \cdot q^*$. We prove this separate property by mutual inclusion.

1359	(⇒) We use KA-LFP-L with $p = p$ and $q = x$ and $r = x \cdot q^*$. We must show that $x + p \cdot x \cdot q^* \le x \cdot q^*$
1360	to find $p^* \cdot x \leq x \cdot q^*$.
1361	If $p \cdot q < x \cdot q$ then $p \cdot x \cdot q^* < x \cdot q \cdot q^*$ by monotonicity. We have $x + x \cdot q \cdot q^* < x \cdot q^*$ by
1362	KA-UNROLL-L and KA-PLUS-IDEM. Therefore $x + p \cdot x \cdot q^* \le x + x \cdot q \cdot q^* \le x \cdot q^*$, as desired
1363	(\leftarrow) This case is symmetric to the first using P rules instead of I rules. We apply KA I FP P
1364	(\leftarrow) This case is symmetric to the first, using "K fulles instead of "L fulles. We apply KA-Lift" with $p = r$ and $r = a$ and $a = p^* \cdot r$. We must show $r \perp p^* \cdot r$, $a \leq p^* \cdot r$ to find $r \cdot a^* \leq p^* \cdot r$.
1365	with $p = x$ and $r = q$ and $q = p^{-1}x$, we must show $x + p^{-1}x \cdot q \le p^{-1}x$ to find $x \cdot q^{-1} \le p^{-1}x$
1366	If $x \cdot q \leq p \cdot x$, then $p^* \cdot x \cdot q \leq p^* \cdot p \cdot x$ by monotonicity. We have $x + p^* \cdot p \cdot x \leq p^* \cdot x$ by
1367	KA-UNROLL-R and KA-PLUS-IDEM. Therefore $x + p^* \cdot x \cdot q \le x + p^* \cdot p \cdot x \le p^* \cdot x$, as desired
1368	We can now find sliding by letting $p = p \cdot q$ and $x = p$ and $q = q \cdot p$ in the above, i.e., we have the
1369	premise $p \cdot q \cdot p \equiv p \cdot q \cdot p$ by reflexivity, and so $(p \cdot q)^* \cdot p \equiv p \cdot (q \cdot p)^*$.
1370	
1371	LEMMA 3.30 (DENESTING). $(p+q)^* \equiv p^* \cdot (q \cdot p^*)^*$.

LEMMA 3.30 (DENESTING). $(p+q)^* \equiv p^* \cdot (q \cdot p^*)^*$.

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

1326

1327

1328

1332

1333 1334

1340

1341

1342

1343

1355

1356

1357

1:29

PROOF. Following Kozen [35], we do the proof by mutual inclusion. The proof is surprisingly 1373 challenging, so we include it here. 1374

1375 (\Rightarrow) To show $(p+q)^* \leq a^* \cdot (b \cdot a^*)^*$, we apply induction with q = 1 and $r = p^* \cdot (q \cdot p^*)^*$ (to show 1376 $(a+b)^* \cdot 1 \leq r$). We must show that $1 + (p+q) \cdot p^* \cdot (q \cdot p^*)^* \leq p^* \cdot (q \cdot p^*)^*$. We do so in 1377 several parts, working our way there in five steps. 1378 First, we observe that $1 \le p^* \cdot (q \cdot p^*)^*$ (A) because: 1379 1380 $1 + p^* \cdot (q \cdot p^*)^*$ 1381 $\equiv 1 + (1 + p \cdot p^* \cdot (q \cdot p^*)^*)$ KA-UNROLL-L 1382 $\equiv 1 + p \cdot p^* \cdot (q \cdot p^*)^*$ KA-Plus-Assoc, KA-Plus-Idem 1383 $\equiv p^* \cdot (q \cdot p^*)^*$ KA-UNROLL-L 1384 1385 Next, $p \cdot p^* \cdot (q \cdot p^*)^* \le p^* \cdot (q \cdot p^*)^*$ (B) because: 1386 $p \cdot p^* \cdot (q \cdot p^*)^* + p^* \cdot (q \cdot p^*)^*$ 1387 $\equiv p \cdot p^* \cdot (q \cdot p^*)^* + 1 + p \cdot p^* \cdot (q \cdot p^*)^*$ KA-UNROLL-L 1388 $\equiv 1 + p \cdot p^* \cdot (q \cdot p^*)^*$ KA-Plus-Idem 1389 1390 $\equiv p^* \cdot (q \cdot p^*)^*$ KA-UNROLL-L 1391 We have $q \cdot p^* \cdot (q \cdot p^*)^* \leq (q \cdot p^*)^*$ because: 1392 1393 $q \cdot p^* \cdot (q \cdot p^*)^* + (q \cdot p^*)^*$ 1394 $\equiv q \cdot p^* \cdot (q \cdot p^*)^* + 1 + q \cdot p^* \cdot (q \cdot p^*)^*$ KA-UNROLL-L 1395 $\equiv 1 + q \cdot p^* \cdot (q \cdot p^*)^*$ **KA-PLUS-IDEM** 1396 $\equiv (q \cdot p^*)^*$ KA-UNROLL-L 1397 1398 Further, $(q \cdot p^*)^* \leq p^* \cdot (q \cdot p^*)^*$ because: 1399 1400 $(q \cdot p^*)^* + p^* \cdot (q \cdot p^*)^*$ 1401 $\equiv (q \cdot p^*)^* + 1 \cdot (q \cdot p^*)^* + p \cdot p^* \cdot (q \cdot p^*)^* \quad \text{KA-UNROLL-L, KA-DIST-R}$ 1402 $\equiv 1 \cdot (q \cdot p^*)^* + p \cdot p^* \cdot (q \cdot p^*)^*$ KA-Plus-Idem 1403 $\equiv p^* \cdot (q \cdot p^*)^*$ KA-UNROLL-L 1404 1405 Finally, $q \cdot p^* \cdot (q \cdot p^*)^* \leq a^* \cdot (q \cdot p^*)^*$ (C) by transitivity with the last two results. 1406 Now we can find that 1407 1408 $1 + (p+q)p^* \cdot (q \cdot p^*)^* \le 1 + p \cdot p^* \cdot (q \cdot p^*)^* + q \cdot p^* \cdot (q \cdot p^*)^* \le p^* \cdot (q \cdot p^*)^*$ 1409 1410 because: 1411 $1 + (p+q)p^* \cdot (q \cdot p^*)^* + 1 + p \cdot p^* \cdot (q \cdot p^*)^* + q \cdot p^* \cdot (q \cdot p^*)^*$ 1412 $\equiv 1 + p \cdot p^* \cdot (q \cdot p^*)^* + q \cdot p^* \cdot (q \cdot p^*)^* + p \cdot p^* \cdot (q \cdot p^*)^* + q \cdot p^* \cdot (q \cdot p^*)^*$ KA-Plus-Idem 1413 $\equiv 1 + p \cdot p^* \cdot (q \cdot p^*)^* + q \cdot p^* \cdot (q \cdot p^*)^*$ KA-Plus-Idem 1414 1415 because, finally: 1416 $1 + p \cdot p^* \cdot (q \cdot p^*)^* + q \cdot p^* \cdot (q \cdot p^*)^* + p^* \cdot (q \cdot p^*)^*$ 1417 $\equiv p^* \cdot (q \cdot p^*)^* + p \cdot p^* \cdot (q \cdot p^*)^* + q \cdot p^* \cdot (q \cdot p^*)^*$ (A) 1418 $\equiv p^* \cdot (q \cdot p^*)^* + q \cdot p^* \cdot (q \cdot p^*)^*$ (B) 1419 $\equiv p^* \cdot (q \cdot p^*)^*$ (C) 1420 1421 ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

(\Leftarrow) To show $p^* \cdot (q \cdot p^*)^* \leq (p+q)^*((p+q)(p+q)^*)^*$, we have first that $p \leq p+q$ and $q \leq p+q$, 1422 and so $p + q \le (p + q)^*$. And so, by monotonicity $p^* \cdot (q \cdot p^*)^* \le (p + q)^* ((p + q)(p + q)^*)^*$. 1423 1424 We can then find that $(p+q)^* \cdot ((p+q) \cdot (p+q)^*)^* \leq (p+q)^* \cdot ((p+q)^*)^*$ because: 1425 $(p+q)(p+q)^* + (p+q)^*$ 1426 $\equiv p \cdot (p+q)^* + q \cdot (p+q)^* + (p+q)^*$ KA-DIST-R 1427 $\equiv p \cdot (p+q)^* + q \cdot (p+q)^* + 1 + (p+q)(p+q)^*$ KA-UNROLL-L 1428 $\equiv p \cdot (p+q)^* + q \cdot (p+q)^* + 1 + p \cdot (p+q)^* + q \cdot (p+q)^*$ KA-DIST-R 1429 $1 + p \cdot (p + q)^* + q \cdot (p + q)^*$ KA-Plus-Idem ≡ 1430 $\equiv 1 + (p+q) \cdot (p+q)^*$ KA-DIST-R 1431 Ξ $(p+q)^{*}$ KA-UNROLL-L 1432 But we also have $(p + q)^* \cdot ((p + q)^*)^* \le (p + q)^*$ because: 1433 1434 $(p+q)^* \cdot ((p+q)^*)^* + (p+q)^*$ 1435 $\equiv (p+q)^* \cdot (p+q)^* + (p+q)^*$ because $(x^{*})^{*} = x^{*}$ 1436 because $x^*x^* = x^*$ $\equiv (p+q)^* + (p+q)^*$ 1437 $\equiv (p+q)^*$ KA-Plus-Idem 1438 1439 1440 LEMMA 3.31 (STAR INVARIANT). If $p \cdot a \equiv a \cdot q + r$ then $p^* \cdot a \equiv (a + p^* \cdot r) \cdot q^*$. 1441 1442 **PROOF.** We show two implications using \leq to derive the equality. 1443 (⇒) We want to show p^* ; $a \le (a + p^*; y)$; x^* . 1444 We know that $q + pr \le r \implies p^*q \le r$ by the induction axiom KA-LFP-L, so we can 1445 instantiate it with *p* as *p* and *q* as *a* and *r* as $(a + p^*; y); x^*$. We find: 1446 1447 $a + p; (a + p^*; y); x^*$ $\leq (a + p^*; y); x^*$ 1448 $a + p; a; x^* + p; p^*; y; x^*$ $\leq (a + p^*; y); x^*$ 1449 $a + p; a; x^* + p; p^*; y; x^* + (a + p^*; y); x^*$ $= (a + p^*; y); x^*$ 1450 $a + p; a; x^* + p; p^*; y; x^* + a; x^* + p^*; y; x^*$ $= (a + p^*; y); x^*$ 1451 $(a + a; x^* + p; a; x^*) + (p; p^*; y; x^* + p^*; y; x^*) = (a + p^*; y); x^*$ 1452 $(a; x^* + p; a; x^*) + (p; p^*; y; x^* + p^*; y; x^*) = (a + p^*; y); x^*$ 1453 $(1 + p); a; x^* + (1 + p); p^*; y; x^*$ $= (a + p^*; y); x^*$ 1454 $a; x^* + p^*; y; x^* = (a + p^*; y); x^*$ 1455 $(a + p^*; y); x^* = (a + p^*; y); x^*$ 1456 1457 (⇐) We can to show $(a + p^*; y); x^* \le p^*; a$ We can apply the other induction axiom (KA-LFP-R), 1458 $q + r; p \le r \implies q; p^* \le r$, with p = x and $q = (a + p^*; y)$ and $r = p^*; a$. We find: 1459 $(a + p^*; y) + (p^*; a); x$ $\leq p^*; a$ 1460 $a + p^*; y + p^*; a; x + p^*; a = p^*; a$ 1461 $a + p^*; (a; x + y + a) = p^*; a$ 1462 $a + p^*; (p; a + a) = p^*; a$ 1463 $a + p^*; (a; (p + 1)) = p^*; a$ 1464 $a + p^*; a = p^*; a$ 1465 $p^*; a = p^*; a$ 1466 1467 1468 LEMMA 3.32 (STAR EXPANSION). If $p \cdot a \equiv a \cdot q + r$ then $p \cdot a \cdot (p \cdot a)^* \equiv (a \cdot q + r) \cdot (q + r)^*$. 1469 1470

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

1471 PROOF. First we observe that $p; a; (p; a)^*$ is equivalent to $(p; a)^*; p; a$ (apply KA-SLIDING twice). 1472 We show two implications using \leq to derive the equality.

1473 (⇒) We want to show $(p; a)^*; p; a \le (a; x + y); (x + y)^*$. 1474 We know that $q + pr \leq r \implies p^*q \leq r$ by the induction axiom KA-LFP-L, so we can 1475 instantiate it with p and q as p; a and r as $(a; x + y); (x + y)^*$. We find: 1476 1477 $p; a + p; a; (a; x + y); (x + y)^*$ $\leq (a; x+y); (x+y)^*$ 1478 $p; a + (p; a; x + p; a; y); (x + y)^*$ $\leq (a; x+y); (x+y)^*$ 1479 $(a; x + y) + ((a; x + y); x + (a; x + y); y); (x + y)^*$ $\leq (a; x+y); (x+y)^*$ 1480 $(a; x + y) + (a; x + y); (x + y); (x + y)^*$ $\leq (a; x+y); (x+y)^*$ 1481 $(a; x + y); (1 + (x + y); (x + y)^*)$ $\leq (a; x + y); (x + y)^*$ 1482 $(a; x + y); (x + y)^*$ $\leq (a; x + y); (x + y)^*$ 1483 1484 (⇐)) We can to show $(a; x + y); (x + y)^* \le p; a; (p; a)^*$ We can apply the other induction axiom 1485 (KA-LFP-R), q + r; $p \le r \implies q$; $p^* \le r$, with p = x + y and q = a; x + y and r = p; $a(p; a)^*$. 1486 We find: 1487 $(a; x + y) + p; a; (p; a)^*; (x + y)$ $\leq (p; a)^*; p; a$ 1488 $p; a + p; a; (p; a)^*; (x + y) \leq (p; a)^*; p; a$ 1489 $p; a + p; a; (p; a)^*; (x + y) \leq p; a + (p; a)^*; p; a; p; a$ 1490 $p; a + p; a; (p; a)^*; (x + y) \leq p; a + (p; a)^*; p; a; (a; x + y)$ 1491 $p; a + p; a; (p; a)^*; (x + y) \leq p; a + (p; a)^*; (a; x + y); (x + y)$ 1492 $p; a + p; a; (p; a)^*; (x + y) \leq p; a + (p; a)^*; (p; a); (x + y)$ 1493 1494 1495 1496

LEMMA 3.33 (PUSHBACK THROUGH PRIMITIVE ACTIONS). Pushing a test back through a primitive action leaves the primitive action intact, i.e., if $\pi \cdot a \operatorname{PB}^{\bullet} x$ or $(\sum b_i \cdot \pi) \cdot a \operatorname{PB}^{\mathsf{T}} x$, then $x = \sum a_i \cdot \pi$.

PROOF. By induction on the derivation rule used.

We show that our notion of pushback is correct in two steps. First we prove that pushback is partially correct, i.e., if we can form a derivation in the pushback relations, the right-hand sides are equivalent to the left-hand-sides (Theorem 3.34). Once we've established that our pushback relations' derivations mean what we want, we have to show that we can find such derivations; here we use our maximal subterm measure to show that the recursive tangle of our PB relations always terminates (Theorem 3.35), which makes extensive use of our subterm ordering lemma (Lemma 3.22) and splitting (Lemma 3.25)).

```
THEOREM 3.34 (PUSHBACK SOUNDNESS).
```

1510 1511

1517

1519

1509

1497

1498 1499

1500 1501

```
1512 (1) If x \cdot y \text{ PB}^{J} z' then x \cdot y \equiv z'.
```

1513 (2) If $x^* PB^* y$ then $x^* \equiv y$.

1514 (3) If $m \cdot a \operatorname{PB}^{\bullet} y$ then $m \cdot a \equiv y$.

1515 (4) If $m \cdot x \operatorname{PB}^{\mathsf{R}} y$ then $m \cdot x \equiv y$.

1516 (5) If $x \cdot a \operatorname{PB}^{\mathsf{T}} y$ then $x \cdot a \equiv y$.

1518 PROOF. By simultaneous induction on the derivations. Cases are grouped by judgment.

(IH(3))

(KA-DIST-L)

Sequential composition of normal forms $(x \cdot y \text{ PB}^{J} z)$.

 $\equiv \left[\sum_{i=1}^{k} a_i \cdot m_i\right] \cdot \left[\sum_{j=1}^{l} b_j \cdot n_j\right]$

 $= \sum_{i=1}^{k} a_i \cdot \left[\sum_{j=1}^{l} x_{ij} \cdot n_j \right]$ $= \sum_{i=1}^{k} \sum_{j=1}^{l} a_i \cdot x_{ij} \cdot n_j$

0* $1 + 0 \cdot 0^{*}$ (KA-UNROLL-L) \equiv (KA-ZERO-SEQ) 1 + 0≡ (KA-Plus-Zero) \equiv

 $= \sum_{i=1}^{k} a_i \cdot m_i \cdot \begin{bmatrix} \sum_{j=1}^{l} b_j \cdot n_j \\ \sum_{i=1}^{k} a_i \cdot \begin{bmatrix} m_i \cdot \sum_{j=1}^{l} b_j \cdot n_j \\ \sum_{i=1}^{k} a_i \cdot \begin{bmatrix} m_i \cdot \sum_{j=1}^{l} b_j \cdot n_j \\ \sum_{j=1}^{l} m_i \cdot b_j \cdot n_j \end{bmatrix}$ (KA-DIST-L)

(JOIN) We have $x = \sum_{i=1}^{k} a_i \cdot m_i$ and $y = \sum_{i=1}^{l} b_i \cdot n_i$. By the IH on (3), each $m_i \cdot b_j$ PB[•] x_{ij} .

(SLIDE) We are trying to pushback the minimal term a of x through a star, i.e., we have $(a \cdot x)^*$; by the IH on (5), we know there exists some y such that $x \cdot a \equiv y$; by the IH on (2), we know that $y^* \equiv y'$; and by the IH on (1), we know that $y' \cdot x \equiv z$. We must show that $(a \cdot x)^* \equiv 1 + a \cdot z$. We compute:

≡	$1 + a \cdot x \cdot (a \cdot x)^*$	(KA-Unroll-L)
≡	$1 + a \cdot (x \cdot a)^* \cdot x$	(sliding with $p = x$ and $q = a$; Lemma 3.29)
≡	$1 + a \cdot y^* \cdot x$	(IH (5))
≡	$1 + a \cdot y' \cdot x$	(IH (2))
≡	$1 + a \cdot z$	(IH (1))

(EXPAND) We are trying to pushback the minimal term a of x through a star, i.e., we have $(a \cdot x)^*$; by the IH on (5), we know that there exist t and u such that $x \cdot a \equiv a \cdot t + u$; by the IH on (2), we know that there exists a *y* such that $(t + u)^* \equiv y$; and by the IH

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

1569

on (1), we know that there is some *z* such that $y \cdot x \equiv z$. We compute:

1570	$(a, \mathbf{r})^*$
1571	$(u \cdot x) = (1 + a \cdot x + a \cdot x + a \cdot x + (a \cdot x)^*) $ (KA II)
1572	$= 1 + a \cdot x + a \cdot x \cdot a \cdot (x \cdot a)^* \cdot x$ (KA-ONROLL-L) $= 1 + a \cdot x + a \cdot x \cdot a \cdot (x \cdot a)^* \cdot x$
1573	$= 1 + u \cdot x + u \cdot x \cdot u \cdot (x \cdot u) \cdot x$ (eliding with $p = x$ and $q = q$: Lemma 3.20)
1574	(shung with $p = x$ and $q = u$, Lemma 5.27) = $1 + a \cdot r + a \cdot [r \cdot a \cdot (r \cdot a)^*] \cdot r$ (KA SEO Assoc)
1575	$= 1 + a \cdot x + a \cdot [(x \cdot a \cdot (x \cdot a))] \cdot x \qquad (RA-5EQ-ASSOC)$ = 1 + a \cdot x + a \cdot [(a \cdot x + a)) \cdot (t + a))*] \cdot x
1576	$= 1 + u \cdot x + u \cdot [(u \cdot i + u) \cdot (i + u)] \cdot x$ (avpansion using IH (5): Lamma 2.22)
1577	$= 1 + a \cdot r + a \cdot (a \cdot t + u) \cdot (t + u)^* \cdot r \qquad (KA \text{ SEO Assoc})$
1578	$= 1 + a \cdot x + a \cdot (a \cdot a + t + a \cdot u) \cdot (t + u)^{*} \cdot x \qquad (KA - 5EQ - ASSOC)$ $= 1 + a \cdot x + (a \cdot a + t + a + u) \cdot (t + u)^{*} \cdot x \qquad (KA - DET I)$
1579	$= 1 + a \cdot x + (a \cdot a + a + a) \cdot (t + a)^{*} \cdot x \qquad (RA-DISI-L)$ $= 1 + a \cdot x + (a \cdot t + a + a) \cdot (t + a)^{*} \cdot x \qquad (BA SEC IDEN)$
1580	$= 1 + a \cdot x + (a \cdot i + a \cdot u) \cdot (i + u) \cdot x \qquad (DA-SEQ-IDEM)$ = 1 + a \cdot x + a \cdot (t + u) \cdot (t + u)^* \cdot x \cdot (DA-SEQ-IDEM)
1581	$= 1 + a \cdot x + a \cdot (t + u) \cdot (t + u) \cdot x \qquad (\text{DA-SEQ-IDEM})$ $= 1 + a \cdot 1 + a \cdot (t + u) \cdot (t + u)^* + a (\text{KA OVE SEQ})$
1582	$= 1 + a \cdot 1 \cdot x + a \cdot (l + u) \cdot (l + u) \cdot x \qquad (\text{KA-ONE-SEQ})$ $= 1 + (a \cdot 1 + a \cdot (l + u)) \cdot (l + u)^* \text{if } (k + u)^* \text{if } (k + u)^* = (k + u)^*$
1583	$= 1 + (u \cdot 1 + u \cdot (t + u)) \cdot x \qquad (KA-DIST-K)$
1584	$\equiv 1 + a \cdot (1 + (t + u) \cdot (t + u)) \cdot x \qquad (KA-DIST-L)$
1585	$\equiv 1 + a \cdot (t + u)^{-1} \cdot x \qquad (KA-UNROLL-L)$
1586	$\equiv 1 + a \cdot y \cdot x \qquad (IH (2))$
1587	$\equiv 1 + a \cdot z \tag{IH(1)}$
1588	
1589	(DENEST) we have a compound normal form $a \cdot x + y$ under a star; we will push back the
1590	maximal test a. By our first IH on (2) we know that that $y^{*} \equiv y^{*}$ for some y^{*} ; by
1591	our first IH on (1), we know that $x \cdot y \equiv x$ for some x; by our second IH on (2)
1592	we know that $(a \cdot x') \equiv z$ for some z; and by our second IH on (1), we know that
1593	$y' \cdot z \equiv z'$ for some z'. We must show that $(a \cdot x + y)^* \equiv z'$. We compute:
1594	$(a \cdot x + y)^*$
1595	$\equiv u^* \cdot (a \cdot x \cdot y^*)^* \qquad (\text{denesting with } p = a \cdot x \text{ and } q = y \text{: Lemma 3.30})$
1596	$\equiv u' \cdot (a \cdot x \cdot u')^* \qquad (first IH (2))$
1597	$= y \cdot (a \cdot x')^* $ (first IH (1))
1598	$= y (u \cdot x)$ $= u' \cdot z $ (second IH (2))
1599	= g' z' (second III (2)) = z'
1600	
1601	Pushing tests through actions $(m \cdot a PB^{\bullet} u)$
1602	$(0 - 7 - 2) W = 1^{1} + 0^{1} + 1^{1$
1603	(SEQZERO) We are pushing 0 back through a restricted action <i>m</i> . We immediately find $m \cdot 0 \equiv 0$
1604	by KA-Seq-Zero.
1605	(SEQONE) We are pushing 1 back through a restricted action m . We find:
1606	
1607	$m \cdot 1$
1608	$\equiv m \qquad (KA-ONE-SEQ)$
1609	$\equiv 1 \cdot m$ (KA-SEQ-ONE)
1610	
1611	(SEQSEQTEST) We are pushing the tests $a \cdot b$ through the restricted action <i>m</i> . By our first IH on
1612	(3), we have $m \cdot a \equiv y$; by our second IH on (3), we have $y \cdot b \equiv z$. We compute:
1613	$m \cdot (a \cdot b)$
1614	$\equiv m \cdot a \cdot b$ (KA-SEO-Assoc)
1615	$\equiv u \cdot b \qquad (first IH (3))$
1616	$= z \qquad (second IH (3))$
1617	
1011	

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

(SEQSEQACTION) We are pushing the test *a* through the restricted actions $m \cdot n$. By our IH on (3), we have $n \cdot a \equiv x$; by our IH on (4), we have $m \cdot x \equiv y$. We compute:

521			$(m \cdot n) \cdot a$		
522		:	$\equiv m \cdot (n \cdot a)$	(KA-Seq-Assoc)	
523		:	$\equiv m \cdot x$	(IH (3))	
524		:	$\equiv y$	(IH (4))	
525					
526	(SeoParTest)	We are pushin	g the tests $a + b$	through the restricted action <i>m</i> . B	v our first IH on
527	(* 2	(3). we have <i>m</i>	a = x: by our s	second IH on (3), we have $m \cdot b \equiv$	<i>u</i> . We compute:
528		(-),	, and the second s		J
529			$m \cdot (a+b)$		
530			$m \cdot a + m \cdot b$	(KA-Dist-L)	
531		=	$x + m \cdot b$	(first IH (3))	
532		=	$\equiv x + y$	(second IH (3))	
533			U		
534	(SeoParAction)	We are pushin	σ the test <i>a</i> through	ugh the restricted actions $m + n$ B	w our first IH on
535	(0201111111111111)	(3) we have m	$a = x \cdot b x $ our $a = x \cdot b x $	second IH on (3) we have $n \cdot a =$	<i>u</i> We compute:
536		(5), we have m	u = x, by our		g. we compute
537			$(m+n) \cdot a$		
538			$m \cdot a + n \cdot a$	(KA-Dist-R)	
539		=	$\equiv x + n \cdot a$	(first IH (3))	
540		=	$\equiv x + y$	(second IH (3))	
541			5		
542	(Prim)	We are nushin	σ a primitive pre	dicate α through a primitive action	n π We have by
543	(I KIM)	assumption th	hat $\pi \cdot a$ WP $\{a_1$	a_{L} By definition of the WP	relation it must
544		be the case the	at $\pi \cdot \alpha = \sum^k a$	\dots, π	relation, it must
545		be the case the	$at \pi a = \sum_{i=1}^{n} a_i$		
546	(PrimNeg)	We are pushir	ng a negated pre	edicate $\neg a$ back through a primiti	ve action π . We
547		have, by assu	mption, that π ·	$a \text{ PB}^{\bullet} \sum_{i} a_{i} \cdot pi$ and that $nnf(\neg$	$(\sum_i a_i)) = b$, so
548		$\neg(\sum_i a_i) \equiv b$	Lemma 3.28). By	the IH, we know that $\pi \cdot a \equiv \sum_{n \in \mathbb{N}} a_n$	$a_i \cdot \pi$; we must
549		show that π ·	$\neg a \equiv b \cdot \pi$. By ou	ir assumptions, we know that $b \cdot i$	$\pi \equiv \neg(\sum_i a_i) \cdot \pi,$
650		so by pushbac	k negation (Pusi	HBACK-NEG/Lemma 3.1).	
651	(SEQSTARSMALLER)	We are pushin	ng the test <i>a</i> thro	ugh the restricted action m^* . By c	our IH on (3), we
652		have $m \cdot a \equiv x$	for some <i>x</i> ; by	our IH on (4), we have $m^* \cdot x \equiv y$	for some <i>y</i> . We
653		compute:			
654					
555			$m^* \cdot a$		
656		≡	$(1+m^*\cdot m)\cdot a$	(KA-Unroll-R)	
657		≡	$a + m^* \cdot m \cdot a$	(KA-Dist-R)	
658		≡	$a + m^* \cdot (m \cdot a)$	(KA-Seq-Assoc)	
559		≡	$a + m^* \cdot x$	(IH (3))	
560		≡	a + y	(IH (4))	
561					
562	(SeqStarInv)	We are pushin	g the test <i>a</i> throu	igh the restricted action m^* . By ou	r IH on (3), there
563		exist t and u s	such that $m \cdot a \equiv$	$a \cdot t + u$; by our IH on (4), there	exists an x such
564		that $m^* \cdot u \equiv x$; by our IH on (2), there exists a <i>y</i> such that $u^* \equiv$	y; and by our IH
565		on (1), there en	xists a z such tha	at $x \cdot y \equiv z$. We compute:	
				· ·	

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

1667	$m \cdot a = a \cdot t + u m^* a = (a + m^* \cdot u) + $	t*
1668	* -	
1669	$m \cdot a$	
1670	$\equiv (a + m^2 \cdot u) \cdot t^2 \qquad (\text{star invariant})$	(KA, D, D)
1671	$\equiv a \cdot t^{+} + m^{+} \cdot u \cdot t^{+}$	(KA-DIST-R)
1672	$\equiv a \cdot t^* + x \cdot t^*$	(IH (4))
1673	$\equiv a \cdot y + x \cdot y$	(IH (2))
1674	$\equiv a \cdot y + z$	(IH (1))
1675		
1676	Pushing normal forms through actions $(m \cdot x \ PB^{\kappa} \ z)$	
1677	(RESTRICTED) We have $x = \sum_{i=1}^{k} a_i \cdot n_i$. By the IH or	n (3), $m \cdot a_i \text{ PB}^{\bullet} y_i$. We compute:
1678		
1679	$m \cdot x$	
1680	$\equiv m \cdot \sum_{i=1}^{\kappa} a_i \cdot n_i$	
1681	$\equiv \sum_{i=1}^{k} m \cdot a_i \cdot n_i$	(KA-Dist-L)
1682	$\equiv \sum_{i=1}^{k} y_i \cdot n_i$	(IH (3))
1683		
1684	Pushing tests through normal forms ($x \cdot a \ PB^{T} y$).	
1685	(TEST) We have $r = \sum_{k=1}^{k} a_{k} \cdot m$. By the IH	on (3) we have $m_{1,2} a PR^{\bullet} u_{1,2}$ where $u_{1,2} =$
1686	(TEST) We have $x = \sum_{i=1}^{l} u_i \cdot m_i$. By the fit	on (5), we have $m_i \cdot u + b \cdot y_i$ where $y_i =$
1687	$\sum_{j=1} v_{ij} \cdot m_{ij}$. we compute:	
1688	$x \cdot a$	
1689	$-\left[\sum_{k=1}^{k} x_{k}\right] x_{k}$	
1690	$\equiv \left[\sum_{i=1}^{i} a_i \cdot m_i\right] \cdot a$	
1691	$\equiv \sum_{i=1}^{k} a_i \cdot m_i \cdot a_i$	(KA-Dist-R)
1692	$\equiv \sum_{i=1}^{k} a_i \cdot (m_i \cdot a)$	(KA-Seq-Assoc)
1693	$\equiv \sum_{i=1}^{k} a_i \cdot y_i$	(IH (3))
1694	$\equiv \sum_{i=1}^{k} a_i \cdot \sum_{i=1}^{l} b_{ii} \cdot m_{ii}$	
1695	$\equiv \sum_{i=1}^{k} \sum_{i=1}^{l} a_i \cdot b_{ii} \cdot m_{ii}$	(KA-Dist-L)
1696	$\mathbf{L}_{l=1} \mathbf{L}_{j=1} \cdots \mathbf{L}_{j}$	
1697		
1698		
1699	Theorem 3.35 (Pushback existence). For all x an	d m and a:
1700	(1) For all u and z, if $x < z$ and $u < z$ then there exists	sts some $z' \leq z$ such that $x \cdot y \text{ PB}^{J} z'$.
1701	(2) There exists a $y < x$ such that $x^* \text{ PB}^* y$.	
1702	(3) There exists some $u \leq a$ such that $m \cdot a \text{ PB}^{\bullet} u$.	
1703	(4) There exists a $u < x$ such that $m \cdot x \operatorname{PB}^{R} u$.	
1704	(5) If $x < z$ and $a < z$ then there exists a $u < z$ such	that $x \cdot a PB^T u$.
1705	(c) ij c = x and a = x non non c and a g = x contract of a b b b b b b b b b	indiana di 2 gi
1706	PROOF. By induction on the lexicographical order of	of: the subterm ordering (\prec); the size of <i>x</i> (for
1707	(1), (2), (4), and (5)); the size of <i>m</i> (for (3) and (4)); and	the size of $a(\text{for }(3))$.
1708		
1709	Sequential composition of normal forms $(x \cdot y PB^{J} z)$.	We have $x = \sum_{i=1}^{\kappa} a_i \cdot m_i$ and $y = \sum_{j=1}^{l} b_j \cdot n_j$;
1710	by the IH on (3) with the size decreasing on m_i , we kn	Now that $m_i \cdot b_j PB^{\bullet} x_{ij}$ for each <i>i</i> and <i>j</i> such
1711	that $x_{ij} \leq a_i$, so by JOIN, we know that $x \cdot y \text{ PB}^{J} \sum_{i=1}^{k}$	$\sum_{j=1}^{l} a_i x_{ij} n_j = z'.$
1712	Given that $x, y \le z$, it remains to be seen that $z' \le z'$	z. We've assumed that $a_i \leq x \leq z$. By our IH

Η on (3) we found earlier that $x_{ij} \le a_i \le z$. Therefore, by unpacking *x* and applying test bounding 1713 (Lemma 3.22), $a_i \cdot x_{ij} \cdot n_j \leq z$. By normal form parallel congruence (Lemma 3.22), we have $z' \leq z$.) 1714 1715

1716	Kleene star of normal forms ($x^* PB^J y$). If x is vacuous, we find that $0^* PB^* 1$ by STARZERO, with		
1717	$1 \leq 0$ since they have the same maximal terms (just 1).		
1718	If x isn't vacuous, then we have $x \equiv a \cdot x_1 + x_2$ where $x_1, x_2 \prec x$ and $a \in mt(x)$ by splitting		
1719	(Lemma 3.25). We first consider whether x_2 is vacuous.		
1720	(x_2 is vacuous) We have $x \equiv a \cdot x_1 + 0 \equiv a \cdot x_1$.		
1722	By our IH on (5) with x_1 decreasing in size, we have $x_1 \cdot a \text{ PB}^T w$ where $w \leq x$		
1722	(because $x_1 < x$ and $a \le x$). By maximal test inequality (Lemma 3.24), we have		
1723	two cases: either $a \in mt(w)$ or $w < a \le x$.		
1725	$(a \in mt(w))$ By splitting (Lemma 3.25), we have $w = a \cdot t + y$ for some normal		
1726	($u \in \operatorname{Int}(w)$) by splitting (behavior $u = u + u$ for some normal forms $t, u < w$.		
1727			
1728	By normal-form parallel congruence (Lemma 3.22), $t + u < x$; so		
1729	by the IFI on (2) with our subterm ordering decreasing on $t+u < x$, we find that $(t + u)^*$ DP* u' for some $u' < (t + u)^*$ ($u < x$)		
1730	We find that $(l + u)$ PD w for some $w \le (l + u) < w \le x$. Since t_{i} (x_{i} we can apply our ILL on (1) with our subtarm		
1731	Since $w' < x$, we can apply our information (i) with our subterm ordering decreasing on $w' < x$ to find that $w' < x$. PB ^J z such that		
1732	ordering decreasing on $w' \leq x$ to find that $w' x_1 + b' z$ such that $z \leq r_1 \leq r \leq r$ (since $w' \leq r$ and $r_2 \leq r$)		
1733	$\sum_{i=1}^{n} \sum_{i=1}^{n} \sum_{i$		
1734	Finally, we can see by EXPAND that $x = (a \cdot x_1)^* PB^* 1 + a \cdot z = y$.		
1735	Since each 1, $a, z \leq x$, we have $y = 1 + a \cdot z \leq x$ as needed.		
1736	$(w \prec a)$ Since $w \prec a$, we can apply our IH on (2) with our subterm order		
1737	decreasing on $w < x$ to find that $w^* \text{ PB}^* w'$ such that $w' \leq w < w'$		
1738	$a \leq x$. By our IH on (1) with our subterm order decreasing on		
1739	$w' < x$ to find that $w' \cdot x_1$ PB' z where $z \leq x$ (because $w' \leq x$		
1740	and $x_1 < x$).		
1741	We can now see by SLIDE that $x = (a \cdot x_1)^* PB^* 1 + a \cdot z = y$. Since		
1742	each 1, $a, z \leq x$, we have $y = 1 + a \cdot z \leq x$ as needed.		
1744	(x_2 isn't vacuous) We have $x \equiv a \cdot x_1 + x_2$ where $x_i \prec x$ and $a \in mt(x)$. Since x_2 isn't vacuous, we		
1745	must have $a < x$, not just $a \le x$.		
1746	By the IH on (2) with the subterm ordering decreasing on $x_2 \prec x$, we find $x_2 \text{ PB}^* w$		
1747	such that $w \leq x_2$. By the IH on (1) with the subterm ordering decreasing on $x_1 < x$,		
1748	we have $x_1 \cdot w \operatorname{PB}^J v$ where $v \leq x$ (because $x_1 \leq x$ and $w \leq x$). By the IH on (2)		
1749	with the subterm ordering decreasing on $a \cdot v \prec x$, we find $(a \cdot v)^* \text{ PB}^* z$ where		
1750	$z \le a \cdot v < x$. By our IH on (1) with the subterm ordering decreasing on $w < x$,		
1751	we find $w \cdot z \text{ PB}^J y$ where $y \prec x$ (because $w \prec x$ and $z \prec x$).		
1752	By DENEST, we can see that $x \equiv (a \cdot x_1 + x_2)^*$ PB [*] y, and we've already found		
1753	that $y \leq x$ as needed.		
1754			
1755 1756	Fushing tests through actions $(m \cdot a \operatorname{PB}^{\circ} y)$. We go by cases on a and m to find the $y \leq a$ such that $m \cdot a \operatorname{PB}^{\circ} y$.		
1757	$(m, 0)$ We have $m \cdot 0$ PB [•] 0 by SeqZero, and $0 \le 0$ immediately.		
1758	$(m, 1)$ We have $m \cdot 1 \text{ PB}^{\bullet} 1 \cdot m$ by SeoOne and $1 < 1$ immediately.		
1759	(m, a, b) By the IH on (2) decreasing in size on a well-new that m, a DB [•] r where $r \neq a \neq a, b$		
1761	$(m, a \cdot v)$ by the H on (5) decreasing in size on h we know that $r \cdot h \operatorname{PR}^{T} u$ Finally we know		
1762	by SEOSEOTEST that $m \cdot (a \cdot b) \operatorname{PB}^{\bullet} u$ Since $x < a \cdot b$ and $b < a \cdot b$ we know by the		
1763	If on (5) earlier that $u < a \cdot b$.		
1764	$$ $(-)$ $ g g$		

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

1813

1765 1766 1767 1768	$(m, a + b)$ By the IH on (3) decreasing in size on a , we know that $m \cdot a \text{ PB}^{\bullet} x$ such that $x \leq a \leq a + b$. Similarly, by the IH on (3) decreasing in size on b , we know that $m \cdot b \text{ PB}^{\bullet} z$ such that $z \leq b \leq a + b$. By SEQPARTEST, we know that $m \cdot (a + b) \text{ PB}^{\bullet} x + z = y$; by normal form parallel congruence, we know that $y = x + z \leq a + b$ as needed.
1769 1770 1771 1772	$(m \cdot n, a)$ By the IH on (3) decreasing in size on <i>n</i> , we know that $n \cdot a \operatorname{PB}^{\bullet} x$ such that $x \leq a$. By the IH on (4) decreasing in size on <i>m</i> , we know that $m \cdot x \operatorname{PB}^{R} y$ such that $y \leq x \leq a$ (which are the size bounds on <i>y</i> we needed to show). All that remains to be seen is that $(m \cdot n) \cdot a \operatorname{PB}^{\bullet} y$, which we have by SEQSEQACTION.
1773 1774 1775 1776 1777	$(m + n, a)$ By the IH on (3) decreasing in size on <i>m</i> , we know that $m \cdot a \text{ PB}^{\bullet} x$. Similarly, by the IH on (3) decreasing in size on <i>n</i> , we know that $n \cdot a \text{ PB}^{\bullet} z$. By SEQPARACTION, we know that $(m + n) \cdot a \text{ PB}^{\bullet} x + z = y$. Furthermore, both IHs let us know that $x, z \leq a$, so by normal form parallel congruence, we know that $y = x + z \leq a$.
1778 1779 1780	$(\pi, \neg a)$ By the IH on (3) decreasing in size on <i>a</i> , we can find that $\pi \cdot a \text{ PB}^{\bullet} \sum_{i} a_{i} \cdot \pi$ where $\sum_{i} a_{i} \leq a$, and $\text{nnf}(\neg(\sum_{i} a_{i})) = b$ for some term <i>b</i> . It remains to be seen that $b \leq \neg a$, which we have by monotonicity of nnf (Lemma 3.21).
1781 1782 1783 1784	(π, α) In this case, we fall back on the client theory's pushback operation (Definition 3.26). We have $\pi \cdot \alpha$ WP $\{a_1, \ldots, a_k\}$ such that $a_i \leq \alpha$. By PRIM, we have $\pi \cdot \alpha$ PB [•] $\sum_{i=1}^k a_i \cdot \pi = y$; since each $a_i \leq \alpha$, we find $y \leq \alpha$ by the monotonicity of union (Lemma 3.18).
1785 1786 1787	(m^*, a) We've already ruled out the case where $a = b \cdot c$, so it must be the case that $seqs(a) = \{a\}$, so $mt(a) = \{a\}$.
1788 1789	By the IH on (3) decreasing in size on <i>m</i> , we know that $m \cdot a \text{ PB}^{\bullet} x$ such that $x \leq a$. There are now two possibilities: either $x < a$ or $a \in \text{mt}(x) = \{a\}$.
1790 1791	$(x < a)$ By the IH on (4) with $x < a$, we know by SEQSTARSMALLER that $m^* \cdot x \operatorname{PB}^{R} y$ such that $y \le x < a$.
1792 1793 1794	$(a \in mt(x))$ By splitting (Lemma 3.25), we have $x \equiv a \cdot t + u$, where t and u are normal forms such that $t, u \prec x \leq a$.
1795 1796 1797 1798	By the IH on (4) with $t < a$, we know that $m^* \cdot t \ PB^{R} w$ such that $w \le t < x \le a$. By the IH on (2) with $u < x \le a$, we know that $u^* \ PB^* z$ such that $z \le u < x \le a$. By the IH on (1) with $w < a$ and $z < a$, we find that $w \cdot z \ PB^{J} v$ such that $v \le w < a$.
1799 1800 1801 1802	Finally we have our y : by SEqSTARINV, we have $m^* \cdot a \text{ PB}^{\bullet} a \cdot z + v = y$. Since $z \leq a$ and $a \leq a$, we have $a \cdot z \leq a$ (mixed sequence congruence; Lemma 3.22) and $v < a$. By normal form parallel congruence, we have $a \cdot z + v \leq a$ (Lemma 3.22).
1803 1804 1805 1806 1807 1808	Pushing normal forms through actions $(m \cdot x \operatorname{PB}^{R} z)$. We have $x = \sum_{i=1}^{k} a_i \cdot n_i$; by the IH on (3) with the size decreasing on n_i , we know that $m \cdot a_i \operatorname{PB}^{\bullet} x_i$ for each <i>i</i> such that $x_i \leq a_i$, so by RESTRICTED, we know that $m \cdot x \operatorname{PB}^{R} \sum_{i=1}^{k} x_i n_i = y$. We must show that $y \leq x$. By our IH on (3) we found earlier that $x_i \leq a_i$. By normal form parallel congruence (Lemma 3.22), we have $y \leq x$.
1809 1810 1811	Pushing tests through normal forms $(x \cdot a \operatorname{PB}^{T} y)$. We have $x = \sum_{i=1}^{k} a_i \cdot m_i$; by the IH on (3) with the size decreasing on m_i , we know that $m_i \cdot a \operatorname{PB}^{\bullet} y_i = \sum_{j=1}^{l} b_{ij} m_{ij}$ where $y_i \leq a$. Therefore, we

the size decreasing on m_i , we know that $m_i \cdot a \operatorname{PB}^{\bullet} y_i = \sum_{j=1}^l b_{ij} m_{ij}$ where $y_i \leq a$. Therefore, we know that $x \cdot a \operatorname{PB}^{\mathsf{T}} \sum_{i=1}^k \sum_{j=1}^l a_i \cdot b_{ij} \cdot m_{ij} = y$ by TEST. 1812

Given that $x \le z$ and $a \le z$, We must show that $y \le z$. We already know that $a_i \le x \le z$, and we found from the IH on (3) earlier that $b_{ij} \le y_i \le a \le z$. By test bounding (Lemma 3.22), we have $a_i \cdot b_{ij} \le z$, and therefore $y \le z$ by normal form parallel congruence (Lemma 3.22).

Finally, to reiterate our discussion of PB[•], Theorem 3.35 shows that every left-hand side of the pushback relation has a corresponding right-hand side. We *haven't* proved that the pushback relation is functional— if a term has more than one maximal test, there could be many different choices of how we perform the pushback.

Now that we can push back tests, we can show that every term has an equivalent normal form.

¹⁸²⁴ COROLLARY 3.36 (NORMAL FORMS). For all $p \in \mathcal{T}^*$, there exists a normal form x such p norm x ¹⁸²⁵ and that $p \equiv x$.

1827 PROOF. By induction on p.

(PRED) We have $a \equiv a$ immediately.

(Act) We have $\pi \equiv 1 \cdot \pi$ by KA-Seq-One.

- (PAR) By the IHs and congruence.
 - (SEQ) We have $p = q \cdot r$; by the IHs, we know that q norm x and r norm y. By pushback existence (Theorem 3.35), we know that $x \cdot y \ \mathsf{PB}^{\mathsf{J}} \ z$ for some z. By pushback soundness (Theorem 3.34), we know that $x \cdot y \equiv z$. By congruence, $p \equiv z$.
- (STAR) We have $p = q^*$. By the IH, we know that q norm x. By pushback existence (Theorem 3.35), we know that $x^* PB^* y$. By pushback soundness (Theorem 3.34), we know that $x^* \equiv y$.

The PB relations and these two proofs are one of the contributions of this paper: we believe it is the first time that a KAT normalization procedure has been made so explicit, rather than hiding inside of completeness proofs. Temporal NetKAT, which introduced the idea of pushback, proved a concretization of Theorems 3.34 and 3.35 as a single theorem and without any explicit normalization or pushback relation.

1846 3.4 Completeness

We prove completeness—if [p] = [q] then $p \equiv q$ —by normalizing p and q and comparing the 1847 resulting terms. Our completeness proof uses the completeness of Kleene algebra (KA) as its 1848 foundation: the set of possible traces of actions performed for a restricted (test-free) action in our 1849 denotational semantics is a regular language, and so the KA axioms are sound and complete for it. In 1850 order to relate our denotational semantics to regular languages, we define the regular interpretation 1851 of restricted actions $m \in \mathcal{T}_{RA}$ in the conventional way and then relate our denotational semantics 1852 to the regular interpretation (Fig. 17). Readers familiar with NetKAT's completeness proof may 1853 notice that we've omitted the language model and gone straight to the regular interpretation. We're 1854 able to shorten our proof because our tracing semantics is more directly relatable to its regular 1855 interpretation, and because our completeness proof separately defers to the client theory's decision 1856 procedure for the predicates at the front. Our normalization routine-the essence of our proof-only 1857 uses the KAT axioms and doesn't rely on any property of our tracing semantics. We conjecture 1858 that one could prove a similar completeness result and derive a similar decision procedure with 1859 a merging, non-tracing semantics, like in NetKAT or KAT+B! [1, 30]. We haven't attempted the 1860 proof or an implementation. 1861

1862

1818

1819

1820

1821

1822

1823

1828 1829

1830

1831

1832

1833

1834

1835 1836

1837 1838

1839

1863	\mathcal{R} : $\mathcal{T}_{RA} \to \mathcal{P}(\Pi^*_{\mathcal{T}})$	label	: Trace $\rightarrow \Pi^*_{\mathcal{T}}$
1864	$\mathcal{R}(1) = \{\epsilon\}$	$label(\langle \sigma, \bot \rangle)$	$= \epsilon$
1865	$\mathcal{R}(\pi) = \{\pi\}$	$label(t\langle\sigma,\pi\rangle)$	$=$ label(t) π
1867	$\mathcal{R}(m+n) = \mathcal{R}(m) \cup \mathcal{R}(n)$ $\mathcal{R}(m,n) = \{u_{i} \mid u \in \mathcal{R}(m) \mid u \in \mathcal{R}(n)\}$	Γ^0	- {c}
1868	$\mathcal{R}(m^*) = \bigcup_{0 \le i} \mathcal{R}(m)^i$	\mathcal{L}^{n+1}	$= \{uv \mid u \in \mathcal{L}, v \in \mathcal{L}^n\}$
1869			
1870	Fig. 17. Regular interpre	etation of restricted action	S
1871			
1872	Lemma 3.37 (Restricted actions are ahis	TORICAL). If $[[m]](t_1) =$	$t_1, t \text{ and } \operatorname{last}(t_1) = \operatorname{last}(t_2)$
1873	then $[[m]](t_2) = t_2, t$.		
1874	PROOF. By induction on <i>m</i> .		
1875	(m = 1) Immediate, since t is empty.		
1876	$(m = \pi)$ We immediately have $t = \langle last($	t_1), π >.	
1878	$(m - m + n)$ We have $[m + n](t_i) - [m](t_i)$	$ [n](t_i) \text{ and } [m + n](t_i)$	$t_{0} = \llbracket m \rrbracket (t_{0}) \sqcup \llbracket n \rrbracket (t_{0}) $ By
1879	$(m - m + n)$ we have $[m + n]_{1}(t_{1}) = [m]_{1}(t_{1})$ the IHs.	$\bigcirc [[n]](i_1)$ and $[[m + n]](i_1)$	$(2) = [[m]](t_2) \odot [[n]](t_2).$ By
1880	$(m = m \cdot n)$ We have $\llbracket m \cdot n \rrbracket(t_1) = (\llbracket m \rrbracket \bullet \llbracket n$	$[m](t_1) \text{ and } [[m \cdot n]](t_2) =$	$(\llbracket m \rrbracket \bullet \llbracket n \rrbracket)(t_2)$. It must be
1881	that $[[m]](t_1) = \{t_1, t_{mi}\}$, so by the	he IH we have $\llbracket m \rrbracket(t_2) =$	= $\{t_2, t_{mi}\}$. These sets have
1882	the same last states, so we can a	apply the IH again for <i>n</i>	, and we are done.
1884	$(m = m^*)$ We have $[[m^*]](t_1) = \bigcup_{0 \le i} [[m]]^i$	(t_1) . By induction on i .	
1885	(i = 0) Immediate, sinc	$ [[m]]^0(t_i) = t_i \text{ and so } t $	is empty.
1886	(i = i + 1) By the IH and the the integral of the term of term	ne reasoning above for \cdot	
1887			
1888	I DAMA 2.28 (I ADDIG ADD DDOWLAD) (lobal/	$m \Pi (\langle \sigma \rangle \rangle) \sigma \sigma Stata)$	$-\mathcal{P}(m)$
1889	LEMMA 5.56 (LABELS ARE REGULAR). {Iabel([]	$m_{\mathbb{I}}(\langle 0, \perp \rangle)) \mid 0 \in \text{State}$	$= \mathcal{K}(m)$
1890	PROOF. By induction on the restricted action	<i>m</i> .	
1891	$(m = 1)$ We have $\mathcal{R}(1) = \{\epsilon\}$. For all σ , w	ve find $\llbracket 1 \rrbracket (\langle \sigma, \bot \rangle) = \{ \langle \sigma, \bot \rangle \}$	$\sigma, \bot \rangle$, and label($\langle \sigma, \bot \rangle$) =
1893	$\epsilon.$		
1894	$(m = \pi)$ We $\mathcal{R}(\pi) = \{\pi\}$. For all σ , we	find $\llbracket \pi \rrbracket (\langle \sigma, \bot \rangle) = \{ \langle \sigma \rangle \}$	$(,\perp)\langle \operatorname{act}(\pi,\sigma),\pi\rangle\},$ and so
1895	$label(\langle \sigma, \bot \rangle \langle act(\pi, \sigma), \pi \rangle) = \pi.$		
1896	$(m = m + n)$ We have $\mathcal{R}(m + n) = \mathcal{R}(m) \cup \mathcal{R}(m)$	(<i>n</i>). For all σ , we have:	
1897	$label(\llbracket m + n \rrbracket(\langle \sigma, \bot \rangle)) = label$	$(\llbracket m \rrbracket (\langle \sigma, \bot \rangle) \cup \llbracket n \rrbracket (\langle \sigma,$	⊥>))
1898	= label	$(\llbracket m \rrbracket (\langle \sigma, \bot \rangle)) \cup label(\llbracket a)$	$n]](\langle \sigma, \perp \rangle))$
1899	and we are done by the IHs.		
1900	$(m = m \cdot n)$ We have $\mathcal{R}(m \cdot n) = \{uv \mid u \in \mathcal{R}\}$	$\mathcal{R}(m), v \in \mathcal{R}(n)$. For all d	σ , we have:
1902	$ abel([[m \cdot n]](\langle \sigma + \rangle)) = abel(([[m]] \bullet []$	$[n])(\langle \sigma + \rangle))$	
1903	= label([], [], [], [], [], [], [], [], [], [],	$[n])((0, \pm \gamma))$ (a) $[abel([n](t)))$	
1904	$= \text{label}(\bigcup_{t \in [m]})$	(σ, \perp) label $(t [n] (\langle \sigma, \perp \rangle)$)) by Lemma 3.37
1905	$= \text{ label}(\llbracket m \rrbracket)(\langle \sigma,$	$\perp\rangle))$ label($[n](\langle \sigma, \perp \rangle))$	· · · ·
1906	and we are done by the IHs.		
1907	$(m = m^*)$ We have $\mathcal{R}(m^*) = _{0 \le i} \mathcal{R}(m)^i$	For all σ , we have:	
1908	(,,,,,,,	abal())
1910	$abel([[m]](\langle \sigma, \bot \rangle)) = -$	$ _{0 \le i} [m]^i (\langle \sigma, \bot \rangle)$	
1911	-	$\bigcup_{0 \leq i} abci([m]] (0, \bot))$	1)

and we are done by the IH.

Our proof of completeness works by normalizing each side of the equation, making each side locally unambiguous, making the entire equation unambiguous, and then using word equality to ensure that normal forms with equivalent predicates have equivalent actions.

THEOREM 3.39 (COMPLETENESS). If the emptiness of \mathcal{T} predicates is decidable, then if $\llbracket p \rrbracket = \llbracket q \rrbracket$ then $p \equiv q$.

PROOF. There must exist normal forms x and y such that p norm x and q norm y and $p \equiv x$ and q $\equiv y$ (Corollary 3.36); by soundness (Theorem 3.5), we can find that $[\![p]\!] = [\![x]\!]$ and $[\![q]\!] = [\![y]\!]$, so it must be the case that $[\![x]\!] = [\![y]\!]$. We will find a proof that $x \equiv y$; we can then transitively construct a proof that $p \equiv q$.

We have $x = \sum_{i} a_i \cdot m_i$ and $y = \sum_{j} b_j \cdot n_j$. In principle, we ought to be able to match up each of the a_i with one of the b_j and then check to see whether m_i is equivalent to n_j (by appealing to the completeness on Kleene algebra). But we can't simply do a syntactic matching—we could have a_i and b_j that are in effect equivalent, but not obviously so. Worse still, we could have a_i and $a_{i'}$ equivalent! We need to perform two steps of disambiguation: first each normal form's predicates must be unambiguous locally, and then the predicates must be pairwise comparable between the two normal forms.

To construct independently unambiguous normal forms, we explode our normal form x into a disjoint form \hat{x} , where we test each possible combination of the predicates a_i (excluding the case where we select none) and run the actions corresponding to the true predicates, i.e., m_i gets run precisely when a_i is true:

and similarly for \hat{y} . We can find $x \equiv \hat{x}$ via distributivity (BA-PLUS-DIST), commutativity (KA-PLUS-COMM, BA-SEQ-COMM) and the excluded middle (BA-ExcL-MID).

Observe that the sum of all of the predicates in \hat{x} and \hat{y} are respectively equivalent to 1, since it 1945 enumerates all possible combinations of each a_i (BA-PLUS-DIST, BA-EXCL-MID); i.e., if $\hat{x} = \sum_i c_i \cdot l_i$ 1946 and $\hat{y} = \sum_i d_i \cdot m_i$, then $\sum_i c_i \equiv 1$ and $\sum_i d_i \equiv 1$. We can take advantage of exhaustiveness of 1947 these sums to translate the locally disjoint but syntactically unequal predicates in each \hat{x} and \hat{y} 1948 to a single set of predicates on both, which allows us to do a syntactic comparison on each of the 1949 predicates. Let \ddot{x} and \ddot{y} be the extension of \hat{x} and \hat{y} with the tests from the other form, giving us 1950 $\ddot{x} = \sum_{i,j} c_i \cdot d_j \cdot l_i$ and $\ddot{y} = \sum_{i,j} c_i \cdot d_j \cdot m_j$. Extending the normal forms to be disjoint between 1951 the two normal forms is still provably equivalent using commutativity (BA-SEQ-COMM) and the 1952 exhaustiveness above (KA-SEQ-ONE). 1953

Now that each of the predicates are syntactically uniform and disjoint, we can proceed to compare the commands. But there is one final risk: what if the $c_i \cdot d_j \equiv 0$? Then l_i and o_j could safely be different. We have assumed that the predicates of \mathcal{T} can be checked for emptiness, so we can eliminate those cases where the expanded tests at the front of \ddot{x} and \ddot{y} are equivalent to zero, which is sound by the client theory's completeness and zero-cancellation (KA-ZERO-SEQ and KA-SEQ-ZERO). If one normal form is empty, the other one must be empty as well.

1960

1912 1913

1914

1915

1916

1917 1918

1919

Kleene Algebra Modulo Theories

Finally, we can defer to deductive completeness for KA to find proofs that the commands are 1961 equivalent. To use KA's completeness to get a proof over commands, we have to show that if our 1962 commands have equal denotations in our semantics, then they will also have equal denotations 1963 in the KA semantics. We've done exactly this by showing that restricted actions have regular 1964 interpretations: because the zero-canceled \ddot{x} and \ddot{y} are provably equivalent, soundness guarantees 1965 that their denotations are equal. Since their tests are pairwise disjoint, if their denotations are 1966 equal, it must be that any non-canceled commands are equal, which means that each label of these 1967 commands must be equal—and so $\mathcal{R}(l_i) = \mathcal{R}(o_i)$ (Lemma 3.38). By the deductive completeness of 1968 KA, we know that KA $\vdash l_i \equiv o_i$. Since we have the KA axioms in our system, then $l_i \equiv o_i$; by 1969 reflexivity, we know that $c_i \cdot d_i \equiv c_i \cdot d_i$, and we have proved that $\ddot{x} \equiv \ddot{y}$. By transitivity, we can see 1970 that $\hat{x} \equiv \hat{y}$ and so $x \equiv y$ and $p \equiv q$, as desired. 1971

1973 4 IMPLEMENTATION

1972

1979

1985

1996

1997

We have implemented our ideas in an OCaml library; the library's source code, tests, and our evaluation workbench are available online.¹ Sec. 1.3 summarizes the high-level idea and gives an example library implementation for the theory of increasing natural numbers. To use a higher-order theory such as that of product theories, one need only instantiate the appropriate modules in the library:

1980 module P = Product(IncNat)(Boolean)

```
1981 module D = Decide(P) (* normalization-based decision procedure *)
1982 let a = P.K.parse "y<1; (a=F + a=T; inc(y)); y>0" in
1983 let b = P.K.parse "y<1; a=T; inc(y)" in
1984 assert (D.equivalent a b)</pre>
```

The module P instantiates Product over our theories of incrementing naturals and booleans; the 1986 module D gives a way to normalize terms based on the completeness proof. User's of the library 1987 can access these representations to perform any number of tasks such as compilation, verification, 1988 inference, and so on. For example, checking language equivalence is then simply a matter of reading 1989 in KMT terms and calling the equivalence function. Our implementation currently supports both 1990 a decision procedure based on automata (not yet completely correct, and so omitted from this 1991 article) and one based on the normalization term-rewriting from the completeness proof. We've 1992 implemented a command-line tool that can be configured to work these theories; given a variety of 1993 KMT terms as input, it partitions them into equivalence classes using the decision procedure of the 1994 user's choice. 1995

4.1 **Optimizations**

In practice, our implementation uses several optimizations, with the two most prominent being (1) hash-consing all KAT terms to ensure fast set operations, and (2) lazy construction and exploration of automata during equivalence checking.

Our hash-consing constructors are *smart* constructors, automatically rewriting common identities (e.g., constructing $p \cdot 1$ will simply return p; constructing $(p^*)^*$ will simply return p^*). Client theories can extend our smart constructors to witness theory-specific identities. These optimizations are partly responsible for the speed of our normalization routine (when it avoids the costly DENEST case). When deciding equivalence using normalization, we use the Hopcroft and Karp algorithm [32] on implicit automata using the Brzozowski derivative [9] to generate the transition relation on-the-fly.

^{2008 &}lt;sup>1</sup>https://github.com/mgree/kmt

²⁰⁰⁹

Benchmark	$\mid \mathcal{T}$	Time to check equivalence
$a^* \neq a$ (for random arithmetic predicate <i>a</i>)	N	0.034s
$\operatorname{inc}_{x}^{*}; x > 10 \equiv \operatorname{inc}_{x}^{*}; \operatorname{inc}_{x}^{*}; x > 10$	N	<0.001s
$\operatorname{inc}_{x}^{*}; x > 3; \operatorname{inc}_{y}^{*}; y > 3 \equiv \operatorname{inc}_{x}^{*}; \operatorname{inc}_{y}^{*}; x > 3; y > 3$	\mathbb{N}	<0.001s
$x = \mathfrak{f}; (\mathfrak{flip} x; \mathfrak{flip} x)^* \equiv (\mathfrak{flip} x; \mathfrak{flip} x)^*; x = \mathfrak{f}$	\mathcal{B}	<0.001s
w := f; x := t; y := f; z := f;		
((w = t + x = t + y = t + z = t); a := t +		
$(\neg(w = t + x = t + y = t + z = t)); a := f)$	Ø	-0.001c
$\equiv w := f; x := t; y := f; z := f;$	D	<0.0018
(((w = t + x = t) + (y = t + z = t)); a := t +		
$(\neg((w = t + x = t) + (y = t + z = t))); a := f)$		
$y < 1; a = t; inc_y;$		
$(1+b=t; inc_y);$	NVB	0.309c
$(1 + c = t; inc_y); y > 2$		0.3098
$\equiv y < 1; a = t; b = t; c = t; inc_y; inc_y; inc_y$		
(flip x + flip y + flip z)* = (flip x + flip y + flip z)*	B	>30s (timeout)

Fig. 18. Implementation microbenchmarks

Client theories can implement custom solvers or rely on Z3 embeddings-custom solvers are typically faster. We've implemented a few of these domain-specific optimizations: satisfiability procedure for IncNat makes a heuristic decision between using our incomplete custom solver or Z3 [18]—our solver is much faster on its restricted domain.

EVALUATION

We performed a few experiments to evaluate our tool on a collection of simple microbenchmarks. Fig. 18 shows the microbenchmarks, each of which performs a simple task. For instance, the population-count example initializes a collection of boolean variables and then counts how many are set to true using a natural number counter. It proves that, if the number is above a certain threshold, then all booleans must have been set to true. The figure also shows the time it takes to verify the equivalence of terms for each example. We use a timeout of thirty seconds.

Our normalization-based decision procedure is very fast in many cases. This is likely due to a combination of hash-consing and smart constructors that rewrite complex terms into simpler ones when possible, and the fact that, unlike previous KAT-based normalization proofs (e.g., [1, 37]) our normalization proof does not require splitting predicates into all possible "complete tests." However, the normalization-based decision procedure does very poorly on examples where there is a sum nested inside of a Kleene star, i.e., $(p + q)^*$. The fourth, parity-swapping benchmark is one such example - it flips the parity of a boolean variable an even number of times and verifies that the end value is always the same as the initial value. In this case the normalization-based decision procedure must repeatedly invoke the DENEST rewriting rule, which greatly increases the size of the term on each invocation.

RELATED WORK

Kozen and Mamouras's Kleene algebra with equations [40] is perhaps the most closely related work: they also devise a framework for proving extensions of KAT sound and complete. Our works share a similar genesis: Kleene algebra with equations generalizes the NetKAT completeness proof (and then reconstructs it); our work generalizes the Temporal NetKAT completeness proof (and then

reconstructs it—while also developing several other, novel KATs). Both their work and ours use 2059 rewriting to find normal forms and prove deductive completeness. Their rewriting systems work on 2060 2061 mixed sequences of actions and predicates, but they can only delete these sequences wholesale or replace them with a single primitive action or predicate; our rewriting system's pushback operation 2062 only works on predicates (since the trace semantics preserves the order of actions), but pushback 2063 isn't restricted to producing at most a single primitive predicate. Each framework can do things the 2064 other cannot. Kozen and Mamouras can accommodate equations that combine actions, like those 2065 that eliminate redundant writes in KAT+B! and NetKAT [1, 30]; we can accommodate more complex 2066 predicates and their interaction with actions, like those found in Temporal NetKAT [8] or those 2067 produced by the compositional theories (Sec. 2). It may be possible to build a hybrid framework, 2068 with ideas from both. A trace semantics occurs in previous work on KAT as well [26, 37]. 2069

Kozen studies KATs with arbitrary equations x := e [38], also called Schematic KAT, where 2070 e comes from arbitrary first-order structures over a fixed signature Σ . He has a pushback-like 2071 axiom $x := e \cdot p \equiv \phi[x/e] \cdot x := e$. Arbitrary first-order structures over Σ 's theory are much more 2072 expressive than anything we can handle-the pushback may or may not decrease in size, depending 2073 on Σ ; KATs over such theories are generally undecidable. We, on the other hand, are able to offer 2074 pay-as-you-go results for soundness and completeness as well as an implementations for deciding 2075 equivalence-but only for first-order structures that admit a non-increasing weakest precondition. 2076 Other extensions of KAT often give up on decidability, too. Larsen et al. [42] allow comparison 2077 of variables, but this of course leads to an incomplete theory. They are, able, however, to decide 2078 emptiness of an entire expression. 2079

Coalgebra provides a general framework for reasoning about state-based systems [39, 54, 59], which has proven useful in the development of automata theory for KAT extensions. Although we do not explicitly develop the connection in this paper, KMT uses tools similar to those used in coalgebraic approaches, and one could perhaps adapt our theory and implementation to that setting. In principle, we ought to be able to combine ideas from the two schemes into a single, even more general framework that supports complex actions *and* predicates.

Smolka et al. [61] find an almost linear algorithm for checking equivalence of *guarded* KAT terms ($O(n \cdot \alpha(n))$), where α is the inverse Ackermann function), i.e., terms which use if and while instead of + and *, respectively. Their guarded KAT is completely abstract, while our KMTs are completely concrete.

Our work is loosely related to Satisfiability Modulo Theories (SMT) [19]. The high-level motivation is the same—to create an extensible framework where custom theories can be combined [47] and used to increase the expressiveness and power [62] of the underlying technique (SAT vs. KA). However, the specifics vary greatly—while SMT is used to reason about the formula satisfiability, KMT is used to reason about how program structure interacts with tests. Some of our KMT theories implement satisfiability checking by calling out to Z3 [18].

The pushback requirement detailed in this paper is closely related to the classical notion of 2096 weakest precondition [6, 20, 55]. The pushback operation isn't quite a generalization of weakest 2097 preconditions because the various PB relations can change the program itself. Automatic weakest 2098 precondition generation is generally limited in the presence of loops in while-programs. While 2099 there has been much work on loop invariant inference [24, 25, 27, 34, 49, 57], the problem remains 2100 undecidable in most cases; however, the pushback restrictions of "growth" of terms makes it possible 2101 for us to automatically lift the weakest precondition generation to loops in KAT. In fact, this is 2102 exactly what the normalization proof does when lifting tests out of the Kleene star operator. 2103

- 2104 2105
- 2106
- 2107

2108 7 CONCLUSION

2109 Kleene algebra modulo theories (KMT) is a new framework for extending Kleene algebra with tests 2110 with the addition of actions and predicates in a custom domain. KMT uses an operation that pushes 2111 tests back through actions to go from a decidable client theory to a domain-specific KMT. Derived 2112 KMTs are sound and complete with respect to a trace semantics; we derive decision procedures for 2113 the KMT in an implementation that mirrors our formalism. The KMT framework captures common 2114 use cases and can reproduce by simple composition several results from the literature, some of which 2115 were challenging results in their own right, as well as several new results: we offer theories for 2116 bitvectors [30], natural numbers, unbounded setsand maps, networks [1], and temporal logic [8]. 2117 Our ability to reason about unbounded state is novel. Our work, however, is limited to tracing 2118 semantics; we conjecture that it is possible to merge actions (as in KAT+B!, NetKAT, and Kleene 2119 algebra with equations [1, 30, 40]), but leave it to future work. 2120

2121 ACKNOWLEDGMENTS

Dave Walker and Aarti Gupta provided valuable advice. Ryan Beckett was supported by NSF CNS
 award 1703493. Justin Hsu provided advice and encouragement.

2125 **REFERENCES**

- [1] Carolyn Jane Anderson, Nate Foster, Arjun Guha, Jean-Baptiste Jeannin, Dexter Kozen, Cole Schlesinger, and David Walker. 2014. NetKAT: Semantic Foundations for Networks. In *Proceedings of the 41st ACM SIGPLAN-SIGACT Symposium on Principles of Programming Languages* (San Diego, California, USA) (*POPL '14*). ACM, New York, NY, USA, 113–126.
- [2] M Anderson. 2014. Time Warner Cable Says Outages Largely Resolved. http://www.seattletimes.com/business/time warner-cable-says-outages-largely-resolved.
- [3] Allegra Angus and Dexter Kozen. 2001. *Kleene Algebra with Tests and Program Schematology*. Technical Report. Cornell University, Ithaca, NY, USA.
- [4] Mina Tahmasbi Arashloo, Yaron Koral, Michael Greenberg, Jennifer Rexford, and David Walker. 2016. SNAP: Stateful
 Network-Wide Abstractions for Packet Processing. In *Proceedings of the 2016 ACM SIGCOMM Conference* (Florianopolis,
 Brazil) (*SIGCOMM '16*). ACM, New York, NY, USA, 29–43.
- [5] Jorge A. Baier and Sheila A. McIlraith. 2006. Planning with First-order Temporally Extended Goals Using Heuristic Search. In *National Conference on Artificial Intelligence* (Boston, Massachusetts) (*AAAI'06*). AAAI Press, 788–795. http://dl.acm.org/citation.cfm?id=1597538.1597664
- [6] Mike Barnett and K. Rustan M. Leino. 2005. Weakest-precondition of Unstructured Programs. In *Proceedings of the 6th* ACM SIGPLAN-SIGSOFT Workshop on Program Analysis for Software Tools and Engineering (Lisbon, Portugal) (*PASTE* '05). ACM, New York, NY, USA, 82–87.
- [7] Adam Barth and Dexter Kozen. 2002. Equational verification of cache blocking in lu decomposition using kleene algebra with tests. Technical Report. Cornell University.
- [8] Ryan Beckett, Michael Greenberg, and David Walker. 2016. Temporal NetKAT. In *Proceedings of the 37th ACM SIGPLAN* Conference on Programming Language Design and Implementation (Santa Barbara, CA, USA) (PLDI '16). ACM, New York, NY, USA, 386–401.
- [9] Janusz A. Brzozowski. 1964. Derivatives of Regular Expressions. J. ACM 11, 4 (Oct. 1964), 481âĂŞ494. https:
 //doi.org/10.1145/321239.321249
- [10] Eric Hayden Campbell. 2017. Infiniteness and Linear Temporal Logic: Soundness, Completeness, and Decidability.
 Undergraduate thesis. Pomona College.
- [11] Eric Hayden Campbell and Michael Greenberg. 2018. Injecting finiteness to prove completeness for finite linear temporal logic. In submission.
- [12] Ernie Cohen. 1994. Hypotheses in Kleene Algebra. http://citeseerx.ist.psu.edu/viewdoc/summary?doi=10.1.1.56.6067
- [13] Ernie Cohen. 1994. Lazy Caching in Kleene Algebra. http://citeseerx.ist.psu.edu/viewdoc/summary?doi=10.1.1.57.5074
- [14] Ernie Cohen. 1994. Using Kleene algebra to reason about concurrency control. Technical Report. Telcordia.
- [15] Anupam Das and Damien Pous. 2017. A Cut-Free Cyclic Proof System for Kleene Algebra. In Automated Reasoning with Analytic Tableaux and Related Methods, Renate A. Schmidt and Cláudia Nalon (Eds.). Springer International Publishing, Cham, 261–277.
- [16] Giuseppe De Giacomo, Riccardo De Masellis, and Marco Montali. 2014. Reasoning on LTL on Finite Traces: Insensitivity
 to Infiniteness.. In AAAI. Citeseer, 1027–1033.
- 2156

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

1:44

- [17] Giuseppe De Giacomo and Moshe Y Vardi. 2013. Linear temporal logic and linear dynamic logic on finite traces.
 In *IJCAI'13 Proceedings of the Twenty-Third international joint conference on Artificial Intelligence*. Association for Computing Machinery, 854–860.
- [18] Leonardo De Moura and Nikolaj Bjørner. 2008. Z3: An Efficient SMT Solver. In Proceedings of the Theory and Practice of Software, 14th International Conference on Tools and Algorithms for the Construction and Analysis of Systems (Budapest, Hungary) (TACAS'08/ETAPS'08). Springer-Verlag, Berlin, Heidelberg, 337–340.
- [19] Leonardo De Moura and Nikolaj Bjørner. 2011. Satisfiability Modulo Theories: Introduction and Applications. *Commun.* ACM 54, 9 (Sept. 2011), 69–77.
- [20] Edsger W. Dijkstra. 1975. Guarded Commands, Nondeterminacy and Formal Derivation of Programs. Commun. ACM
 18, 8 (Aug. 1975), 453–457.
- [21] Nate Foster, Rob Harrison, Michael J. Freedman, Christopher Monsanto, Jennifer Rexford, Alec Story, and David Walker.
 2011. Frenetic: a network programming language. In *Proceeding of the 16th ACM SIGPLAN international conference on Functional Programming, ICFP 2011, Tokyo, Japan, September 19-21, 2011.* 279–291. https://doi.org/10.1145/2034773.
 2034812
- [22] Nate Foster, Dexter Kozen, Konstantinos Mamouras, Mark Reitblatt, and Alexandra Silva. 2016. Probabilistic NetKAT.
 In Programming Languages and Systems: 25th European Symposium on Programming, ESOP 2016, Held as Part of the European Joint Conferences on Theory and Practice of Software, ETAPS 2016, Eindhoven, The Netherlands, April 2–8, 2016, Proceedings, Peter Thiemann (Ed.). Springer Berlin Heidelberg, Berlin, Heidelberg, 282–309.
- [23] Nate Foster, Dexter Kozen, Matthew Milano, Alexandra Silva, and Laure Thompson. 2015. A Coalgebraic Decision Pro cedure for NetKAT. In *Proceedings of the 42Nd Annual ACM SIGPLAN-SIGACT Symposium on Principles of Programming Languages* (Mumbai, India) (*POPL '15*). ACM, New York, NY, USA, 343–355.
- [24] Carlo A. Furia and Bertrand Meyer. 2009. Inferring Loop Invariants using Postconditions. *CoRR* abs/0909.0884 (2009).
- [25] Carlo Alberto Furia and Bertrand Meyer. 2010. Inferring Loop Invariants Using Postconditions. Springer Berlin Heidelberg,
 Berlin, Heidelberg, 277–300.
- [26] Murdoch J. Gabbay and Vincenzo Ciancia. 2011. Freshness and Name-restriction in Sets of Traces with Names. In Proceedings of the 14th International Conference on Foundations of Software Science and Computational Structures: Part of the Joint European Conferences on Theory and Practice of Software (Saarbrücken, Germany) (FOSSACS'11/ETAPS'11).
 Berlin, Heidelberg, 365–380.
- [27] Juan P. Galeotti, Carlo A. Furia, Eva May, Gordon Fraser, and Andreas Zeller. 2014. Automating Full Functional
 Verification of Programs with Loops. *CoRR* abs/1407.5286 (2014). http://arxiv.org/abs/1407.5286
- [28] Phillipa Gill, Navendu Jain, and Nachiappan Nagappan. 2011. Understanding Network Failures in Data Centers:
 Measurement, Analysis, and Implications. In *SIGCOMM*.
- [29] Joanne Godfrey. 2016. The Summer of Network Misconfigurations. https://goo.gl/ViU9uS.
- [30] Niels Bjørn Bugge Grathwohl, Dexter Kozen, and Konstantinos Mamouras. 2014. KAT + B!. In Proceedings of the Joint Meeting of the Twenty-Third EACSL Annual Conference on Computer Science Logic (CSL) and the Twenty-Ninth Annual ACM/IEEE Symposium on Logic in Computer Science (LICS) (Vienna, Austria) (CSL-LICS '14). ACM, New York, NY, USA, Article 44, 44:1–44:10 pages.
- [31] Arjun Guha, Mark Reitblatt, and Nate Foster. 2013. Machine-verified network controllers. In ACM SIGPLAN Conference on Programming Language Design and Implementation, PLDI '13, Seattle, WA, USA, June 16-19, 2013. 483–494. https: //doi.org/10.1145/2462156.2462178
 [30] Lei D. M. Conference on Programming Language Design and Implementation, PLDI '13, Seattle, WA, USA, June 16-19, 2013. 483–494. https://doi.org/10.1145/2462156.2462178
- [32] John E. Hopcroft and R. M. Karp. 1971. A Linear Algorithm for Testing Equivalence of Finite Automata. Technical Report
 71-114. Cornell University.
- [33] Zeus Kerravala. 2004. What is Behind Network Downtime? Proactive Steps to Reduce Human Error and Improve
 Availability of Networks. https://www.cs.princeton.edu/courses/archive/fall10/cos561/papers/Yankee04.pdf.
- [34] Soonho Kong, Yungbum Jung, Cristina David, Bow-Yaw Wang, and Kwangkeun Yi. 2010. Automatically Inferring
 Quantified Loop Invariants by Algorithmic Learning from Simple Templates. In *Proceedings of the 8th Asian Conference* on *Programming Languages and Systems* (Shanghai, China) (*APLAS'10*). 328–343.
- [35] Dexter Kozen. 1994. A Completeness Theorem for Kleene Algebras and the Algebra of Regular Events. Inf. Comput.
 110, 2 (1994), 366–390. https://doi.org/10.1006/inco.1994.1037
- 2198
 [36] Dexter Kozen. 1997. Kleene Algebra with Tests. ACM Trans. Program. Lang. Syst. 19, 3 (May 1997), 427–443. https:

 2199
 //doi.org/10.1145/256167.256195
- [37] Dexter Kozen. 2003. *Kleene algebra with tests and the static analysis of programs*. Technical Report. Cornell University.
- [38] Dexter Kozen. 2004. Some results in dynamic model theory. *Science of Computer Programming* 51, 1 (2004), 3 22.
 https://doi.org/10.1016/j.scico.2003.09.004 Mathematics of Program Construction (MPC 2002).
- [39] Dexter Kozen. 2017. On the Coalgebraic Theory of Kleene Algebra with Tests. In *Rohit Parikh on Logic, Language and Society*. Springer, 279–298.
- 2204 2205

ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

Michael Greenberg, Ryan Beckett, and Eric Campbell

- [40] Dexter Kozen and Konstantinos Mamouras. 2014. Kleene Algebra with Equations. In Automata, Languages, and Programming: 41st International Colloquium, ICALP 2014, Copenhagen, Denmark, July 8-11, 2014, Proceedings, Part II, Javier Esparza, Pierre Fraigniaud, Thore Husfeldt, and Elias Koutsoupias (Eds.). Springer Berlin Heidelberg, Berlin, Heidelberg, 280–292.
- [41] Dexter Kozen and Maria-Christina Patron. 2000. Certification of Compiler Optimizations Using Kleene Algebra with
 Tests. In *Proceedings of the First International Conference on Computational Logic (CL '00)*. Springer-Verlag, London, UK,
 UK, 568–582.
- [42] Kim G Larsen, Stefan Schmid, and Bingtian Xue. 2016. WNetKAT: Programming and Verifying Weighted Software-Defined Networks. In *OPODIS*.
- [43] Ratul Mahajan, David Wetherall, and Tom Anderson. 2002. Understanding BGP Misconfiguration. In *SIGCOMM*.
- [44] Jedidiah McClurg, Hossein Hojjat, Nate Foster, and Pavol Černý. 2016. Event-driven Network Programming. In
 Proceedings of the 37th ACM SIGPLAN Conference on Programming Language Design and Implementation (Santa Barbara,
 CA, USA) (PLDI '16). ACM, New York, NY, USA, 369–385.
- [45] Christopher Monsanto, Nate Foster, Rob Harrison, and David Walker. 2012. A compiler and run-time system for network
 programming languages. In *Proceedings of the 39th ACM SIGPLAN-SIGACT Symposium on Principles of Programming* Languages, POPL 2012, Philadelphia, Pennsylvania, USA, January 22-28, 2012. 217–230. https://doi.org/10.1145/2103656.
- [46] Yoshiki Nakamura. 2015. Decision Methods for Concurrent Kleene Algebra with Tests: Based on Derivative. *RAMiCS* 2015 (2015), 1.
- [47] Greg Nelson and Derek C. Oppen. 1979. Simplification by Cooperating Decision Procedures. ACM Trans. Program.
 Lang. Syst. 1, 2 (Oct. 1979), 245–257.
- [48] Juniper Networks. 2008. As the Value of Enterprise Networks Escalates, So Does the Need for Configuration Management. https://www-935.ibm.com/services/au/gts/pdf/200249.pdf.
- [49] Saswat Padhi, Rahul Sharma, and Todd Millstein. 2016. Data-driven Precondition Inference with Learned Features.
 In Proceedings of the 37th ACM SIGPLAN Conference on Programming Language Design and Implementation (Santa Barbara, CA, USA) (PLDI '16). New York, NY, USA, 42–56.
- [50] Damien Pous. 2015. Symbolic Algorithms for Language Equivalence and Kleene Algebra with Tests. In *Proceedings of the 42Nd Annual ACM SIGPLAN-SIGACT Symposium on Principles of Programming Languages* (Mumbai, India) (POPL '15). New York, NY, USA, 357–368.
- [51] Mark Reitblatt, Marco Canini, Arjun Guha, and Nate Foster. 2013. FatTire: declarative fault tolerance for software defined networks. In *Proceedings of the Second ACM SIGCOMM Workshop on Hot Topics in Software Defined Networking*,
 HotSDN 2013, The Chinese University of Hong Kong, Hong Kong, China, Friday, August 16, 2013. 109–114. https:
 //doi.org/10.1145/2491185.2491187
- [52] Yakov Rekhter and Tony Li. 1995. A Border Gateway Protocol 4 (BGP-4). RFC 1654. RFC Editor. 1–56 pages. http://www.rfc-editor.org/rfc/rfc1654.txt
- [53] Grigore Roşu. 2016. Finite-Trace Linear Temporal Logic: Coinductive Completeness. In International Conference on Runtime Verification. Springer, 333–350.
- [54] J. J.M.M. Rutten. 1996. Universal Coalgebra: A Theory of Systems. Technical Report. CWI (Centre for Mathematics and Computer Science), Amsterdam, The Netherlands, The Netherlands.
- [55] Andrew E. Santosa. 2015. Comparing Weakest Precondition and Weakest Liberal Precondition. *CoRR* abs/1512.04013 (2015).
- [56] Cole Schlesinger, Michael Greenberg, and David Walker. 2014. Concurrent NetCore: From Policies to Pipelines. In
 Proceedings of the 19th ACM SIGPLAN International Conference on Functional Programming (Gothenburg, Sweden)
 (*ICFP '14*). ACM, New York, NY, USA, 11–24.
- [57] Rahul Sharma and Alex Aiken. 2014. From Invariant Checking to Invariant Inference Using Randomized Search. In Proceedings of the 16th International Conference on Computer Aided Verification - Volume 8559. New York, NY, USA, 88–105.
- [58] Simon Sharwood. 2016. Google cloud wobbles as workers patch wrong routers. http://www.theregister.co.uk/2016/03/
 01/google_cloud_wobbles_as_workers_patch_wrong_routers/.
- 2247 [59] Alexandra Silva. 2010. Kleene Coalgebra. PhD Thesis. University of Minho, Braga, Portugal.
- [60] Steffen Smolka, Spiridon Eliopoulos, Nate Foster, and Arjun Guha. 2015. A Fast Compiler for NetKAT. In *Proceedings* of the 20th ACM SIGPLAN International Conference on Functional Programming (Vancouver, BC, Canada) (ICFP 2015). ACM, New York, NY, USA, 328–341.
- [61] Steffen Smolka, Nate Foster, Justin Hsu, Tobias Kappé, Dexter Kozen, and Alexandra Silva. 2019. Guarded Kleene
 Algebra with Tests: Verification of Uninterpreted Programs in Nearly Linear Time. *Proc. ACM Program. Lang.* 4, POPL,
 Article 61 (Dec. 2019), 28 pages. https://doi.org/10.1145/3371129
- 2253 2254
- ACM Trans. Program. Lang. Syst., Vol. 1, No. 1, Article 1. Publication date: January 2020.

2255	[62] Aaron Stump, Clark W. Barrett, David L. Dill, and Jeremy R. Levitt. 2001. A Decision Procedure for an Extension Theory of Arrays. In LICS		
2250	[63]	Yevgenly Sverdlik, 2012. Microsoft: misconfigured network device led to Azure outage.	https://goo.gl/Se7DzD
2257	[]		
2258			
2259			
2260			
2261			
2262			
2263			
2264			
2265			
2266			
2267			
2268			
2269			
2270			
2271			
2272			
2273			
2274			
2275			
2276			
2277			
2270			
2279			
2280			
2201			
2202			
2205			
2204			
2286			
2287			
2288			
2289			
2290			
2291			
2292			
2293			
2294			
2295			
2296			
2297			
2298			
2299			
2300			
2301			
2302			