

On Higher-Order Program Verification and Two Notions of Higher-Order Model Checking

Naoki Kobayashi
University of Tokyo

Summaries of papers from POPL09,
POPL17 (joint work with
Etienne Lozes, Florian Bruse), and
more recent work (joint work with Takeshi Tsukada,
and Keiichi Watanabe)

Two Notions of Higher-Order Model Checking

	Models	Logic
finite state model checking	finite state systems	modal μ -calculus

Two Notions of Higher-Order Model Checking

	Models	Logic
finite state model checking	finite state systems	modal μ -calculus
HORS model checking [Knapik+ 01; Ong 06]	higher-order recursion schemes (HORS)	modal μ -calculus

Useful for modeling a certain class of **infinite** state systems (such as higher-order functional programs)

Two Notions of Higher-Order Model Checking

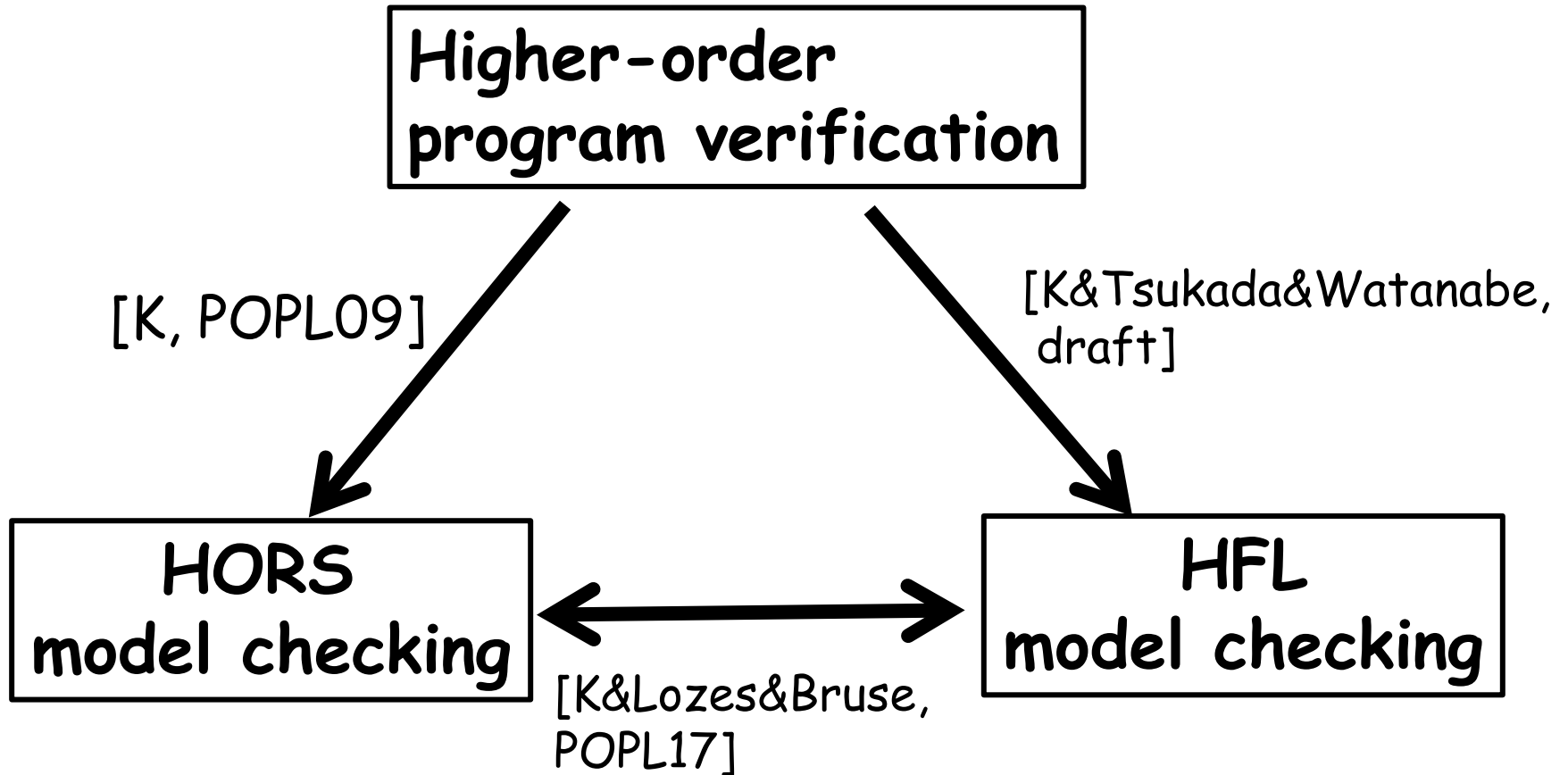
	Models	Logic
finite state model checking	finite state systems	modal μ -calculus
HORS model checking [Knapik+ 01; Ong 06]	higher-order recursion schemes (HORS)	modal μ -calculus
HFL model checking [Viswanathan & Viswanathan 04]	finite state systems	higher-order modal fixpoint logic (HFL)

Useful for describing non-regular properties

Two Notions of Higher-Order Model Checking

	Applied to verification of higher-order programs [K09][K+11]...	Logic
finite state model checking		modal μ -calculus
HORS model checking [Knapik+ 01; Ong 06]	higher-order recursion schemes (HORS)	modal μ -calculus
HFL model checking [Viswanathan & Viswanathan]	finite state systems	higher-order modal fixpoint logic (HFL)
	verification of concurrent systems [VV 04][Lange+ 14]	

This Talk



Outline

- ◆ Reviews of HORS model checking and HFL model checking
 - HORS model checking
 - HFL model checking
- ◆ From program verification to HORS model checking
- ◆ Conversion between HORS/HFL model checking
- ◆ From program verification to HFL model checking
- ◆ Conclusion

Higher-Order Recursion Scheme (HORS)

- ◆ Grammar for generating an infinite tree

Order-0 HORS
(regular tree grammar)

$$S \rightarrow a \ c \ B$$
$$B \rightarrow b \ S$$
$$S \rightarrow \begin{array}{l} a \\ / \quad \backslash \\ c \quad B \end{array}$$
$$B \rightarrow \begin{array}{l} b \\ | \\ S \end{array}$$

Higher-Order Recursion Scheme (HORS)

◆ Grammar for generating an infinite tree

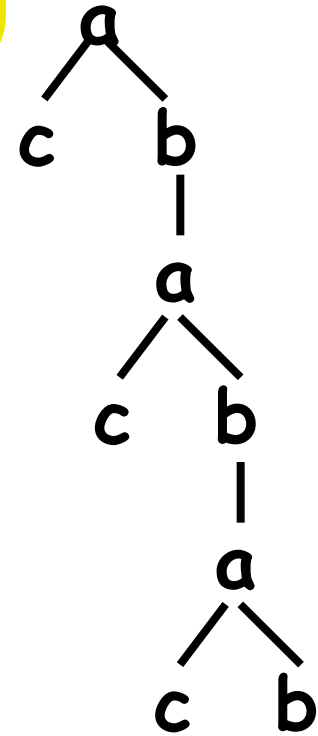
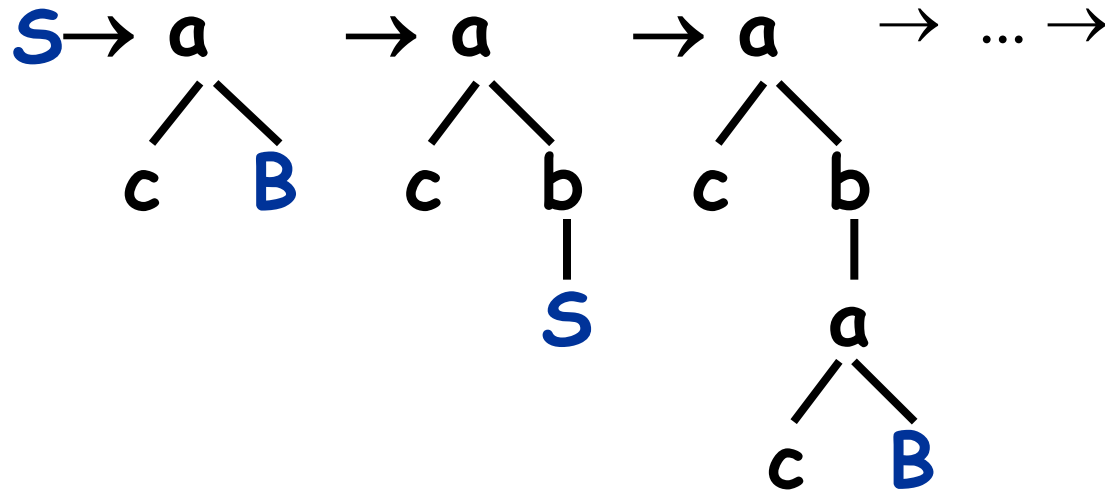
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$S \rightarrow a$
 $\swarrow \searrow$
 $c \ B$

$B \rightarrow b$
 \mid
 S



Higher-Order Recursion Scheme (HORS)

◆ Grammar for generating an infinite tree

Order-1 HORS

$$S \rightarrow A c$$
$$A x \rightarrow a x (A (b x))$$
$$S: o, A: o \rightarrow o$$

Higher-Order Recursion Scheme (HORS)

◆ Grammar for generating an infinite tree

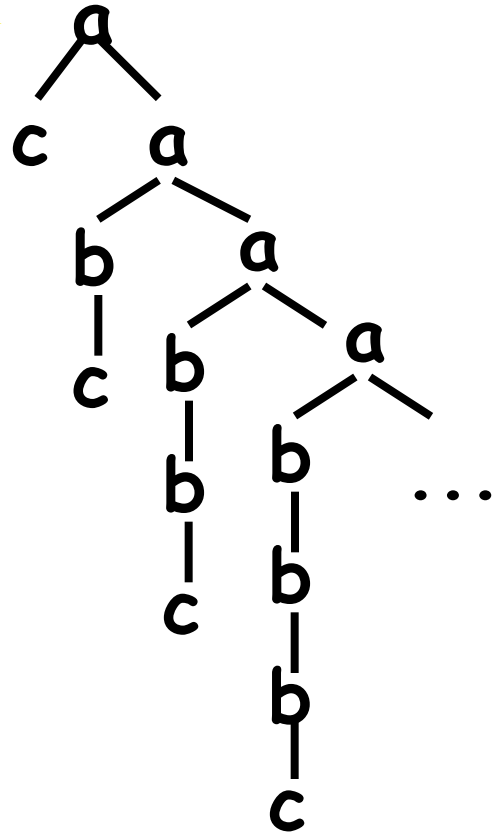
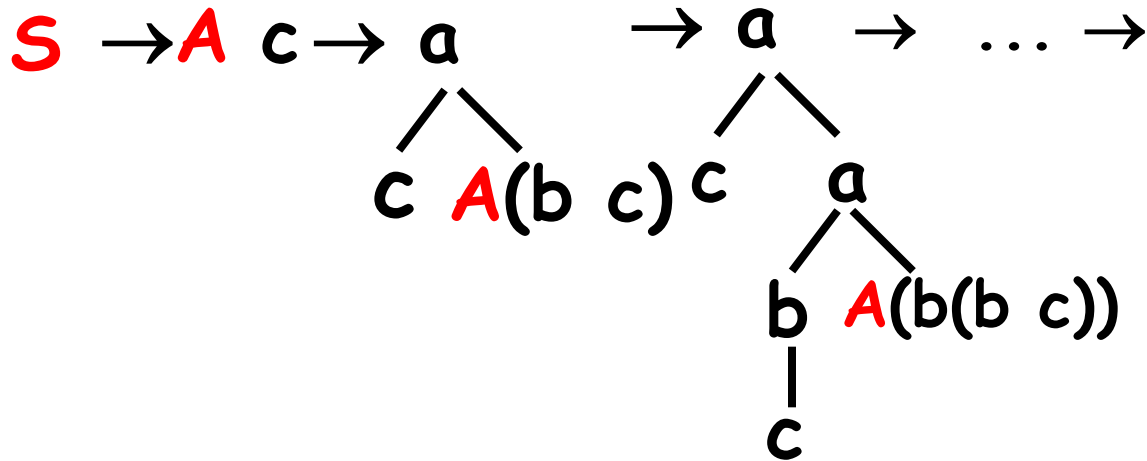
Tree whose paths are labeled by $a^{m+1} b^m c$

Order-1 HORS

$S \rightarrow A c$

$A x \rightarrow a x \quad (A (b x))$

$S: o, A: o \rightarrow o$



Higher-Order Recursion Scheme (HORS)

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HORS

\approx

Call-by-name simply-typed λ -calculus

+

recursion, tree constructors

HORS Model Checking

Given

G : HORS

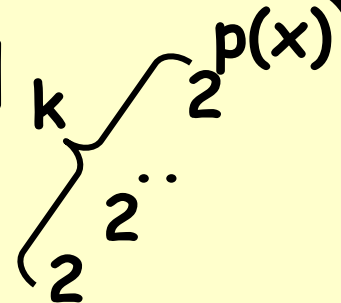
A : alternating parity tree automaton (APT)
(a formula of modal μ -calculus or MSO),
does A accept $\text{Tree}(G)$?

e.g.

- Does every finite path of $\text{Tree}(G)$ end with "c"?
- Does "a" occur below "b" in $\text{Tree}(G)$?

k -EXPTIME-complete [Ong, LICS06]
(for order- k HORS)

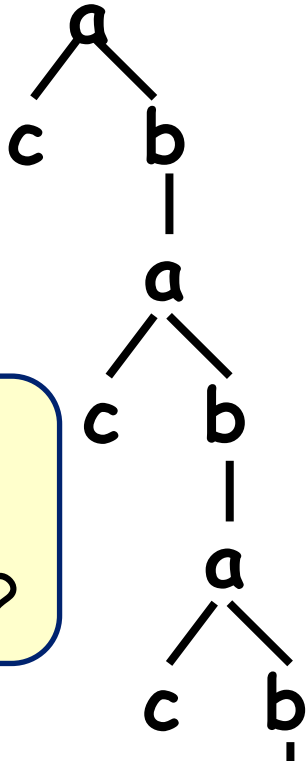
but practical algorithms exist



HORS Model Checking as Generalization of Finite State/Pushdown Model Checking

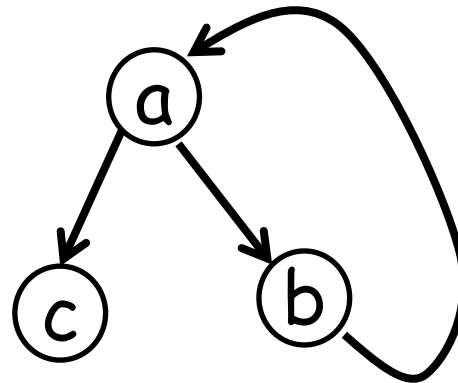
- ◆ order-0 \approx finite state model checking
- ◆ order-1 \approx pushdown model checking

infinite tree \approx transition system



Does "a" occur below "b"?

transition system

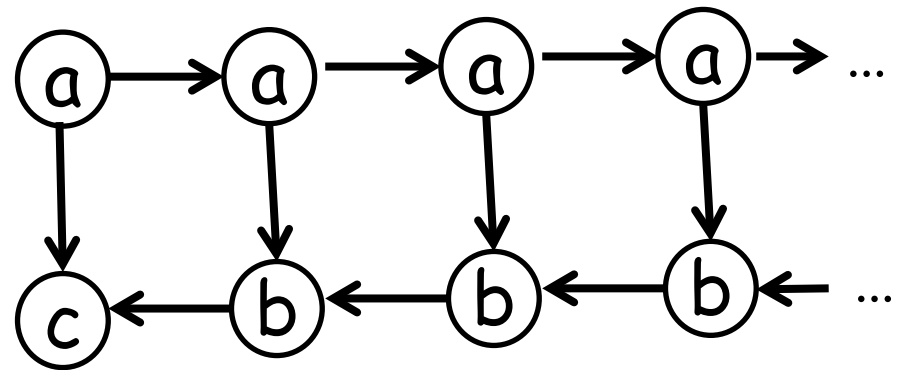
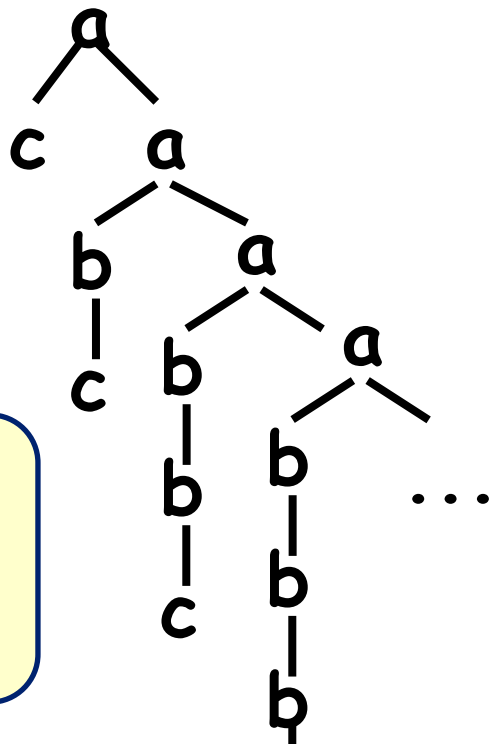


Is there a transition sequence in which "a" occurs after "b"?

HORS Model Checking as Generalization of Finite State/Pushdown Model Checking

- ◆ order-0 \approx finite state model checking
- ◆ order-1 \approx pushdown model checking

infinite tree \approx (infinite-state) transition system



Does "a" occur below "b"?

Is there a transition sequence in which "a" occurs after "b"?

Outline

- ◆ **Reviews of HORS model checking and HFL model checking**
 - HORS model checking
 - **HFL model checking**
- ◆ **From program verification to HORS model checking**
- ◆ **Conversion between HORS/HFL model checking**
- ◆ **From program verification to HFL model checking**
- ◆ **Conclusion**

Higher-Order Modal Fixpoint Logic (HFL) [Viswanathan&Viswanathan 04]

◆ Higher-order extension of the modal μ -calculus

$\varphi ::= \text{true}$

$\varphi_1 \wedge \varphi_2$

$\varphi_1 \vee \varphi_2$

$[a]\varphi$

φ must hold after a

$\langle a \rangle \varphi$

φ may hold after a

X

propositional variable

$\mu X. \varphi$

least fixpoint

$\nu X. \varphi$

greatest fixpoint

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$[a]\varphi$

φ must hold after a

$\langle a \rangle \varphi$

φ may hold after a

X

predicate variable

$\mu X^{\kappa} . \varphi$

least fixpoint

$\nu X^{\kappa} . \varphi$

greatest fixpoint

$\lambda X^{\kappa} . \varphi$

(higher-order) predicate

$\varphi_1 \varphi_2$

application

$\kappa ::= \bullet \mid \kappa_1 \rightarrow \kappa_2$

Selected Typing Rules for HFL

$$\Gamma \vdash \text{true} : \bullet$$

$$\Gamma \vdash \varphi : \bullet \quad \Gamma \vdash \psi : \bullet$$

$$\Gamma \vdash \varphi \wedge \psi : \bullet$$

$$\Gamma, X : \kappa \vdash X : \kappa$$

$$\Gamma \vdash \varphi : \kappa_1 \rightarrow \kappa_2 \quad \Gamma \vdash \psi : \kappa_1$$

$$\Gamma \vdash \varphi \psi : \kappa_2$$

$$\Gamma \vdash \varphi : \bullet$$

$$\Gamma \vdash [a]\varphi : \bullet$$

$$\Gamma, X : \kappa_1 \vdash \varphi : \kappa_2$$

$$\Gamma \vdash \lambda X. \varphi : \kappa_1 \rightarrow \kappa_2$$

$$\Gamma, X : \kappa \vdash \varphi : \kappa$$

$$\Gamma \vdash \mu X. \varphi : \kappa$$

Semantics

$[\varphi]_I$: the set of states that satisfy φ

$L \models \varphi \Leftrightarrow s_{\text{init}} \in [\varphi]_\emptyset$ (s_{init} : initial state of L)

$[\text{true}]_I = \text{States}$ $[\varphi \wedge \psi]_I = [\varphi]_I \cap [\psi]_I$

$[\varphi \vee \psi]_I = [\varphi]_I \cup [\psi]_I$

$[[\alpha] \varphi]_I = \{s \mid \forall t. (s \rightarrow_\alpha t \text{ implies } t \in [\varphi]_I)\}$

$[\langle \alpha \rangle \varphi]_I = \{s \mid \exists t. (s \rightarrow_\alpha t \text{ and } t \in [\varphi]_I)\}$

$[\mu X^k. \varphi]_I = \text{lfp}(\lambda x \in [k]. [\varphi]_{I\{X=x\}})$

$[\nu X^k. \varphi]_I = \text{gfp}(\lambda x \in [k]. [\varphi]_{I\{X=x\}})$

$[\lambda X^k. \varphi]_I = \lambda x \in [k]. [\varphi]_{I\{X=x\}}$

$[\varphi \ \psi]_I = [\varphi]_I \ [\psi]_I$ $[X]_I = I(X)$

$[\bullet] = 2^{\text{States}}$

$[k_1 \rightarrow k_2] = \{f \in [k_1] \rightarrow [k_2] \mid f: \text{monotonic}\}$

Example

$$(\mu F \bullet \rightarrow \bullet \rightarrow \bullet . \lambda X . \lambda Y . (X \wedge Y) \vee F (<a>X) (Y)) P Q$$

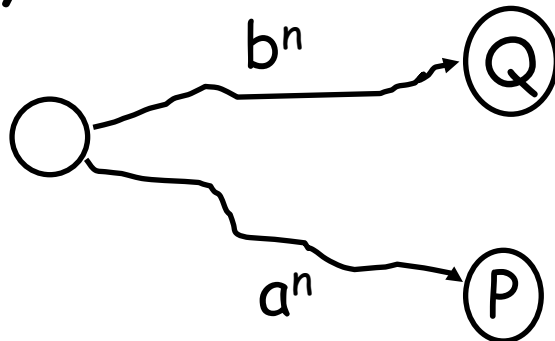
$$= (P \wedge Q) \vee$$

$$(\mu F \bullet \rightarrow \bullet \rightarrow \bullet . \lambda X . \lambda Y . (X \wedge Y) \vee$$

$$F (<a>X) (Y)) (<a>P) (Q)$$

$$= (P \wedge Q) \vee (<a>P \wedge Q) \vee (<a><a>P \wedge Q) \vee \dots$$

For some n , $<a>^n P$ and $^n Q$ hold



HFL Model Checking

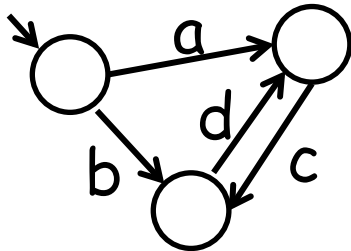
Given

L: (finite-state) labeled transition system

φ : HFL formula,
does L satisfy φ ?

e.g. $L \models \varphi$ for:

L:



φ : $(\mu F. \lambda X. \lambda Y. (X \wedge Y))$
 $\vee F (<a>X) (Y))$
 $(<c>\text{true}) (<d>\text{true})$

HES (Hierarchical Equation Systems) Representation of HFL Formulas

$$X_1 =_{\alpha_1} \varphi_1; \dots; X_n =_{\alpha_n} \varphi_n$$

$(\alpha_i \in \{\mu, \nu\})$

Example:

$$\text{HFL: } \nu X. \mu Y. (\langle a \rangle X \vee \langle b \rangle Y)$$

(there exists a path $(b^*a)^\omega$)

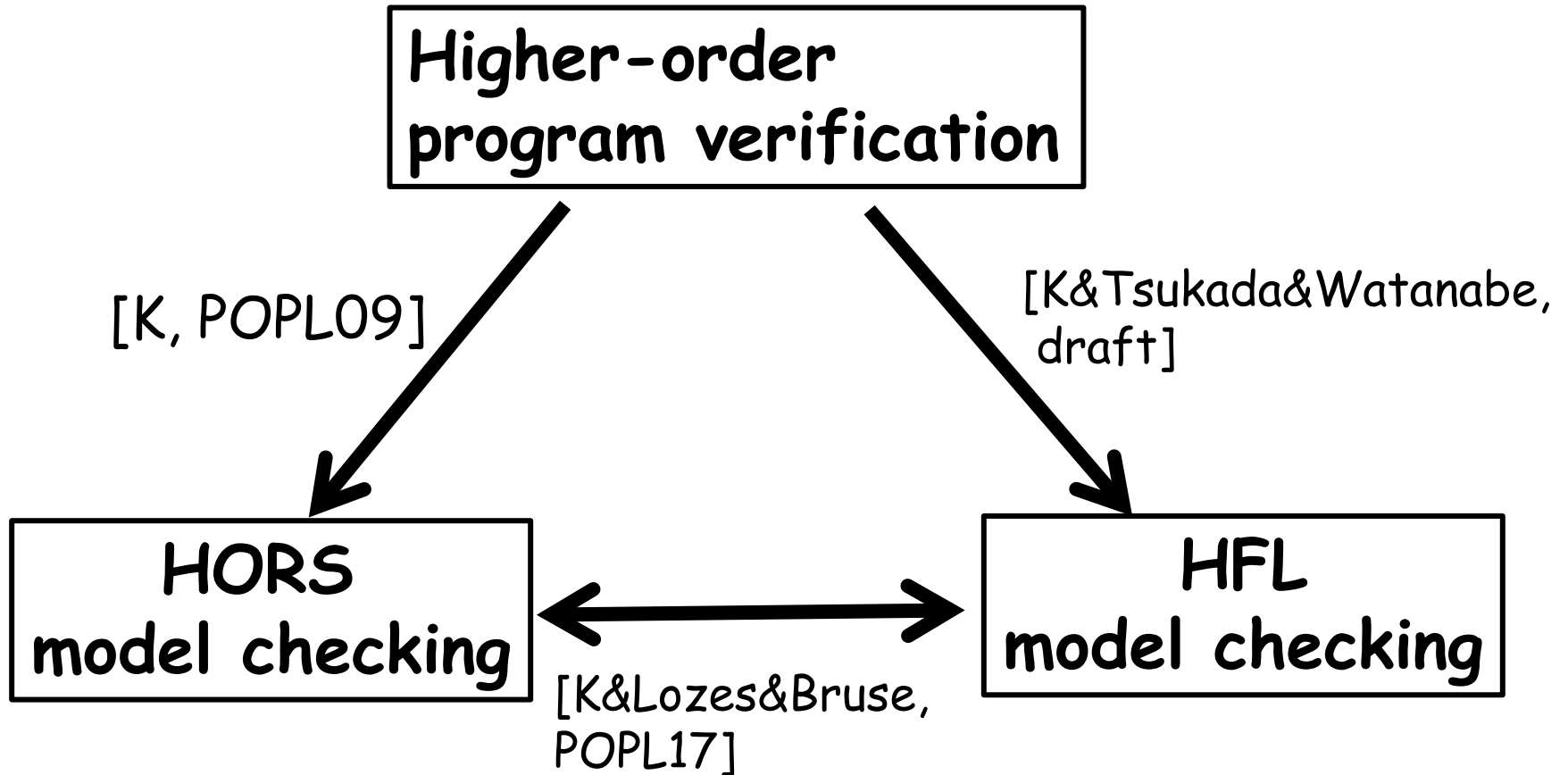
$$\text{HES: } X =_{\nu} Y; Y =_{\mu} \langle a \rangle X \vee \langle b \rangle Y$$

HORS vs HFL model checking

	Model	Spec.	complexity	Applications
HORS model checking	HORS	APT	k-EXPTIME complete (for order-k HORS)	Automated verification of functional programs [K 09][K+11]...
HFL model checking	LTS	HFL	k-EXPTIME complete (for order-k HFL)	Assume-guarantee reasoning [VV 04] Process equivalence checking [Lange+ 14]

APT: alternating parity tree automaton
LTS: finite-state labeled transition system

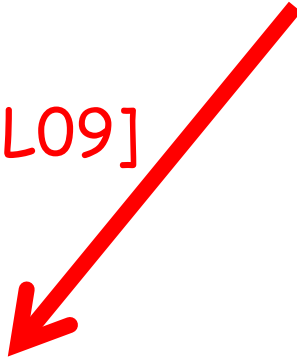
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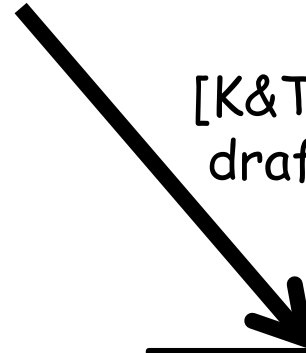
Higher-order
program verification

[K, POPL09]



HORS
model checking
 $\text{Tree}(G) \models \varphi?$

[K&Tsukada&Watanabe,
draft]



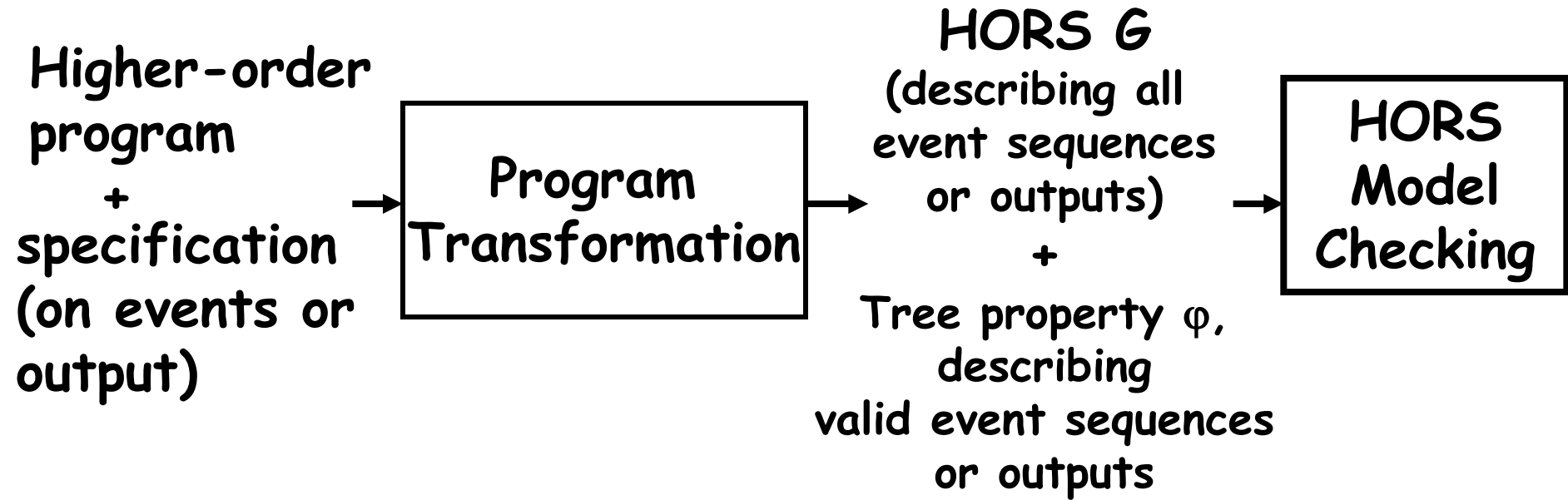
HFL
model checking



[K&Lozes&Bruse,
POPL17]

From Program Verification to HORS Model Checking

[K. POPL 2009]

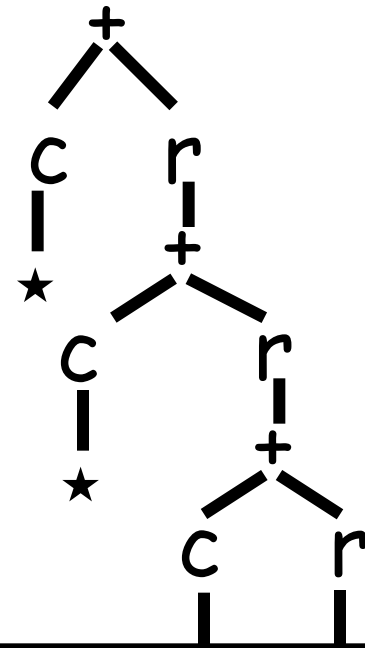


From Program Verification to Model Checking: Example

```
let f x =  
  if * then close(x)  
  else (read(x); f x)  
in  
let y = open "foo"  
in  
  f (y)
```

$F \times k \rightarrow + (c \ k) (r(F \times k))$

$S \rightarrow F \ d \ \star$



Is the file "foo"
accessed according
to read* close?

Is each path of the tree
labeled by r*c?

From Program

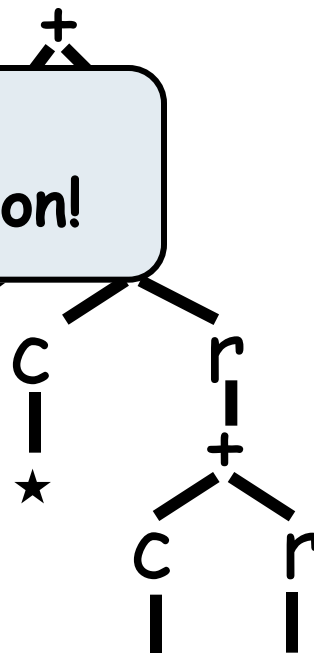
continuation parameter,
expressing how "foo" is
accessed after the call returns

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CPS
Transformation!



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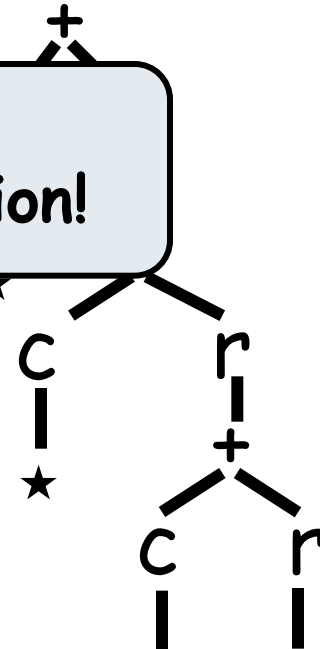
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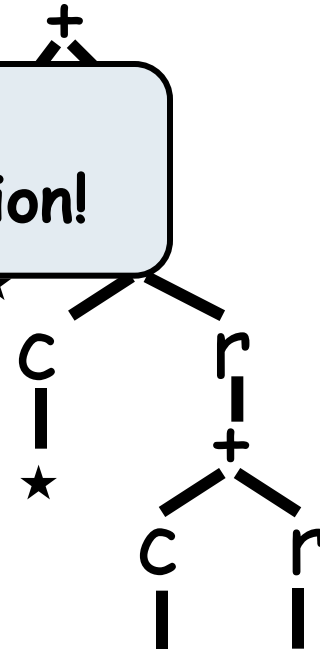
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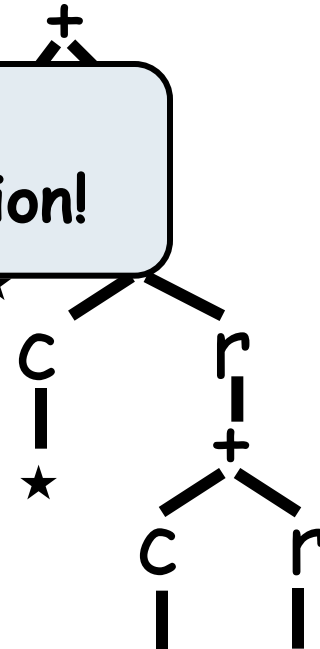
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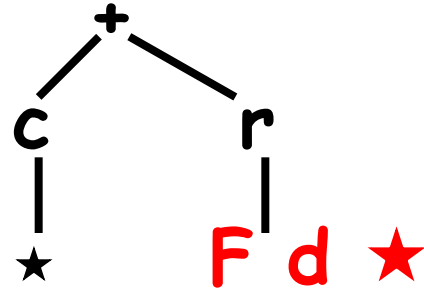
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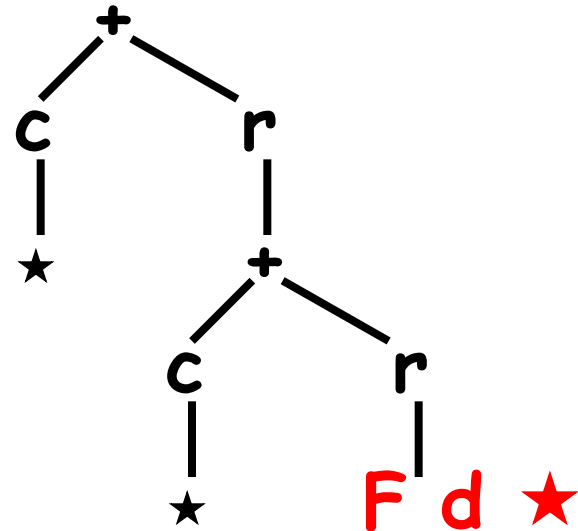
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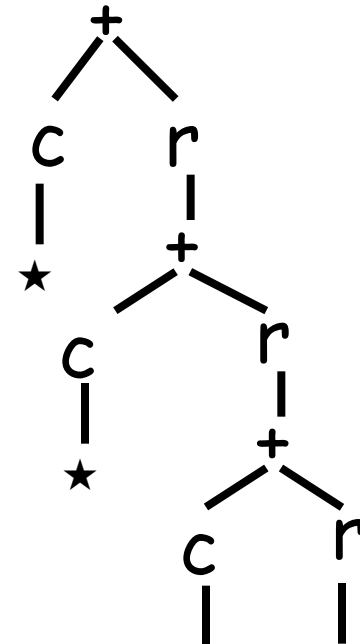
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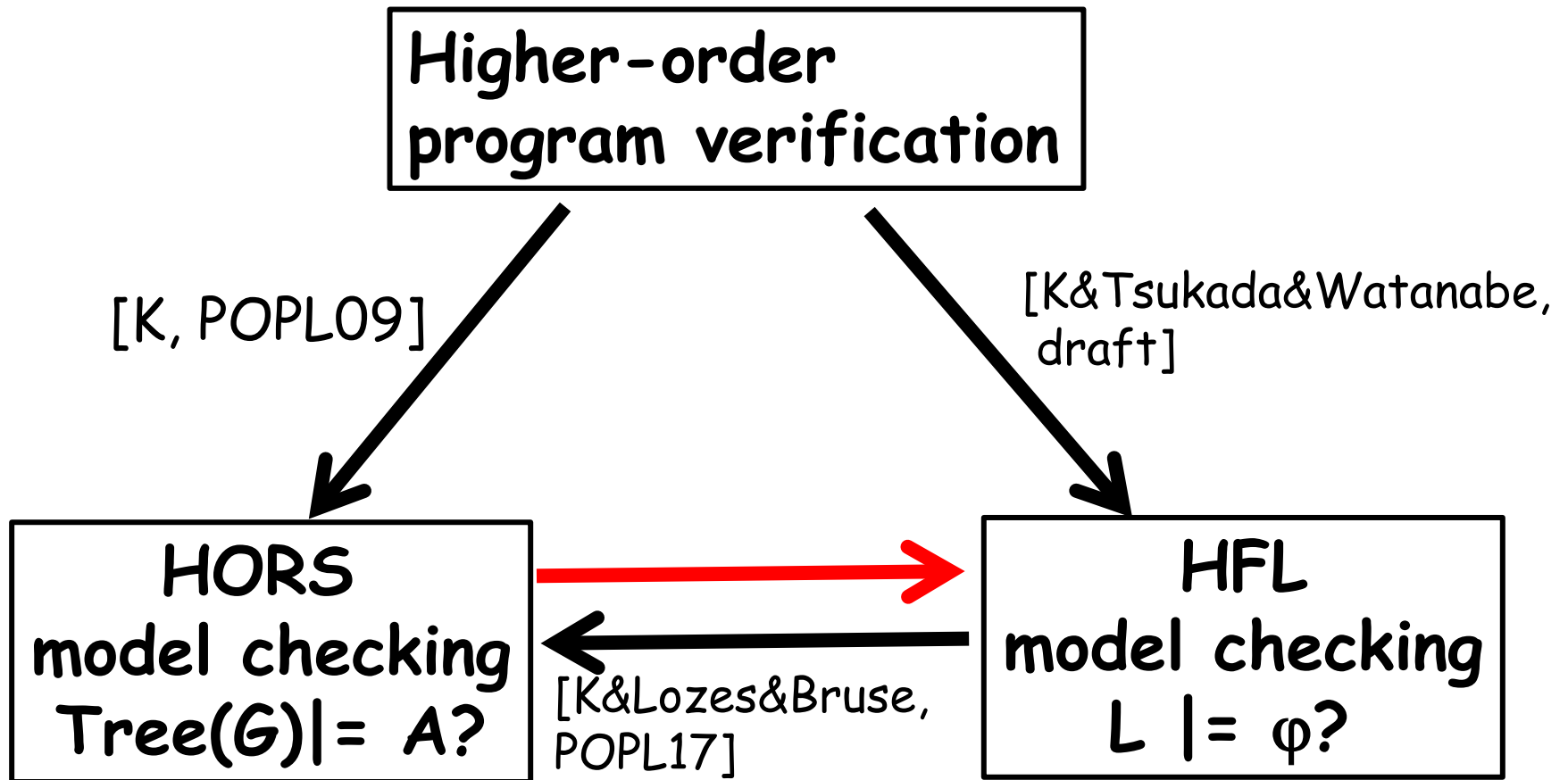
Tool demonstration:

MoChi

[K&Sato&Unno, 2011]

(a software model checker
for a subset of functional
programming language OCaml)

HORS vs HFL model checking



From HORS to HFL model checking

◆ Input:

- HORS G
- Parity tree automaton A (with largest priority p)

◆ Output:

- LTS L_A
- HFL formula $\varphi_{G,p}$

such that $\text{Tree}(G) \models A$ iff $L_A \models \varphi_{G,p}$

Intuition:

- L_A simulates the transitions of A
- $\varphi_{G,p}$ describes “ L_A has transitions corresponding to an accepting run of A over $\text{Tree}(G)$ ”

From HORS to HFL model checking

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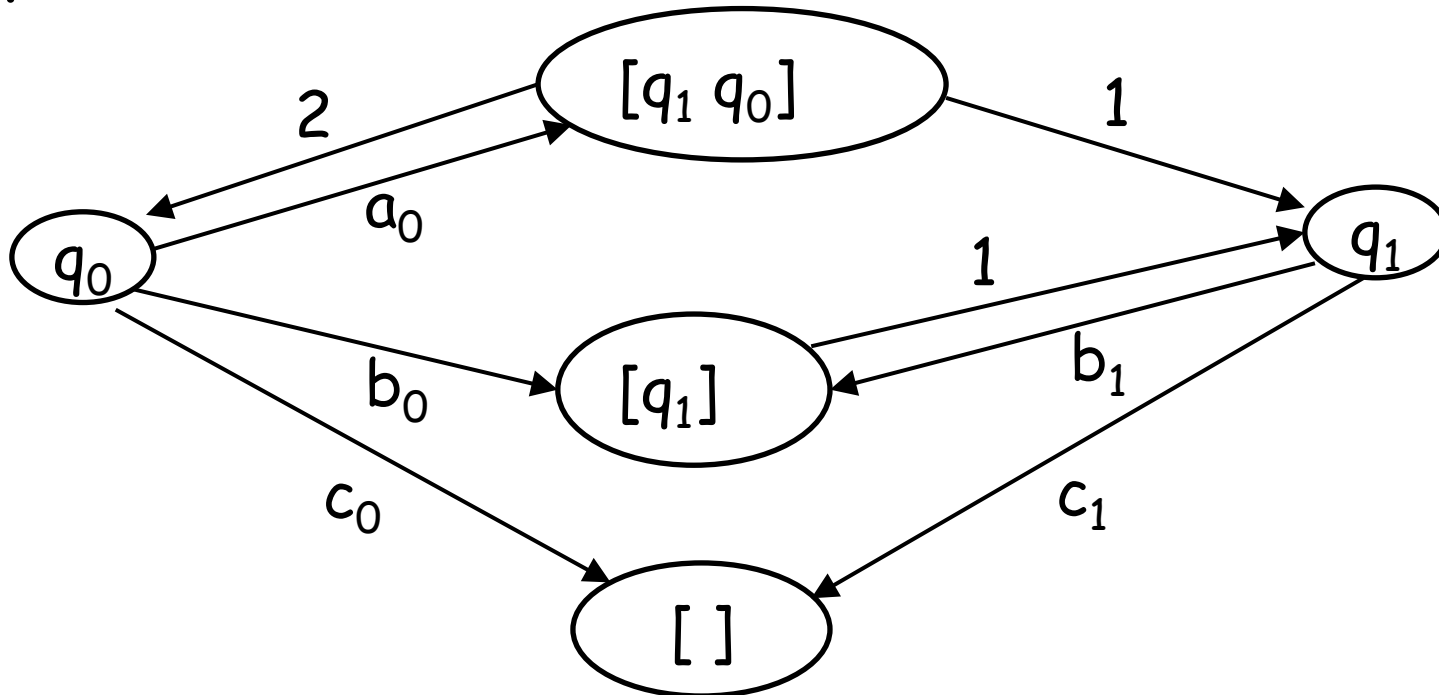
Construction of L_A

(non-deterministic case; see the paper for the case of APT)

A:

$$q_0 \xrightarrow{a} q_1 \quad q_0 \xrightarrow{b} q_1 \quad q_1 \xrightarrow{b} q_1 \quad q_0 \xrightarrow{c} \quad q_1 \xrightarrow{c}$$
$$\Omega(q_0)=0 \quad \Omega(q_1)=1$$

L_A :



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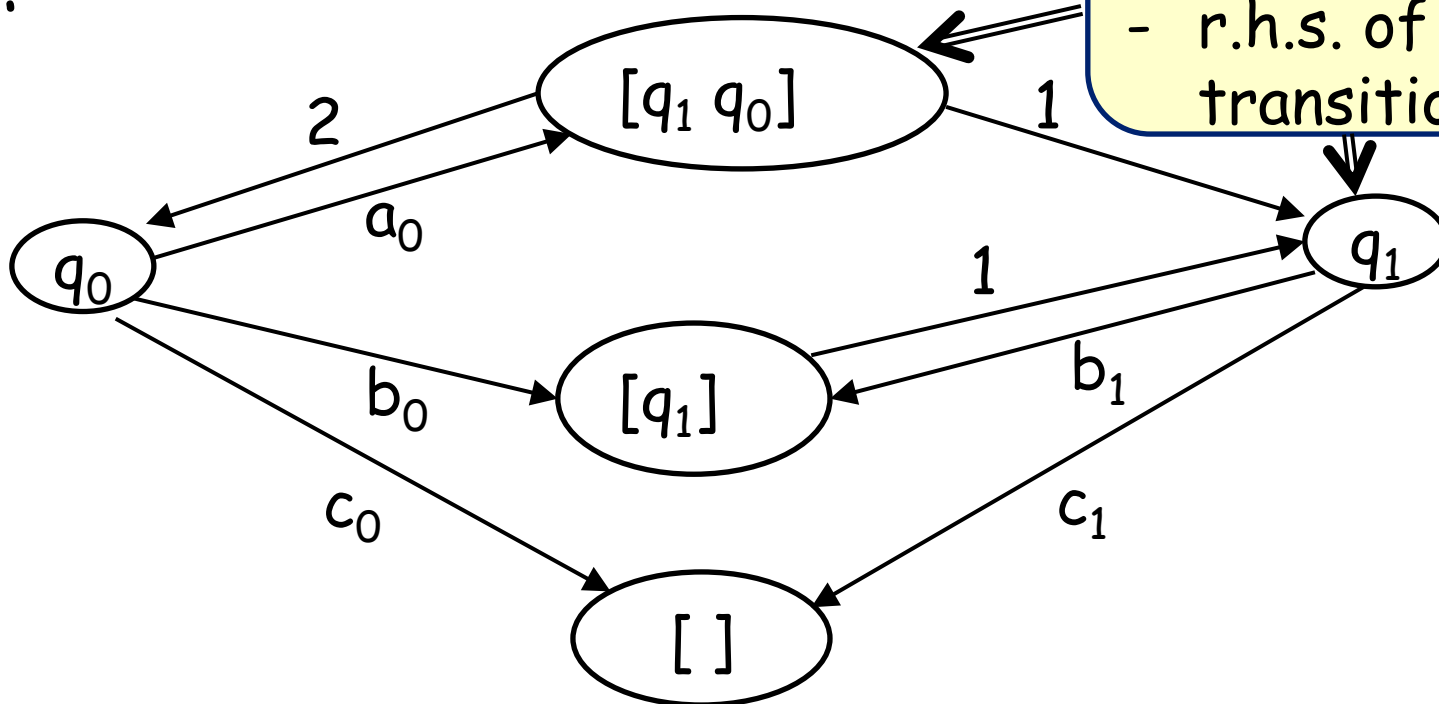
$$\Omega(q_0)=0 \quad \Omega(q_1)=1$$

$$q_0 \xrightarrow{c} \quad q_1 \xrightarrow{c}$$

The states of L_A consist of:

- states of A and
- r.h.s. of transition rules

L_A :



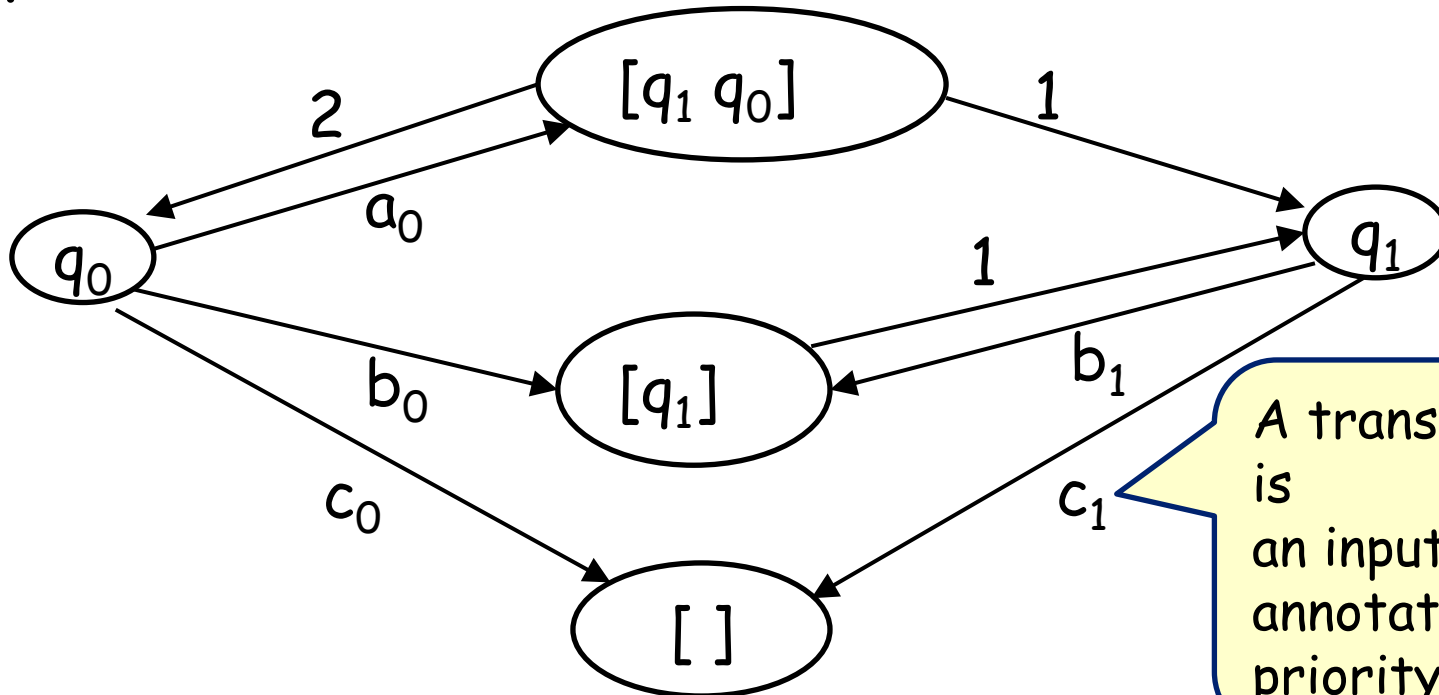
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L_A :



A transition label is an input symbol annotated with a priority; or ...

Construction of L_A

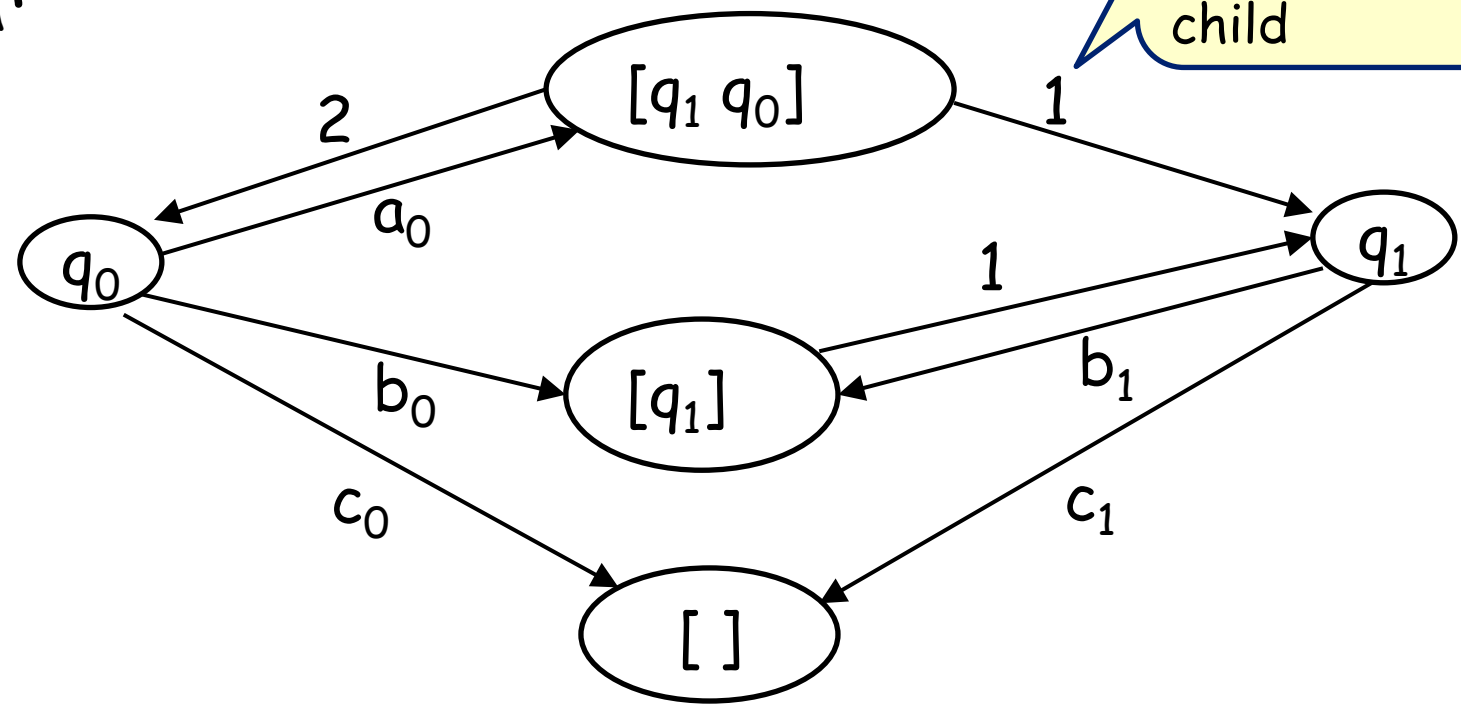
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A transition label is ...; or a number to identify the visited child

L_A :



Outline

- ◆ Reviews of HORS model checking and HFL model checking
- ◆ From HORS to HFL model checking
 - construction of L_A
 - construction of $\varphi_{G,p}$
 - case $p=0$
 - general case
- ◆ From HFL to HORS model checking
- ◆ Type system for HFL model checking
- ◆ Conclusion

From trees to HFL formulas

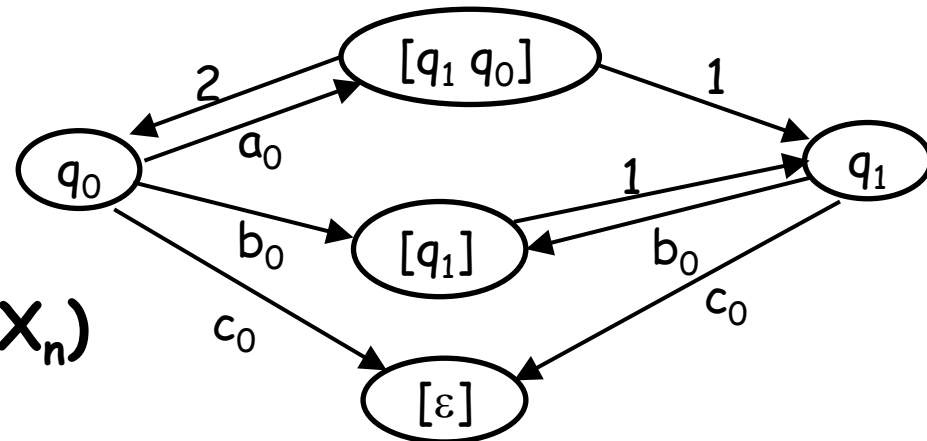
φ_T : "the current state has transitions corresponding to an accepting run for T "

$\varphi_{a \ c} (b \ c) =$

$\langle a_0 \rangle$ "can visit 1st and 2nd children with states satisfying φ_c and $\varphi_{b \ c}$ respectively"

$= \langle a_0 \rangle (\langle 1 \rangle \varphi_c \wedge \langle 2 \rangle \varphi_{b \ c})$

$= \langle a_0 \rangle (H_2 \ \varphi_c \ \varphi_{b \ c})$



$(H_n \ X_1 \ \dots \ X_n \stackrel{\text{def}}{=} \langle 1 \rangle X_1 \wedge \dots \wedge \langle n \rangle X_n)$

From trees to HFL formulas

φ_T : "the current state has transitions corresponding to an accepting run for T"

$$\varphi_{a\ c} (b\ c) =$$

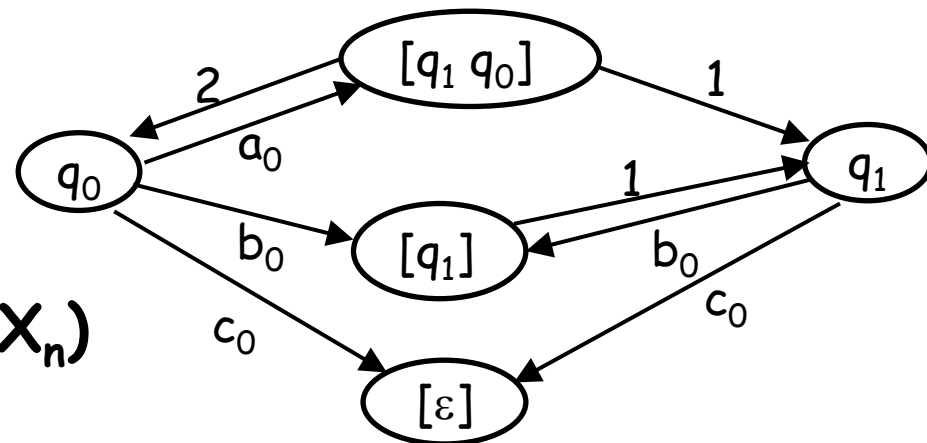
$\langle a_0 \rangle$ "can visit 1st and 2nd children with states satisfying φ_c and $\varphi_{b\ c}$ respectively"

$$= \langle a_0 \rangle (\langle 1 \rangle \varphi_c \wedge \langle 2 \rangle \varphi_{b\ c})$$

$$= \langle a_0 \rangle (H_2 \varphi_c \varphi_{b\ c})$$

$$= \langle a_0 \rangle (H_2 (\langle c_0 \rangle H_0) (\langle b_0 \rangle H_1 (\langle c_0 \rangle H_0)))$$

$$(H_n X_1 \dots X_n \stackrel{\text{def}}{=} \langle 1 \rangle X_1 \wedge \dots \wedge \langle n \rangle X_n)$$



From HORS to HFL

HORS G

$S \rightarrow F c$

$F x \rightarrow a x (F (b x))$

A:

$q_0 \xrightarrow{a} q_1 q_0$

$q_0 \xrightarrow{b} q_1 \quad q_1 \xrightarrow{b} q_1$

$q_0 \xrightarrow{c} \quad q_1 \xrightarrow{c}$



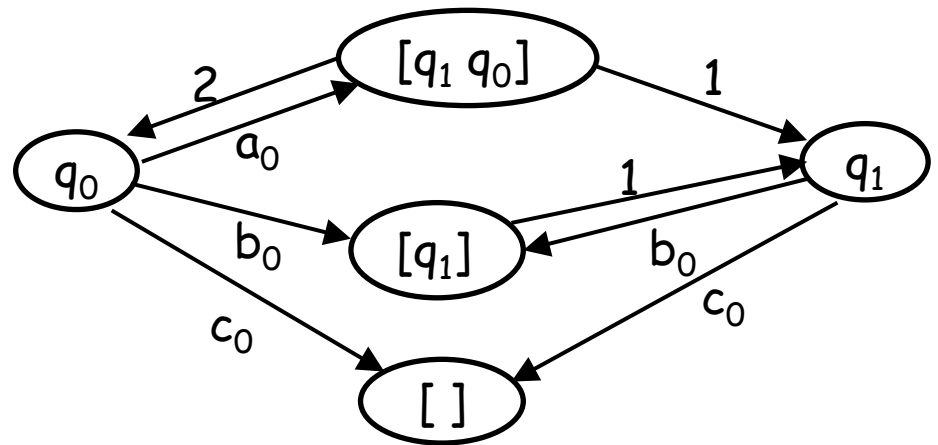
$\Phi_{G,0}$

$S =_v F (<c_0>H_0)$

$F x =_v$

$<a_0>(H_2 x (F(<b_0>(H_1 x))))$

L_A



Outline

- ◆ Reviews of HORS model checking and HFL model checking
- ◆ From HORS to HFL model checking
 - construction of L_A
 - construction of $\varphi_{G,p}$
 - case $p=0$
 - general case
- ◆ From HFL to HORS model checking
- ◆ Type system for HFL model checking
- ◆ Conclusion

Difference from the special case

- ◆ Replicate each non-terminal/argument for each priority (to translate parity condition to a proper nesting of least/greatest fixpoints)

HORS G : $S \rightarrow F c$
 $F x \rightarrow a x (F (b x))$

HFL $\varphi_{G,1}$

$S^1 =_{\mu} F^0 (<c_0>H_0) (<c_1>H_0);$

$F^1 x^0 x^1 =_{\mu} <a_0>(H_2 x^1 x^1$

$(F^0(<b_1>(H_1 x^1 x^1))) (F^1(<b_1>H_1 x^1 x^1));$

$S^0 =_{\nu} F^0 (<c_0>H_0) (<c_1>H_0);$

$F^0 x^0 x^1 =_{\nu} \dots$

Correctness of Translation

◆ Theorem:

$\text{Tree}(G) \models A$

if and only if

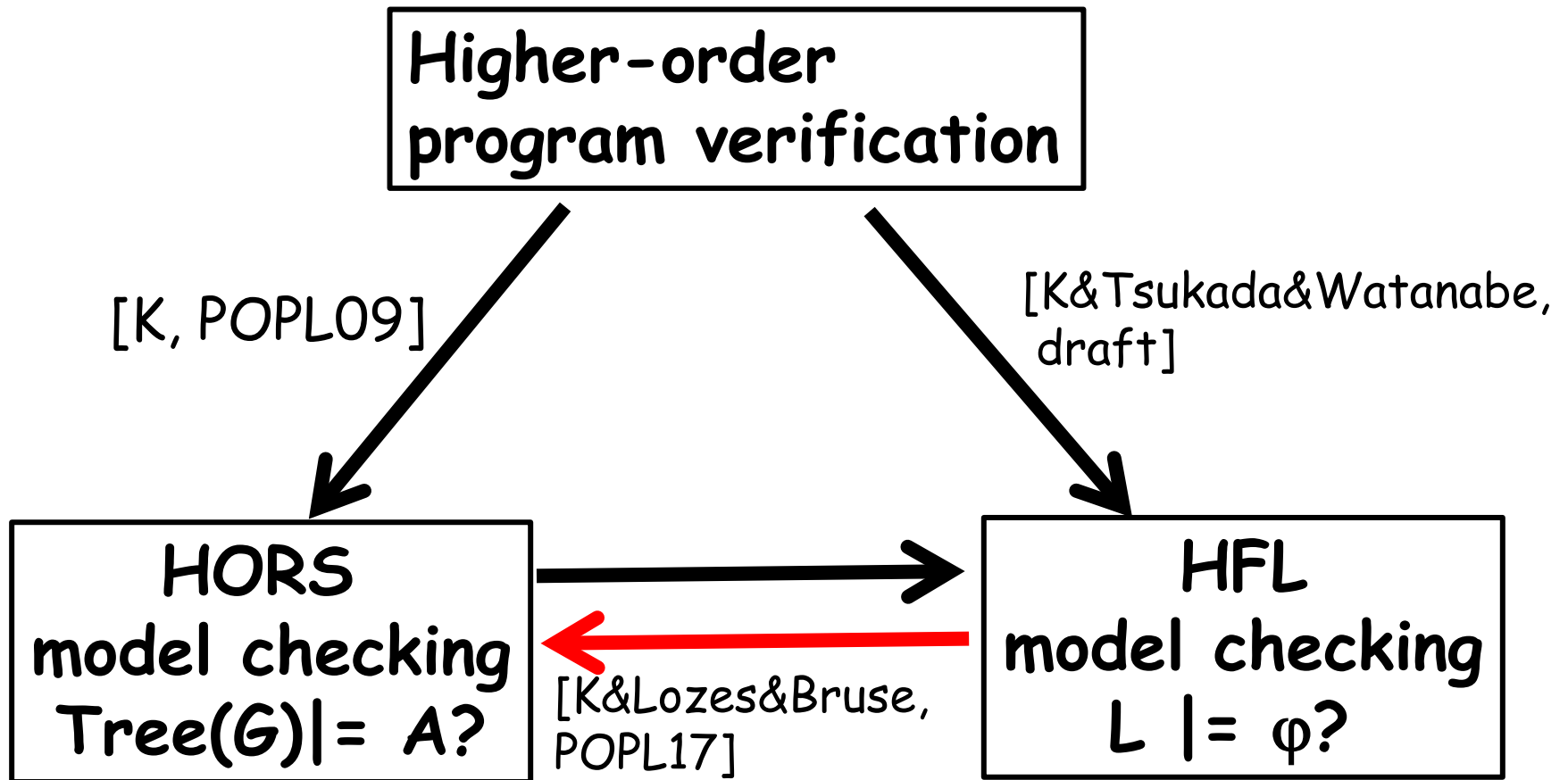
$L_A \models \varphi_{G,p}$

$\text{order}(L_A) = \text{order}(G)$

$|L_A|$ is polynomial in $|A|$

$|\varphi_{G,p}|$ is polynomial in $|G|, p$

HORS vs HFL model checking



From HFL to HORS model checking

◆ Input:

- LTS L
- HFL formula φ

◆ Output:

- HORS $G_{\varphi,c}$
- APT A_L

such that $L \models \varphi$ iff $G_{\varphi,c} \models A_L$ for sufficiently large c

Intuition:

- $G_{\varphi,c}$ generates tree representation of the formula equivalent to φ , obtained by unfolding fixpoint formulas sufficiently many times
- A_L accepts trees representing valid formulas

HFL-to-HORS Translation: Overview

$$F X =_v \varphi$$

↓ Remove fixpoint operators by finite unfoldings (cf. Kleene fixpoint theorem)

$$F^{(c)} X = [F^{(c-1)}/F] \varphi ; \dots ; F^{(1)} X = [F^{(0)}/F] \varphi ; F^{(0)} X = \text{true}$$

↓ Convert it to HORS, which generates the tree representation of the formula

$$F^{(c)} X \rightarrow [F^{(c-1)}/F] \varphi' ; \dots ; F^{(1)} X \rightarrow [F^{(0)}/F] \varphi' ; F^{(0)} X \rightarrow \text{true}$$

↓ Parameterize F by a number, and implement numbers (up to 2^n) as functions (cf. [Jones01])

$$F m X \rightarrow \text{if (Zero? m) true } ([F (m-1) / F] \varphi')$$

Correctness of Translation

◆ Theorem:

$$L \models \varphi$$

if and only if

$$G_{\varphi, |L|} \models A_L$$

$$\text{order}(G_{\varphi, |L|}) = \text{order}(L)$$

$|G_{\varphi, |L|}|$ is polynomial in $|\varphi|$ and $|L|$

$|A_L|$ is polynomial in $|L|$

HORS vs HFL model checking

Higher-order
program verification
 $P \models \psi ?$

[K, POPL09]

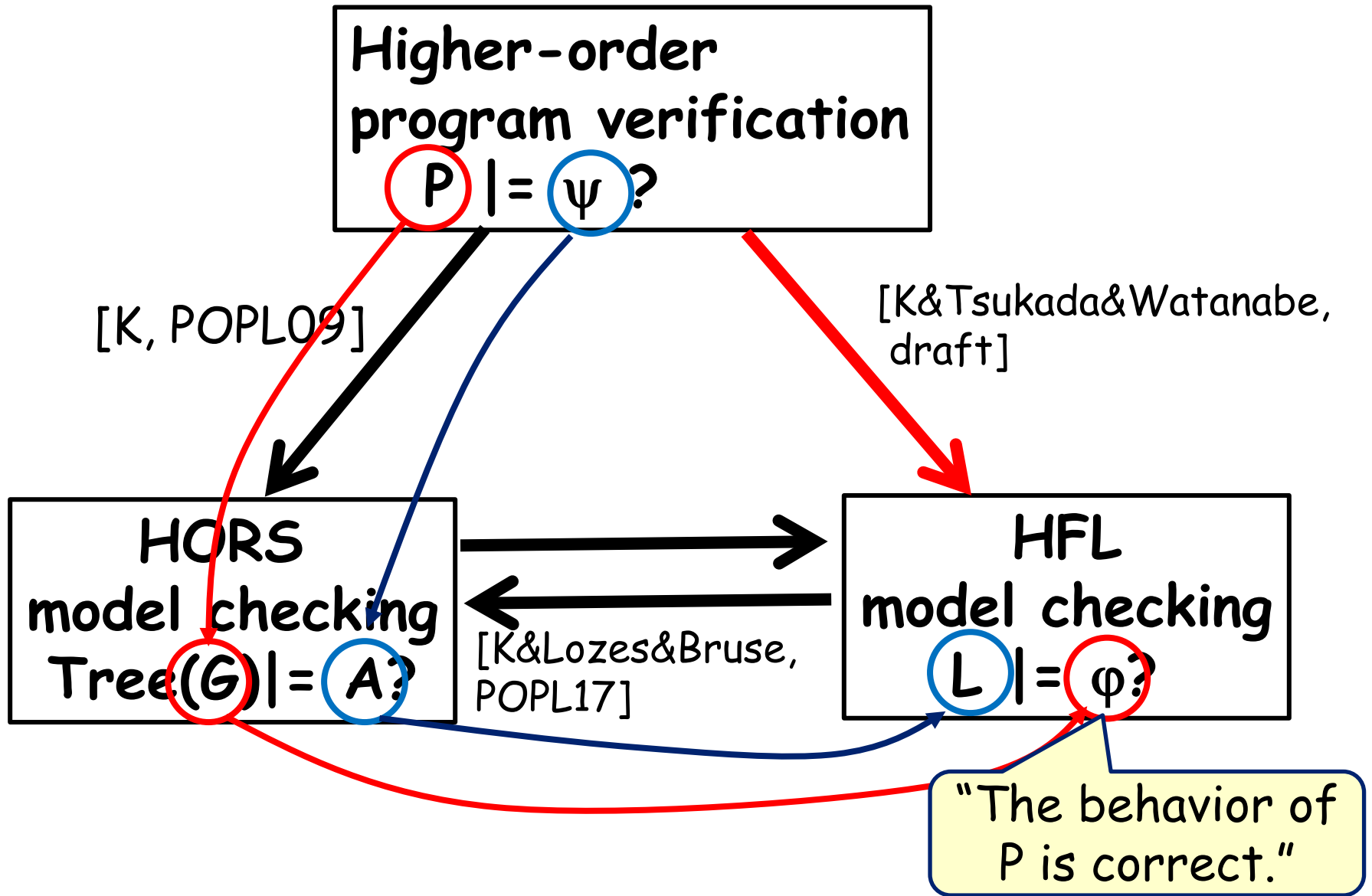
[K&Tsukada&Watanabe,
draft]

HORS
model checking
 $\text{Tree}(G) \models A ?$

HFL
model checking
 $L \models \varphi ?$

[K&Lozes&Bruse,
POPL17]

HORS vs HFL model checking



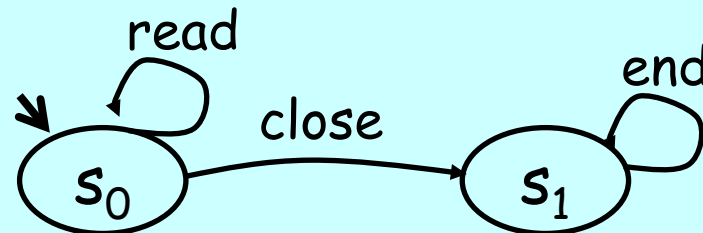
From Program Verification to HFL Model Checking: Example

```
let f x =  
  if * then close(x)  
  else (read(x); f x)  
in  
let y = open "foo"  
in  
  f (y)
```

$F \times k =_v \langle \text{close} \rangle k$
 $\wedge (\langle \text{read} \rangle (F \times k))$
 $S =_v F \text{ true } (\langle \text{end} \rangle \text{true})$

Is the file "foo"
accessed according
to read* close?

Does LTS:



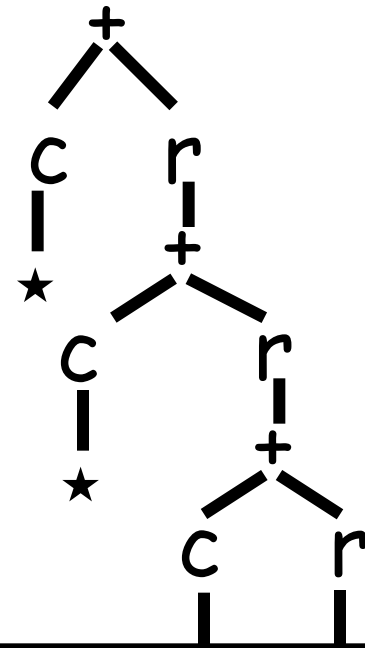
satisfy the formula S ?

From Program Verification to HORS Model Checking

```
let f x =  
  if * then close(x)  
  else (read(x); f x)  
in  
let y = open "foo"  
in  
  f (y)
```

$F \times k \rightarrow + (c \ k) (r(F \times k))$

$S \rightarrow F \ d \ \star$



Is the file "foo"
accessed according
to read* close?

Is each path of the tree
labeled by r*c?

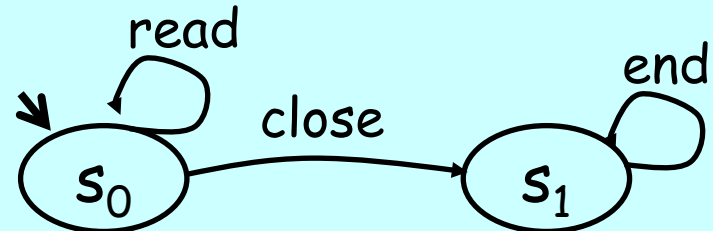
From Program Verification to **extended** HFL Model Checking

```
let f n x =  
  if n ≤ 0 then close(x)  
  else  
    (read(x); f (n-1) x)  
in  
let y = open "foo"  
in  
  f m (y)
```

Is the file "foo"
accessed according
to read* close?

$F n x k =_{\mu}$
 $(n \leq 0 \Rightarrow \langle \text{close} \rangle k)$
 $\wedge (\neg n \leq 0 \Rightarrow$
 $\langle \text{read} \rangle (F (n-1) x k))$
 $S =_{\mu} F m \text{ true } (\langle \text{end} \rangle \text{true})$

Does LTS:



satisfy the formula S ?

From Program Verification to **extended** HFL Model Checking

let

Expr -

This approach provides a sound and complete logical characterization of:

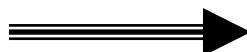
- reachability problem
 - termination problem
 - linear/branching-time temporal properties
- for higher-order functional programs with infinite data

in

le

in

Is the file "foo"
accessed according
to read* close?



S_0

S_1

satisfy the formula S ?

From Termination Verification to **extended** HFL Model Checking

```
let sum n k =  
  if n ≤ 0 then k 0  
  else  
    sum (n-1) λr.k(r+n)  
in sum m (λx.())
```



Termination:

```
(μ sum.λn.λk.  
  (n ≤ 0 ⇒ k 0) ∧  
  (n > 0 ⇒ sum(n-1) λr.k(r+n)))  
m (λx.true)
```

Non-Termination:

```
(ν sum.λn.λk.  
  (n ≤ 0 ∧ k 0) ∨  
  (n > 0 ∧ sum(n-1) λr.k(r+n)))  
m (λx.false)
```

Related Work

- ◆ From HORS to HFL model checking:
 - Reduction from HORS model checking to nested least/greatest fixedpoint computation [Salvati&Walukiewicz, CSL15]
- ◆ From program verification to HFL model checking:
 - program verification via:
 - (Constraint) Horn clauses [Bjorner, Gurfinkel, McMillan, Rybalchenko, Unno, ...]
 - Higher-order constraint Horn clauses [Burn, Ong&Ramsay 2017]
 - Can be viewed as a restriction to the fragment of HFL without fixpoint alternation and modal operators

Conclusion

- ◆ Revealed close relationships among:
 - program verification
 - HFL/HORS model checking
- ◆ Reduction from program verification to HFL model checking provides a new, uniform approach to verification of infinite-data higher-order programs
- ◆ Future work:
 - development of extended HFL model checkers (cf. recent integration of Horn clause solvers into SMT solvers)