

# **K**leene **A**lgebra with **T**ests

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# Kleene Algebra with Tests



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# Guarded Kleene Algebra with Tests



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# NetKAT

[POPL '14]

$P ::=$



- | **false**
- | **true**
- | field = val
- | field := val
- | !p
- |  $p_1 + p_2$
- |  $p_1 \bullet p_2$
- |  $p^*$
- | **A → B**

Boolean  
Predicates

+

Regular  
Expressions

+

Packet  
Primitives

}

KAT

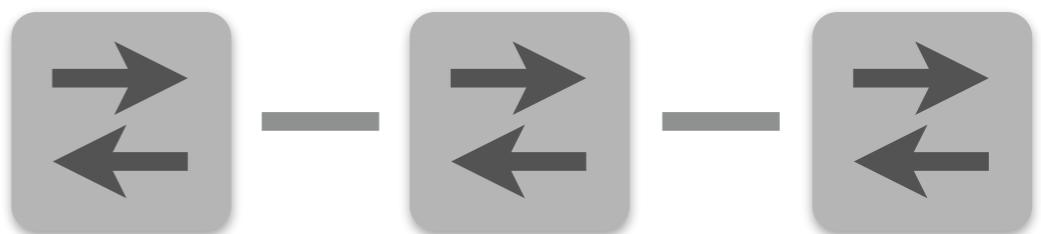
}

NetKAT

# Encoding Routers

It is straightforward to encode router forwarding tables and network topologies into NetKAT...

Pattern	Actions
dstport=22	Drop
srcip=10.0.0.1	Forward 1
*	Forward 2



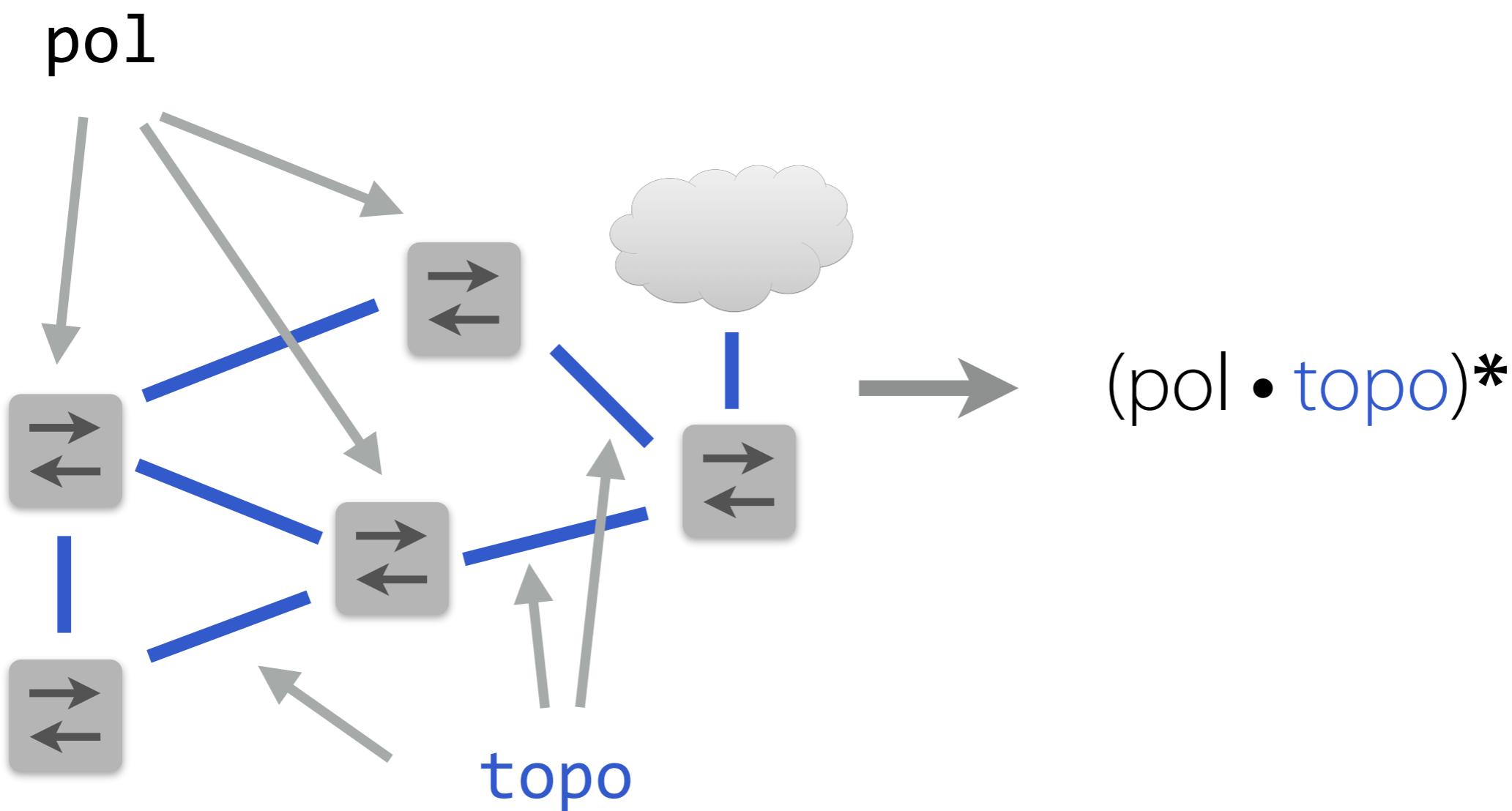
A              B              C

```
if dstport=22 then false  
elsif srcip=10.0.0.1 then port := 1  
else port := 2
```

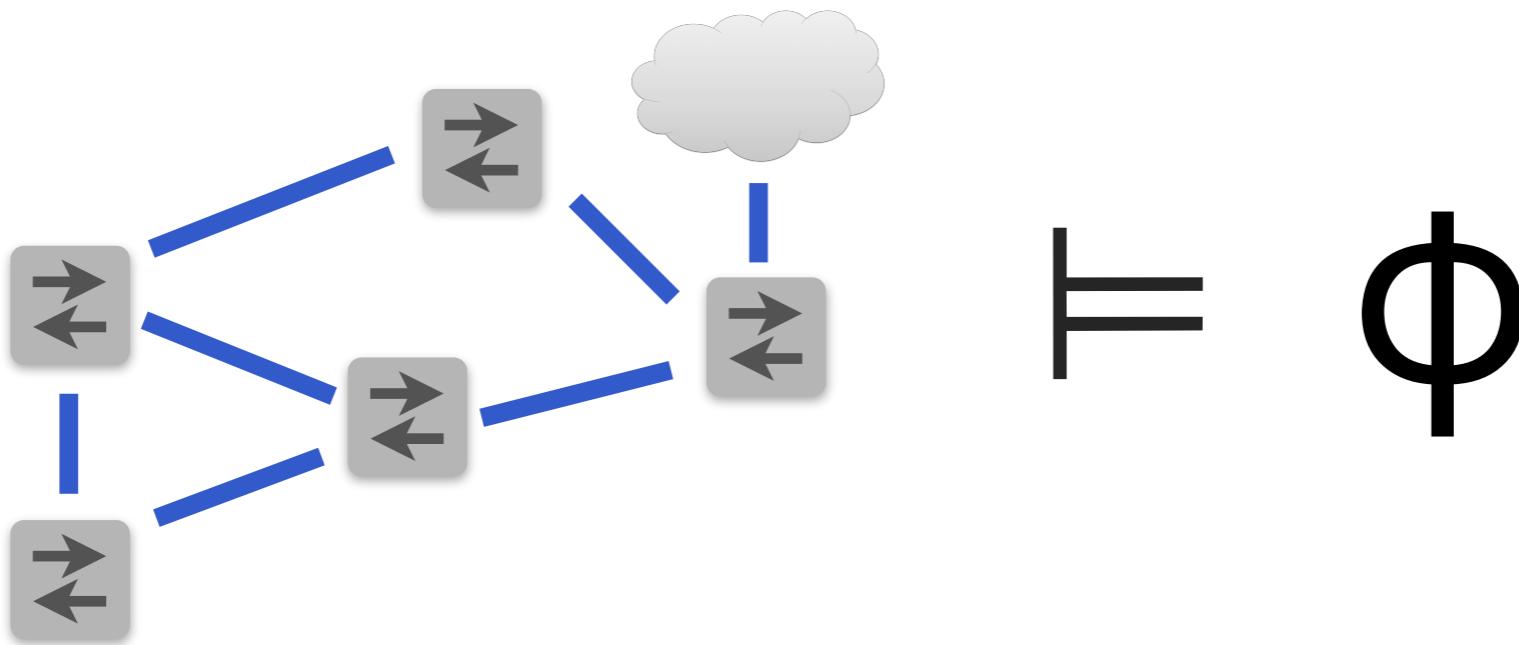
```
A → B + B → A + B → C + C → B
```

# Encoding Networks

...and entire networks can be encoded by iterating the processing done by the switches and topology



# Formal Reasoning



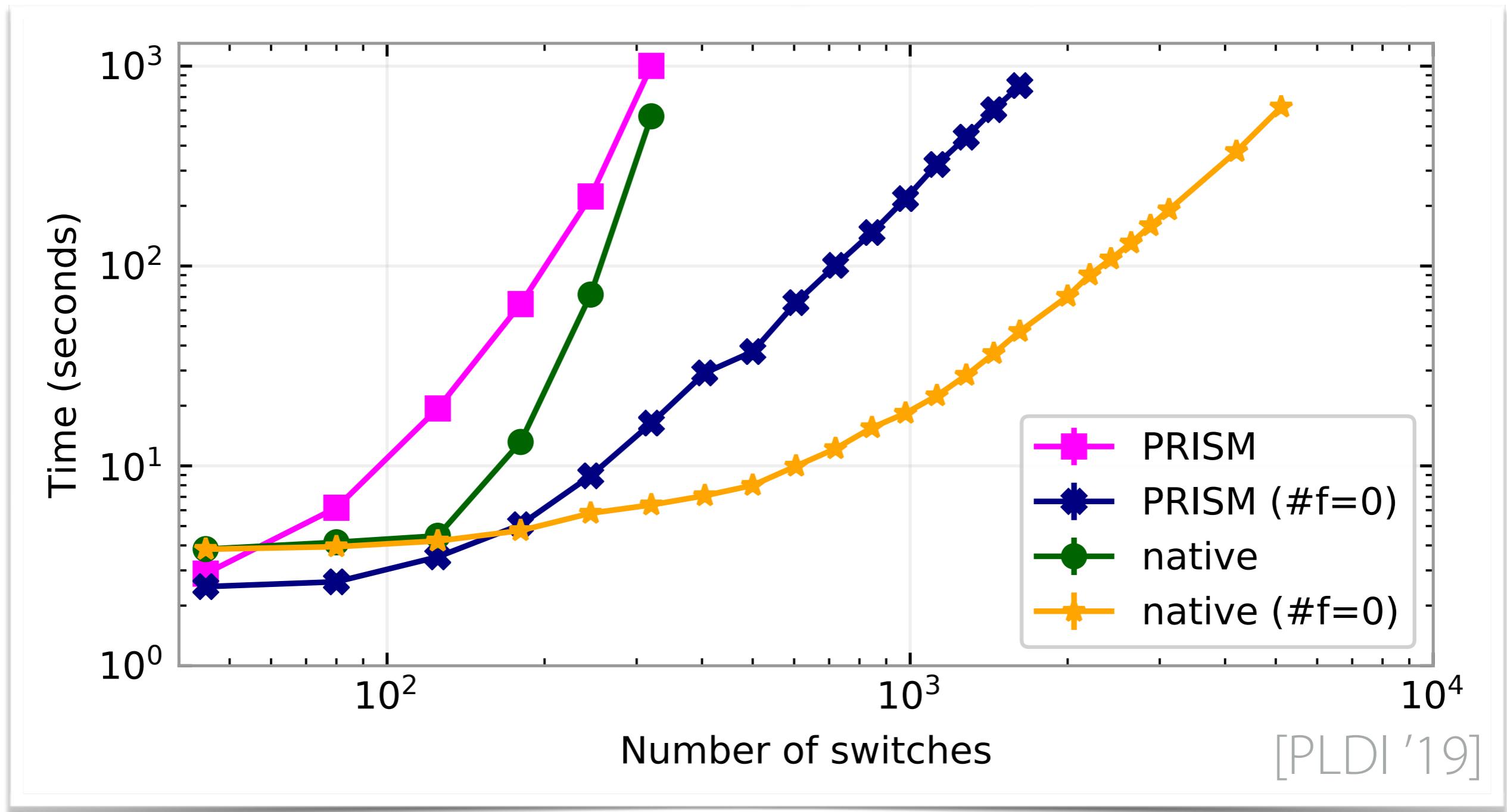
Given a network encoded this way, we'd like to be able to automatically answer questions like:

“Does the network isolate A and B?”

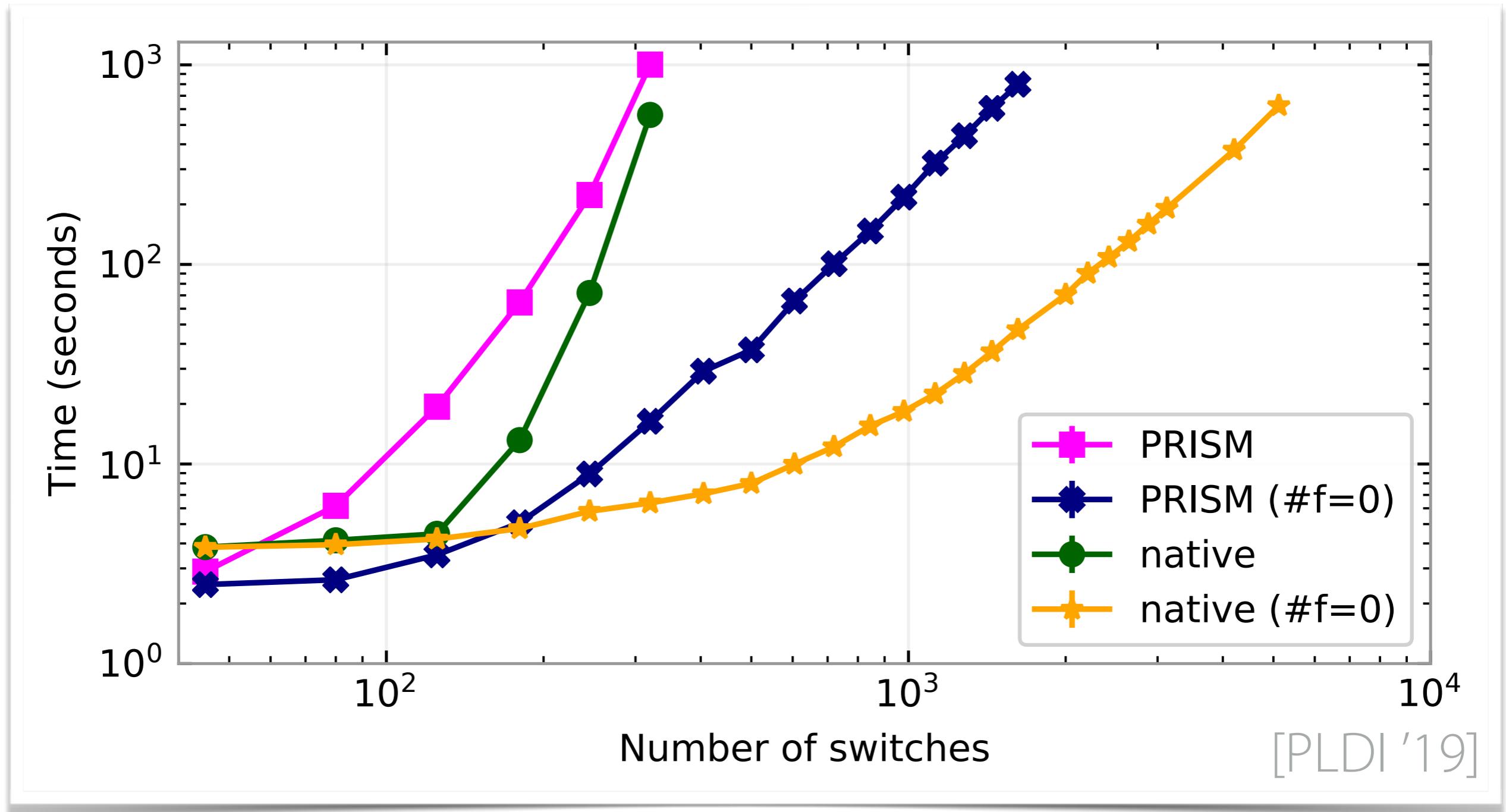
Can reduce this question (and others) to equivalence

$$A \bullet (\text{pol} \bullet \text{topo})^* \bullet B \equiv \text{false}$$

# Why does this work?



# Why does this work?



*Theorem [POPL '14]:* Deciding equivalence is PSPACE-complete

**“I can never remember  
the difference between  
PSPACE and outer space”**

**—A prominent academic**

# This Talk

Guarded KAT: a restriction that is  
reasonably expressive *and* efficient

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Guarded KAT: a restriction that is reasonably expressive *and* efficient

## Key Results:

- Decidable equivalence in (near) linear time
- Sound and complete axiomatization
- Automata model and Kleene Theorem

# GKAT Overview

# **GKAT Syntax**

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- ▶ finite set of **actions**  $p, q, r \in \text{Action}$

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## Syntax

$$b, c, d \in \text{BExp} ::= 0 \mid 1 \mid t \in \text{Test} \mid b \cdot c \mid b + c \mid \neg b$$

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|  $b \in \text{BExp}$   
|  $p \in \text{Action}$

**assert**  $b$   
**do**  $p$

Boolean algebra

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$e, f, g \in \text{Exp} ::=$

$b \in \text{BExp}$	<b>assert</b> $b$
$p \in \text{Action}$	<b>do</b> $p$
$e \cdot f$	$e ; f$
$e +_b f$	<b>if</b> $b$ <b>then</b> $e$ <b>else</b> $f$
$e^b$	<b>while</b> $b$ <b>do</b> $e$

# GKAT Syntax

**assert b**

**do p**

**e;f**

**if b then e else f**

**while b do e**

Semantics

+

Program equivalence



# GKAT Syntax

**assert b**

$$e \cdot 0 \equiv 0 \equiv 0 \cdot e$$

**do p**

$$e \cdot 1 \equiv e \equiv 1 \cdot e$$

**e;f**

$$(e \cdot f) \cdot g \equiv e \cdot (f \cdot g)$$

**if b then e else f**

...

**while b do e**

Semantics

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Program equivalence



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b	$\text{sat}(b)$

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$e^c$	$\text{sat}(c) \circ B_\iota[e] \circ B_\iota[e^c] \cup \text{sat}(!c)$

# Axioms

# **Guarded Union**

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$$U4: e +_b e' \equiv be +_b e'$$

$$U5: (e1 +_b e2) \cdot f \equiv e1 \cdot f +_b e2 \cdot f$$

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□

# Guarded Iteration

For guarded iteration, we use a “Salomaa-style” characterization of the fixed point

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Termination

$$\text{W1: } t \equiv e \cdot t +_b f \text{ and } E(e) \equiv 0 \Rightarrow$$
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W2:  $e^b \equiv 1 +_{!b} e \cdot e^b$

DL:  $(e +_b 1)^c \equiv (be)^c$

Eliminate  $\infty$  loops

# Termination and Continuation

$$E(b) = b$$

$$E(p) = 0$$

$$E(e^c) = !c$$

$$E(e +_b f) = b \cdot E(e) + !b \cdot E(f)$$

$$E(e \cdot f) = E(e) \cdot E(f)$$

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$$D(b) = 0$$

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$$D(e^c) = c \cdot D(e) \cdot e^c$$

$$D(e +_b f) = D(e) +_b D(f)$$

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**Theorem[FT]:**  $e \equiv 1 +_{E(e)} D(e)$

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# Example: Reasoning about Loops

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# Example: Reasoning about Loops

**Theorem:**  $e^c \equiv e^{bc} \cdot e^c$

$$\begin{aligned} & e^c \\ = & \{ U1 \} \\ & e^c +_{bc} e^c \\ = & \{ \text{Productive Loop Lemma} \} \\ & (\neg E(e) \cdot D(e))^c +_{bc} e^c \end{aligned}$$

**Lemma[Productive]**

$$e^c \equiv (\neg E(e) \cdot D(e))^c$$

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**Lemma[Productive]**

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$$W2 \quad e^b \equiv 1 +_{!b} e \cdot e^b$$

$$\begin{aligned} W1 \quad t & \equiv e \cdot t +_b f \Rightarrow \\ t & \equiv e^b \cdot f \end{aligned}$$

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**Theorem:**  $e^c \equiv e^{bc} \cdot e^c$

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$$e^c \equiv (!E(e) \cdot D(e))^c$$

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# Decision Procedure

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$\forall i:$   
 $B_i[\![\mathbf{e}]\!] = B_i[\![\mathbf{f}]\!]$   
?

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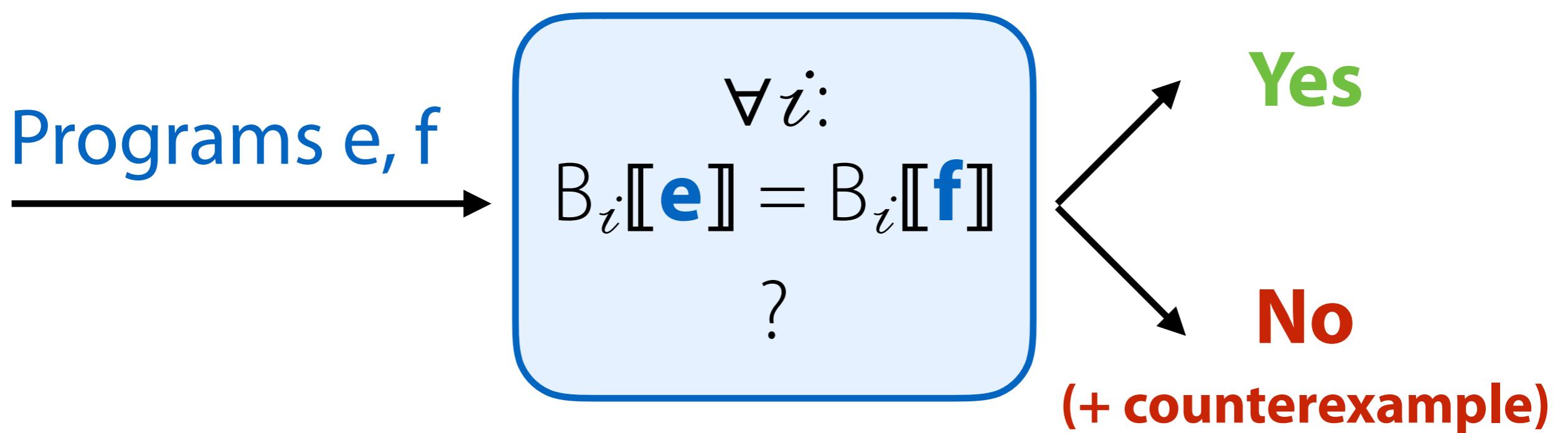
Programs e, f



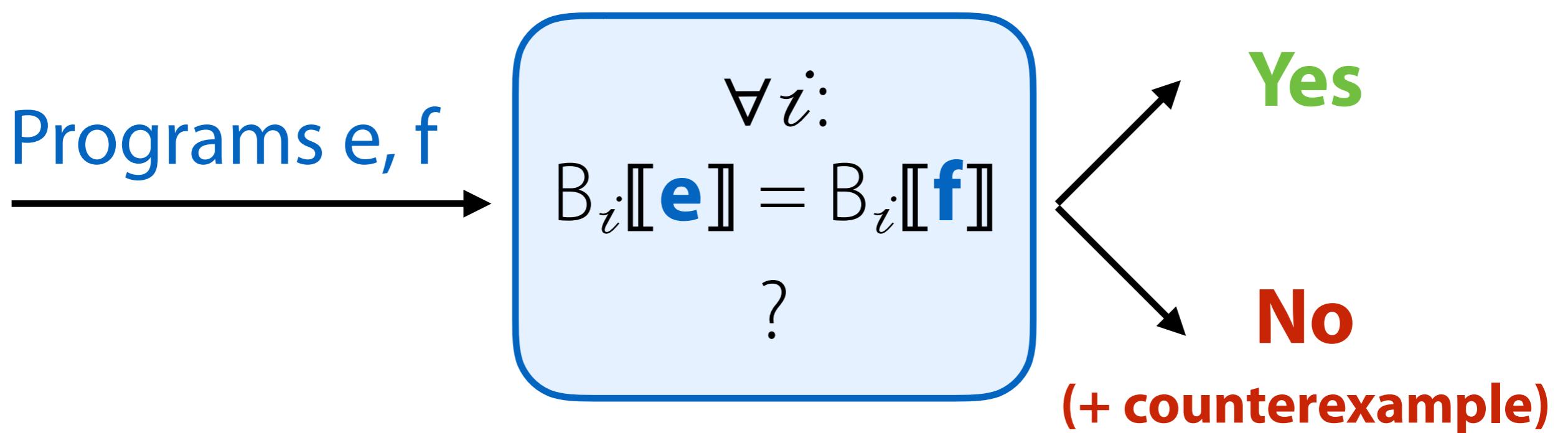
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**Key Challenge:**

There are infinitely many interpretations  $i$ !

# Overview

## 1. Develop "universal semantics" (aka free model)

- i)  $\llbracket e \rrbracket = \llbracket f \rrbracket \iff \forall i. B_i \llbracket e \rrbracket = B_i \llbracket f \rrbracket$
- ii)  $\llbracket e \rrbracket$  is a set of strings (i.e., formal language)

## 2. Develop automaton model (aka coalgebra)

- i) algorithm  $e \mapsto A_e$
- ii) automaton  $A_e$  recognizes language  $\llbracket e \rrbracket$
- iii)  $|A_e| \in O(|e|)$
- iv)  $A_e$  is deterministic

## 3. Decide $e \equiv f$

- i) check bisimilarity  $A_e \sim A_f$
- ii) using Hopcroft-Karp:  $O^*(|A_e| + |A_f|)$

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Interpret program as **set of successful "runs"** it induces:

$$[\![p]\!] := \{ \text{runs of } p \}$$

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Atomic predicates ("truth assignments")

$$\text{Atom} := \{ \prod_{t \in \text{Test}} \text{lit}_t \mid \text{lit}_t \in \{t, \neg t\} \}$$

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$$[\![p]\!]:= \{ \text{ runs of } p \}$$

---

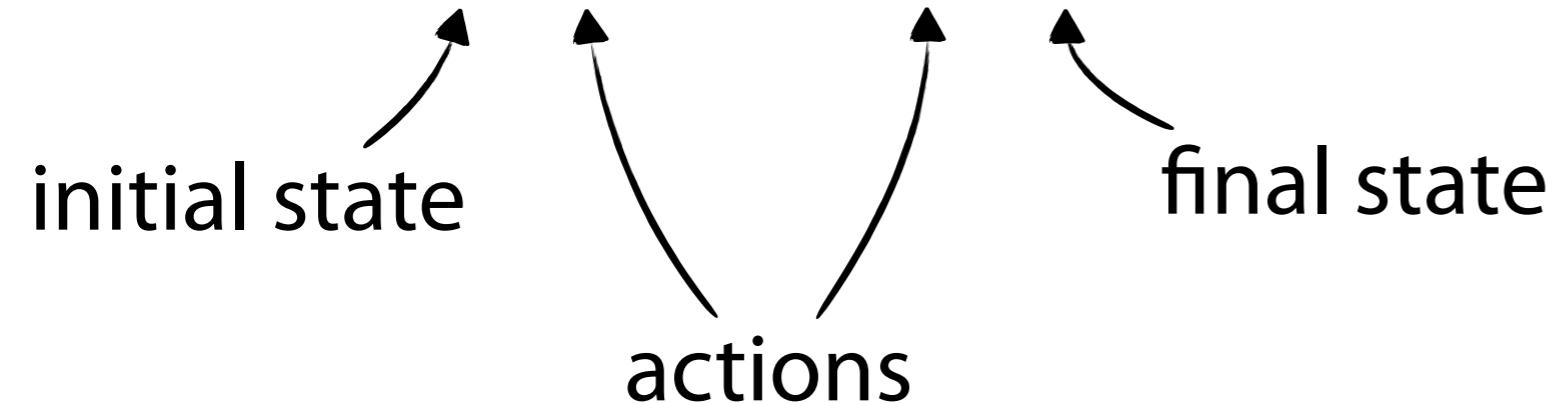
Atomic predicates ("truth assignments")

$$\text{Atom} := \{ \prod_{t \in \text{Test}} \text{lit}_t \mid \text{lit}_t \in \{t, \neg t\} \}$$

---

Runs are finite strings of the form

$$a_0 p_1 a_1 \dots p_n a_n \in \text{Atom} \cdot (\text{Action} \cdot \text{Atom})^*$$



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Interpret program as **set of successful “runs”**:

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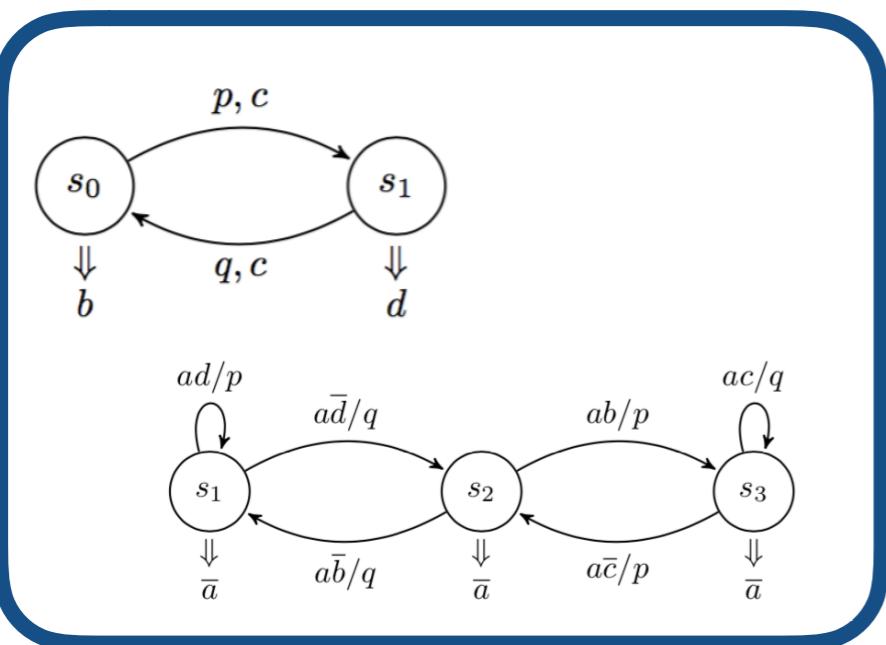
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**Theorem[Soundness]:** Axioms sound with respect to the Language Model:  $e \equiv f \Rightarrow [\![e]\!] = [\![f]\!]$

# Kleene Theorem

## Automata

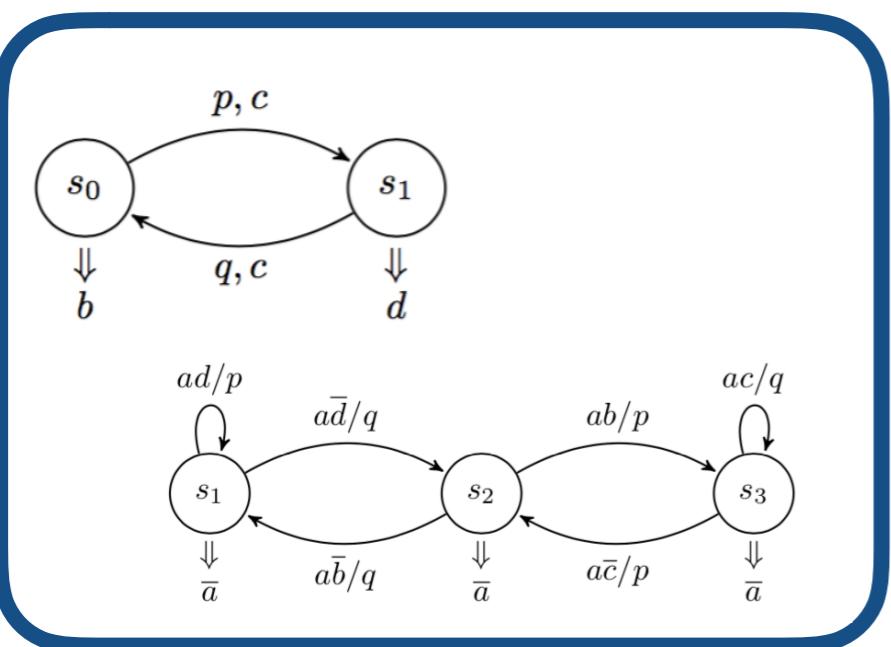


## Programs

$e^{(bc)} \cdot e^{(c)}$   
 $(e1 +_b e2) \cdot f$   
 $(e^{(b)} \cdot f)^{(c)}$

# Kleene Theorem

## Automata



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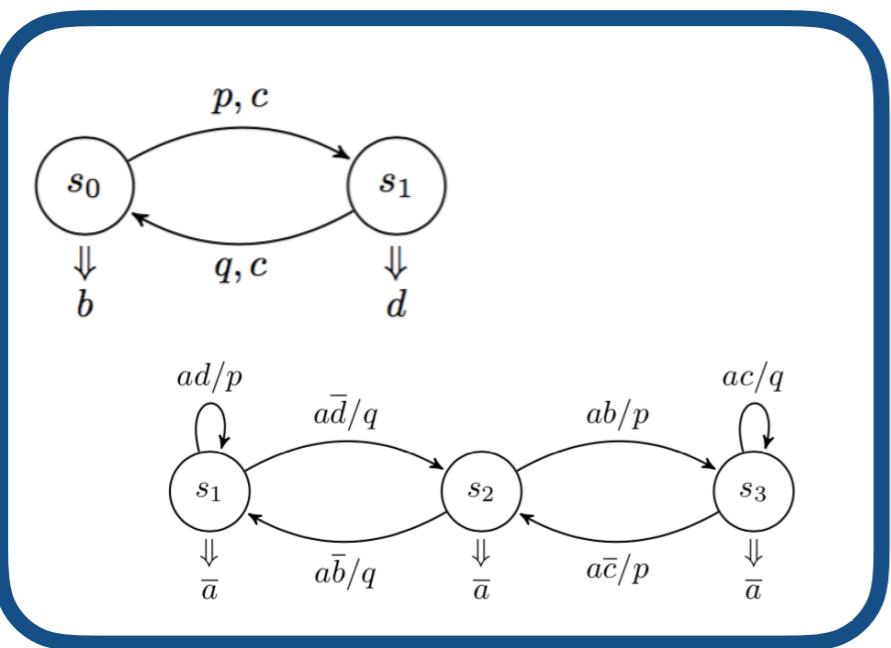
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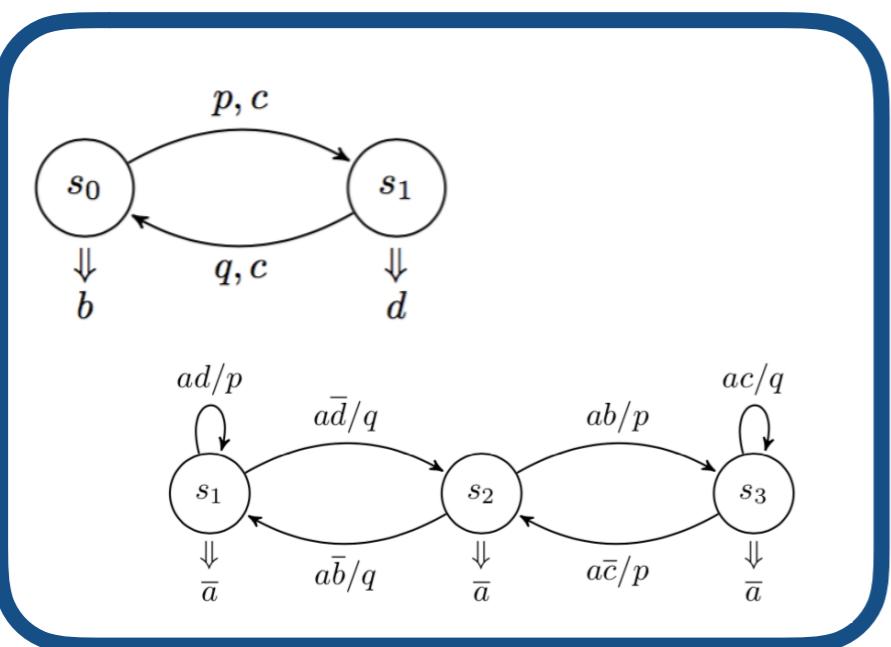
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Decidability

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$A_1 \sim A_2$

Completeness

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(Un)Successful  
termination

State of program

$$S \xrightarrow{\delta} (2 + \Sigma \times S)^{\text{At}}$$

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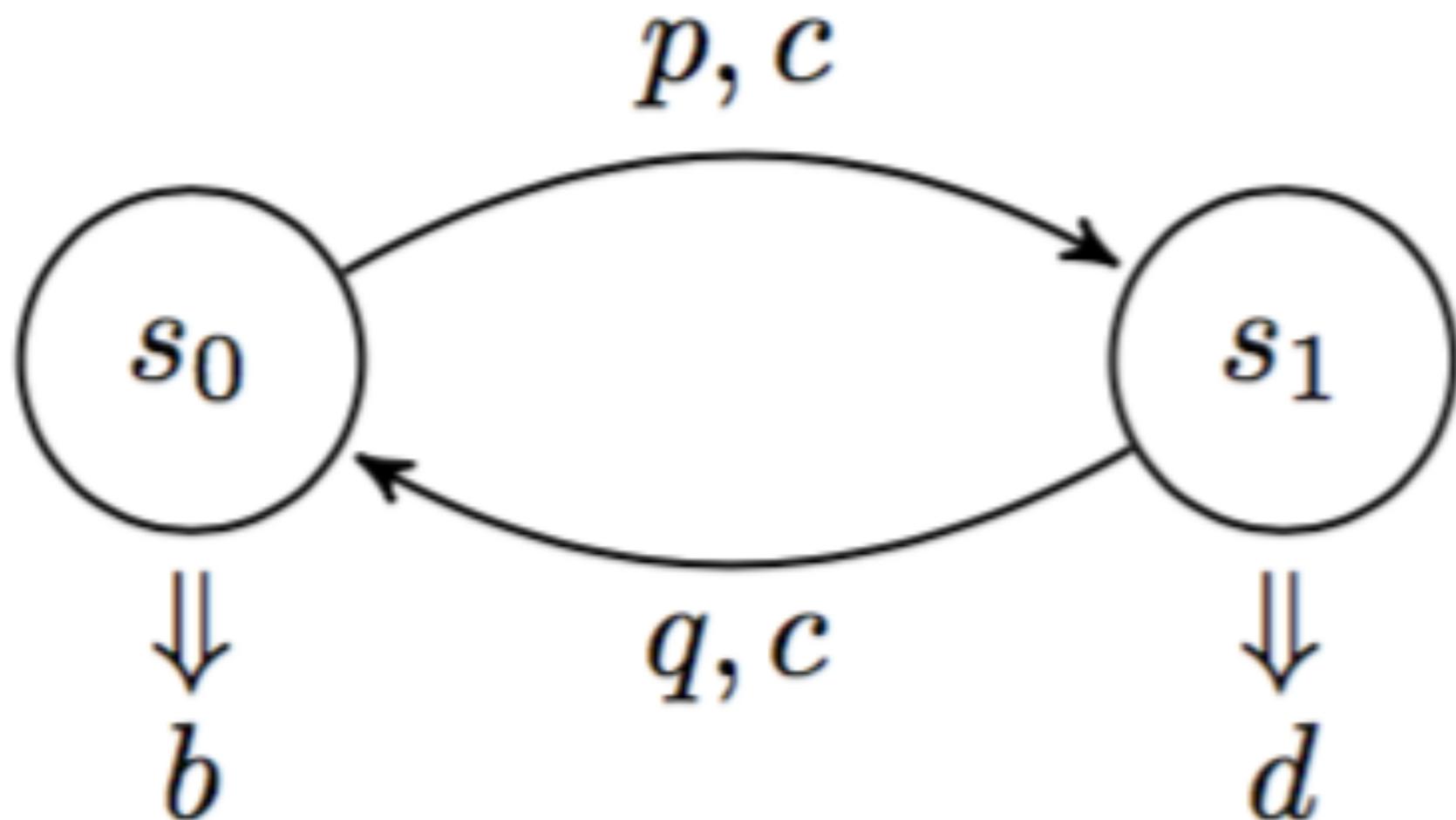
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$$apw \in L(s) \iff \delta(s)(a) = \langle p, s' \rangle \text{ and } w \in L(s')$$

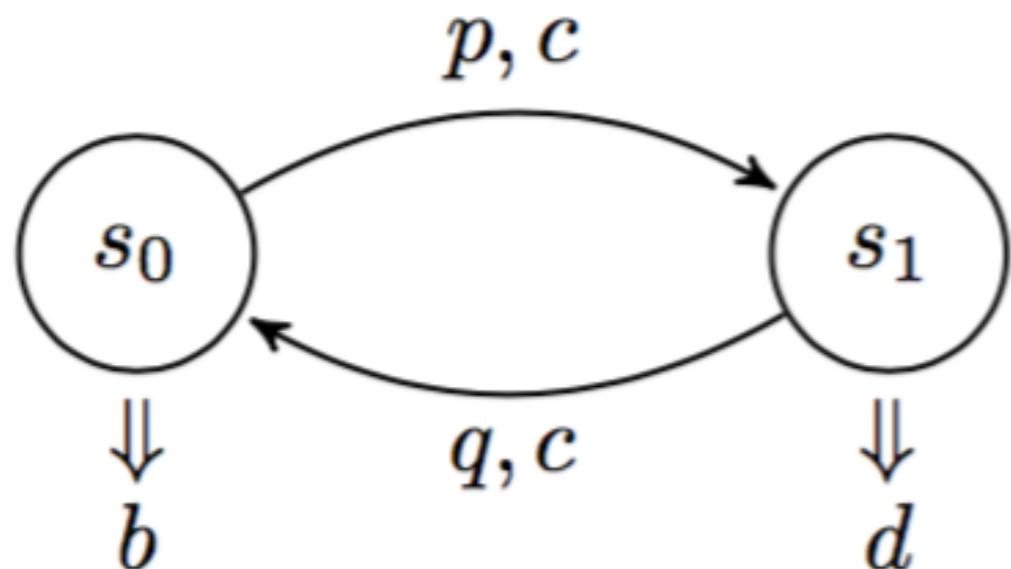
# Challenge

Not all automata correspond to a GKAT program!



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```
while !b do
    assert c;
    p
    if c then
        q
    else
        “break”
    done
```

# Well-Nested Loops



## Idea

- ▶ Characterize automata that correspond to well-nested GKAT programs
- ▶ Intuitively, we need a way capture the uniform interface between each well-nested loop and its surrounding context

# Uniformity

## Pseudo State

Call an arbitrary element  $h$  of  $G \times X$  a *pseudo state*:

$$\forall a. h(a) \in (2 + \Sigma \times X)$$

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## Uniform Extension

Given  $\langle X, \delta \rangle$ , the *uniform extension* of  $Y$  by  $h$  is the coalgebra  $\langle X, \delta\{h,Y\} \rangle$  where

$$\delta\{h,Y\}(x)(a) = \begin{cases} h(a) & \text{if } x \in X \text{ and } \delta(x)(a) = 1 \\ \delta(x)(a) & \text{otherwise} \end{cases}$$

# Simple Coalgebras

The set of *simple* coalgebras is defined inductively:

- If  $\delta_X$  has no transitions, then  $\langle X, \delta_X \rangle$  is simple
- If  $\langle X, \delta_X \rangle$  and  $\langle Y, \delta_Y \rangle$  are simple, and  $h \in G(X + Y)$ ,  
then  $\langle X + Y, (\delta_X + \delta_Y)\{h, X\} \rangle$  is simple

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**Theorem:** Every simple coalgebra corresponds to a (well-nested) GKAT program

# **Thompson Construction**

# Thompson Construction

Expression	States X	Continuation $\delta$	Initial $\iota(a)$
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$e +_b f$	$X_e + X_f$	$\delta_e + \delta_f$	$\iota_e a \leq b$ $\iota_e a \leq !b$

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$e^c$	$X_e$	$(\delta_e)\{\iota_e, X_e\}$	1      if $a \leq !c$ 0      if $a \leq c \ \iota_e(a) = 1$ $\iota_e(a) \text{ if } a \leq c \ \iota_e(a) \neq 1$

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Expression	States X	Continuation $\delta$	Initial $\iota(a)$
$h$	$\emptyset$	$\emptyset$	$[\alpha < b]$
$e$	$\langle \{\iota\} + X_e, \delta_{X_e} \cup \{ \iota \mapsto \iota_e \} \rangle$		
$e$	$X_e$	$(\delta_e)\{\iota_e, X_e\}$	$\begin{cases} \iota_e & \text{if } a \neq 1 \\ 1 & \text{if } a \leq !c \\ 0 & \text{if } a \leq c \ i_e(a) = 1 \\ i_e(a) & \text{if } a \leq c \ i_e(a) \neq 1 \end{cases}$
$e^c$			

# Wrapping Up

# Conclusion

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  - ▶ efficient fragment of ProbNetKAT



**Thank you!**



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