

# Games Semantics: from Structures to Algorithmics

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(Acknowledgements: Samson Abramsky, Dan Ghica + Andrzej Murawski)

# Model Checking

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Extremely successful in verifying relatively flat “unstructured” finite-state processes.

E.g. digital circuits and communication protocols).

Naïve application of these techniques to software raises problems:

1. Programs are potentially **infinite-state systems**. Tools are (mainly) finite-state technologies.
2. Modern programs can only be accurately modelled using **rich, highly-structured models**, as studied in Semantics. These are not appropriate (as models) for Verification.

# Software Model Checking: Challenges and Approaches

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“Model Construction Problem”: No systematic, fully automatic method exists for model construction. Tension between:

- Accuracy in modelling - tends to make models large
- Engineering feasibility - tends to make models small.

A leading paradigm: **Abstract–Test–Refine Cycle**.

An alternative: **Start from an accurate denotational semantics** of the program and then **derive an appropriate model of computation** sufficiently concrete (and tractable) for the purpose of verification.

Advantages: Soundness and completeness inherited by the model; method remains compositional.

Question: Is there such a semantics?

# Software Model Checking based on Game Semantics

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Game semantics has emerged as a powerful paradigm for giving semantics to a wide range of programming languages.

All of these models are highly accurate: **fully abstract**.

## Promising features

- Clear operational content, while admitting **compositional methods** in the style of denotational semantics.
- Strategies are highly-constrained processes, **admitting automata-theoretic representations**.
- Rich mathematical structures yielding **accurate models** of advanced high-level programming languages.

## Challenges of the Approach

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To carry over methods of model checking to much more **structured**, modern programming situations, in which the following features are important:

- **data-types**: references (pointers), recursive types
- **non-local control flow**: exceptions, call-cc, etc.
- **modularity principles**: e.g. object orientation: inheritance and subtyping
- **higher-order features**: higher-order procedures; components
- **variables and names**: passing mechanisms, life-span, scoping rules
- **concurrency and non-determinism**: synchronization, multithreading, etc.

**Aim:** Combine results and insights in Game Semantics, with techniques in Verification.

# Outline of the Talk

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- I. A **H**igher-**O**rders **P**rocedural **L**anguage (**HOPL**): **I**dealized **A**lgol
- II. **Game Semantics**: An Impressionistic Introduction
- III. Some Results in **Algorithmic Game Semantics**: Putting Game Semantics to Work
- IV. Applications to **Software Model Checking**: A Prototype Tool
- V. Further Directions

A compact language that elegantly combines state-based procedural and higher-order functional programming, using a simple type-theoretic framework. IA is essentially a call-by-name variant of Core ML.

## IA Types

$T$	$::=$	int	integer-valued expressions
		com	commands
		loc	locations (or assignable variables)
		$T \rightarrow T$	

## IA Terms

Simply-typed  $\lambda$ -calculus + basic arithmetic + conditional (definition-by-cases) + recursion + imperative constructs + block-allocated local variables.

## Observational equivalence $M \approx N$

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Intuitively  $M \approx N$  means “ $M$  may be replaced by  $N$  (and vice versa) in **every** program context with no observable difference in the resultant computational outcome”.

Formally  $M \approx N$  iff for every context  $C[ ]$  such that  $C[M]$  and  $C[N]$  are programs (i.e. **closed** terms of type com)

$$C[M], S \Downarrow \text{skip}, S' \iff C[N], S \Downarrow \text{skip}, S'.$$

Quantification over all program context ensures that all side effects of  $M$  and  $N$  are taken into account.

Observational equivalence is an intuitively compelling notion of program equivalence, but **very hard to reason about**.



## The theory of observational equivalence is rich: Some examples

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1. **State changes are irreversible**: No construct  $\text{Snapback} : \text{com} \rightarrow \text{com}$  that runs its argument and then undoes all its state-changes.

$$p : \text{com} \rightarrow \text{com}$$

$$\vdash \text{new } x := 0 \text{ in } \{p(x := 1) ; \text{if } !x = 1 \text{ then } \Omega \text{ else skip}\} \approx p(\Omega)$$

2. **Parametricity**: Terms that have the “same underlying algorithm” are obs. eq.

$$p : \text{com} \rightarrow \text{bool} \rightarrow \text{com}$$

$$\vdash \text{new } x := 1 \text{ in } \{p(x := -!x) (!x > 0)\}$$

$$\approx \text{new } y := \text{t} \text{ in } \{p(y := \neg y) (!y)\}$$

**Question.** Is observational equivalence decidable?

Game semantics can help to answer the question.

## **II. Game Semantics: An Informal Introduction**

## Game Semantics (for Idealized Algol)

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Players	Point-of-view	Functional	Imperative	Concurrent
P	System	term	procedure	process
O	Environment	program context	context & store	rest-of-system

**Basic Idea of Game Semantics:** The meaning of a system is given in terms of its **potential interaction** with its environment.

Four kinds of moves: **P-questions**, **P-answers**, **O-questions**, **O-answers**.

**Types** are modelled by **arenas**.

**Programs** of a given type are modelled by **strategies** (for P) for playing in the arena which denotes that type.

An **evaluation** of the program (P), in a given program context (O), corresponds to a play between P and O, tracing out a dialogue of questions and answers.

## Definition: Arenas

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An **arena**  $A = \langle M_A, \vdash_A, \lambda_A \rangle$  is a triple such that  $\langle M_A, \vdash_A \rangle$  is a directed graph which is a forest, whose nodes (i.e. moves) are partitioned by

$$\lambda_A : M_A \longrightarrow \{ OQ, PA, PQ, OA \}$$

into P-questions, P-answers, O-questions and O-answers, that satisfies the following **rules**:

- (1) Roots (moves at level 0), called initial, are O-questions.
- (2) Levels 0, 2, 4, etc. are O-moves; levels 1, 3, 5, etc. are P-moves.
- (3) Whenever  $m \vdash_A m'$  (read “ $m$  **justifies**  $m'$ ”) then  $m$  is a question. □

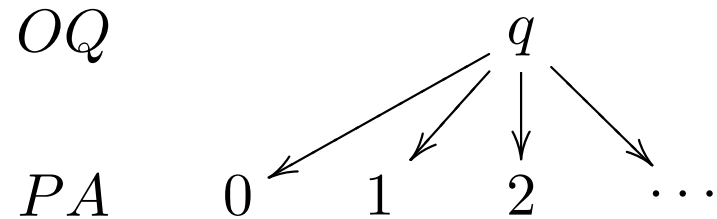
**Note.** The arena is not the game tree. The game tree over an arena  $A$  is generated from  $A$ , subject to a number of rules.

## Example arenas

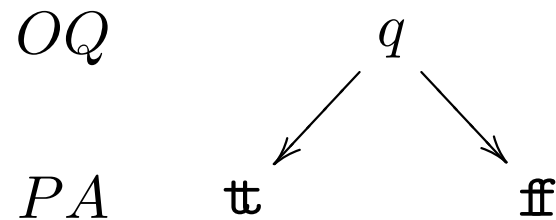
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Empty arena  $\mathbf{1} = \langle \emptyset, \emptyset, \emptyset \rangle$ .

Natural numbers arena:



Boolean arena:

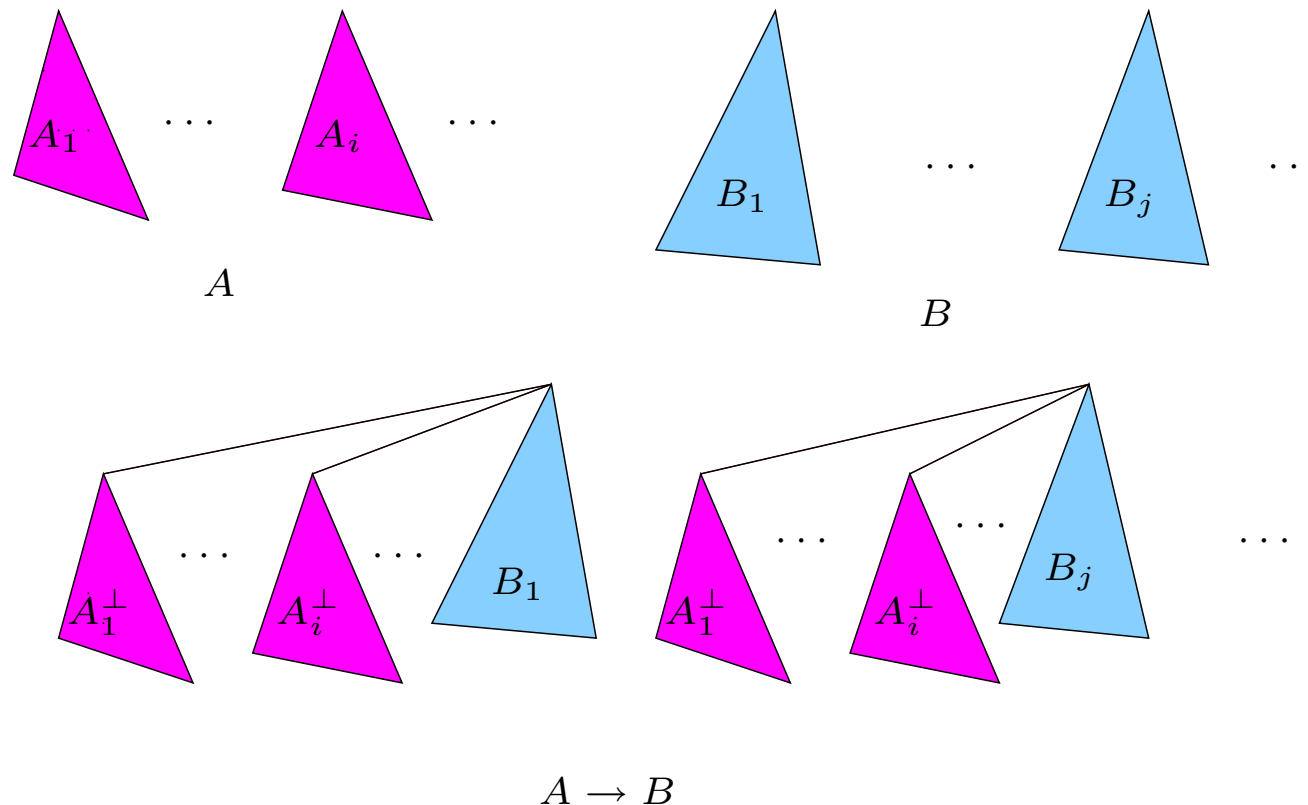


## Arena constructions

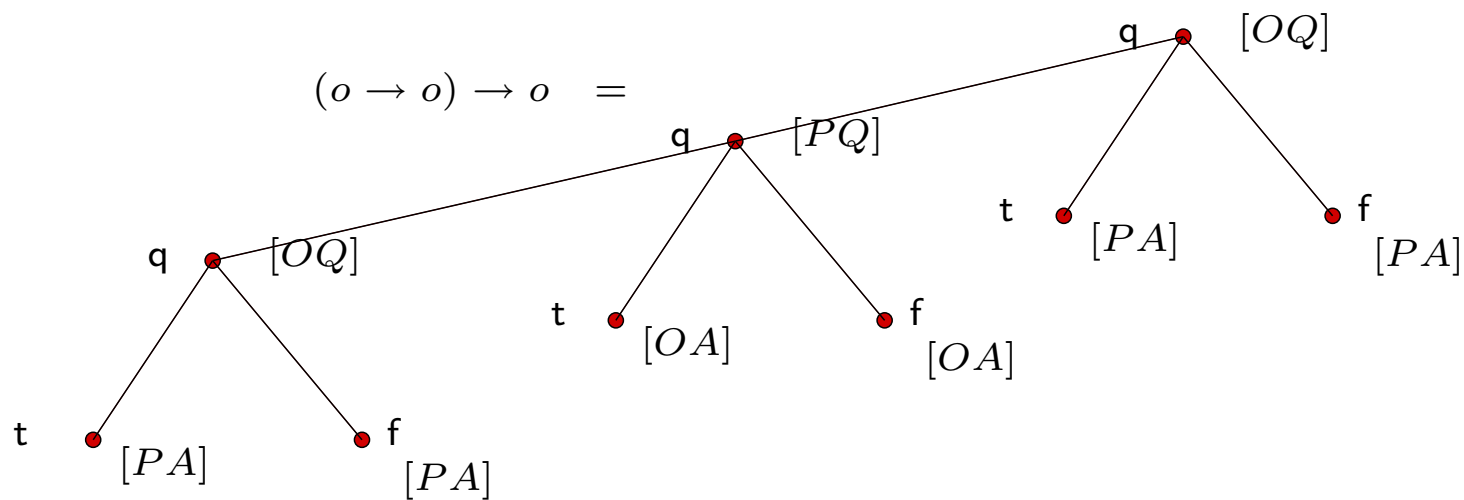
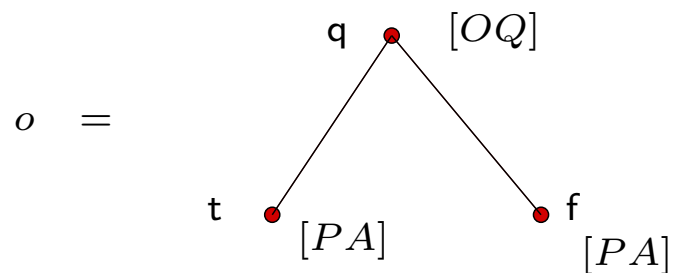
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**Product arena**  $A \times B$ : Disjoint union of (the underlying forest of)  $A$  and  $B$ .

**Function space arena**  $A \rightarrow B$ : “First invert the P and O moves of  $A$ , then graft one such copy of  $A$  just below every root of  $B$ .”



## More examples of arenas



## What are the plays (= legal positions)?

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Intuitively, a play or legal position is a record of the moves made by O and P in the course of a game.

Basic rules of the game (for HOPL computation):

1. **Alternation**. O starts, thereafter P and O alternate strictly.
2. **Justification**. At any point (after the opening move), the playable moves are exactly those whose **justifier moves** have already been played.  
[The justifier move of a non-initial  $m$  is the unique  $m'$  such that  $m' \vdash_A m$ .]
3. Whenever a player makes a move, he must also declare the justification for it (by way of a **pointer** from the move to **some occurrence** of its justifier move).

Thus every move in a play is **explicitly justified**.

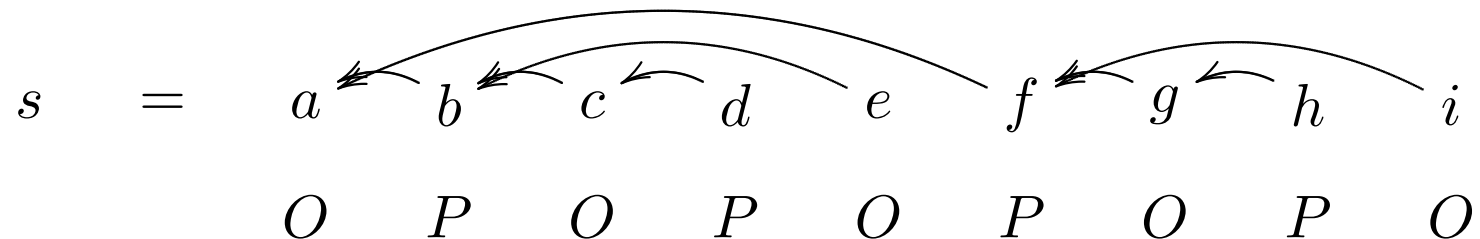


## What are the plays (i.e. legal positions)?

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A **justified sequence** (over an arena  $A$ ) is a sequence of P/O-alternating moves such that each move  $m$ , except the first, has a **pointer** to an earlier  $m'$  such that  $m' \vdash_A m$ .

### Example

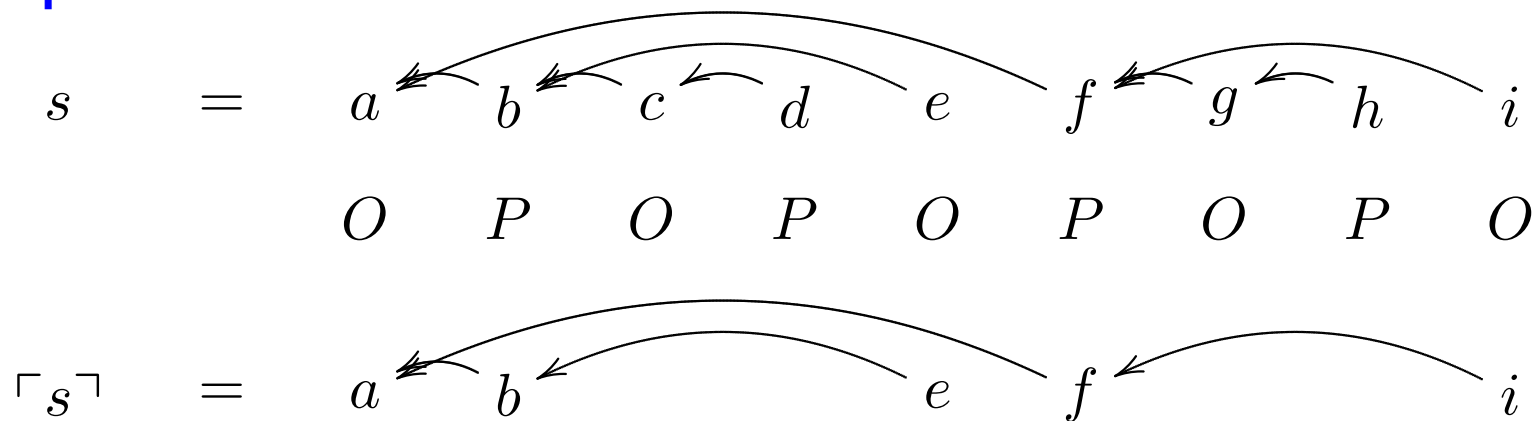


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The **P-view**  $\lceil s \rceil$  of a justified sequence  $s$  is a subsequence consisting only of moves which P considers relevant (for determining his response). Intuitively these are “O-moves that directly respond to moves that P has made (in a hereditarily fashion)”.

### Example



## What are the plays?

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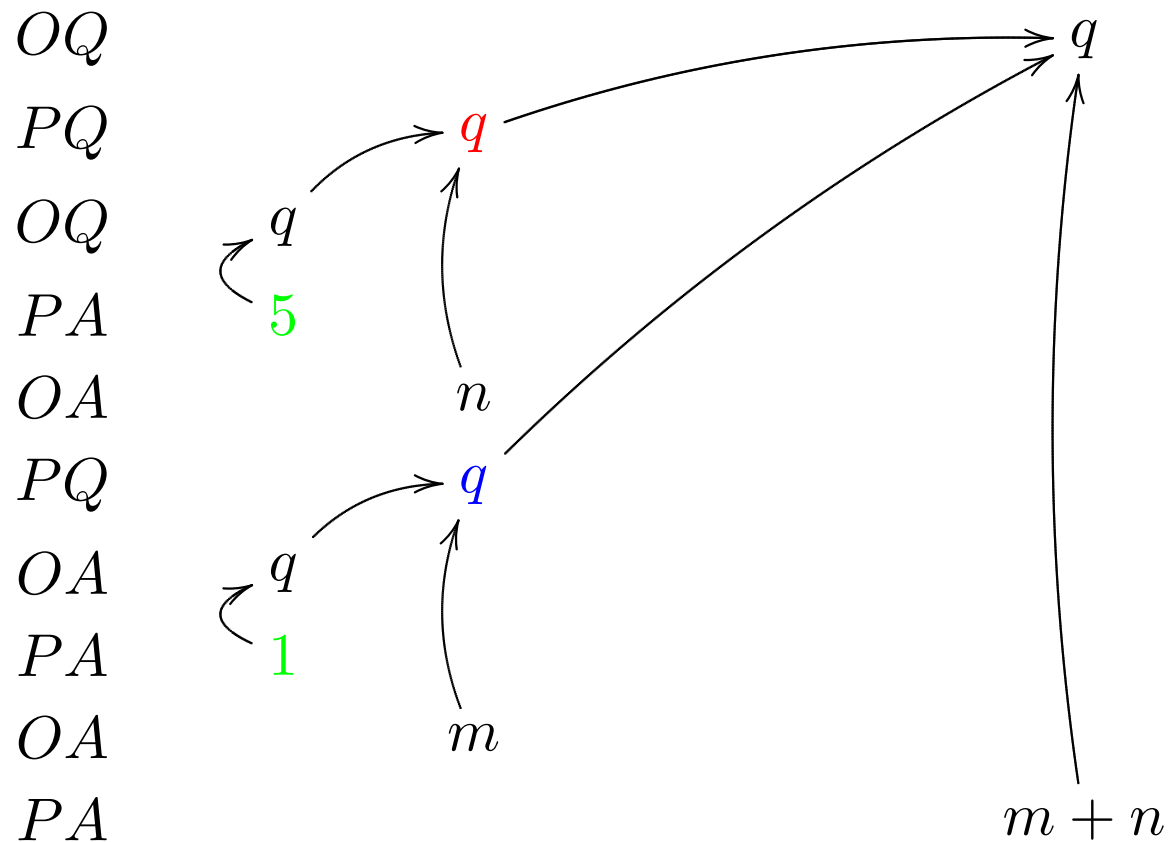
The **P-view**  $\lceil s \rceil$  of a justified sequence  $s$  is a subsequence consisting only of moves which P considers relevant (for determining his response). (Similarly for O-view.)

A **play** (over  $A$ ) is a justified sequence satisfying:

- (1) **Visibility**: Each P-move is explicitly justified by (i.e. points to) some move that appears in the P-view at that point; similarly for O.
- (2) **Well-Bracketing**: Each answer is explicitly justified by the last *pending* question.

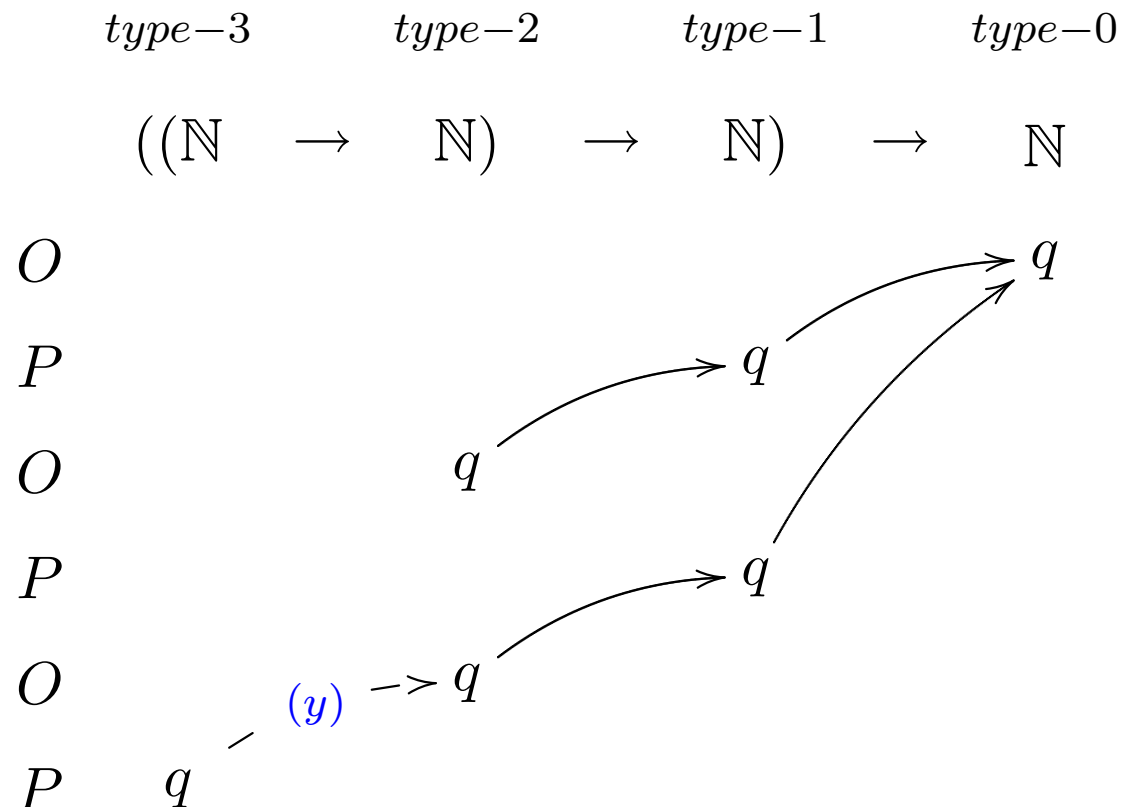
## Example

$$f : \mathbb{N} \rightarrow \mathbb{N} \vdash f(5) + f(1) : \mathbb{N}$$



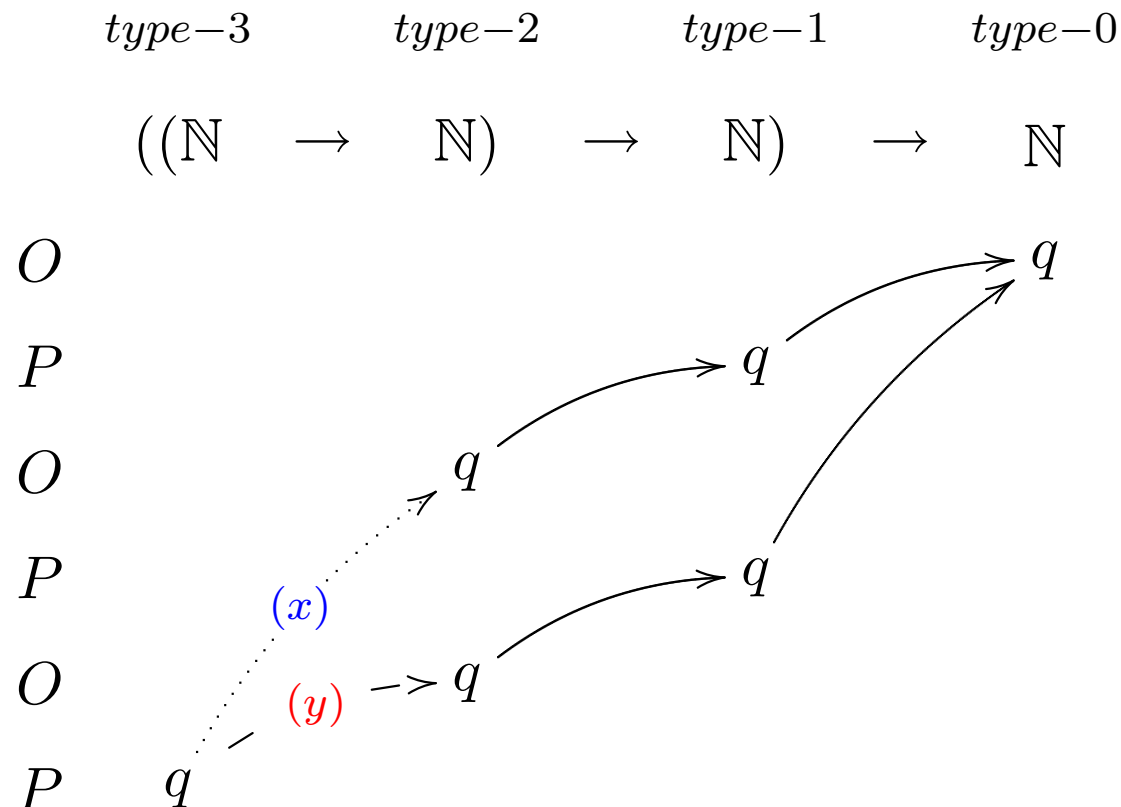
## Example: What's the point of pointers?

**Kierstead terms**  $\left\{ \begin{array}{ll} (y) & \lambda f.f(\lambda x.f(\lambda y.y)) \\ (x) & \lambda f.f(\lambda x.f(\lambda y.x)) \end{array} \right.$



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## A fully abstract game model of PCF [Hyland-O. 2000]

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A P-strategy  $\sigma$  is said to be **innocent** iff it is (deterministic) and **view-dependent** i.e. it is generated from a partial function from P-views to justified P-moves.

The category:

- Objects are **arenas**
- Maps  $\sigma : A \longrightarrow B$  are **innocent** P-strategies over the arena  $A \rightarrow B$ .

is cartesian closed, and gives rise to the first **(syntax-independent) fully abstract** model of PCF – the functional part of IA.

[Recall:  $\mathcal{M}$  **fully abstract** means  $\mathcal{M} \models M = N \iff M \approx N$ .]

# Classifying Programming Features

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Strategies can be classified according to the behavioural constraints they satisfy. Four constraints identified in the fully abstract game model for PCF.

1. Determinacy
2. Well-Bracketing
3. Innocence
4. Visibility



# Classifying Programming Features

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Strategies can be classified according to the behavioural constraints they satisfy. Four constraints identified in the fully abstract game model for PCF.

1. **Determinacy**: **Erratic choice** (Harmer + McCusker 1998)
2. **Well-Bracketing**: **Non-local control operators** (Laird 1998)
3. **Innocence**: **Mutable store** (Abramsky + McCusker 1996)
4. **Visibility**: **Higher-order store (reference types)** (Abramsky, Honda + McCusker 1999)

Later work showed that each corresponds precisely to the absence/presence of certain programming features.

**Game semantics gives accurate models of advanced high-level programming languages.**

### **III. Some results in Algorithmic Game Semantics**

Putting Game Semantics to work!

## First steps in **Algorithmic** Game Semantics (Ghica-McCusker'00)

At low types, game semantics admits a concrete, algorithmic representation.

**Theorem.** (Ghica-McCusker). For finitary 2nd-order IA terms  $M$  and  $N$

$$M \approx N \iff \underbrace{\llbracket \Gamma \vdash M : A \rrbracket^{\text{reg}}}_R = \underbrace{\llbracket \Gamma \vdash N : A \rrbracket^{\text{reg}}}_S$$

Moreover  $R = S$ , equivalence of regular expressions, is decidable.  $\square$

**Lemma.** (Abramsky + McCusker 1997) Observational equivalence of IA is characterized by **complete plays**. I.e.

$$M \approx N \iff \mathbf{cplays} \llbracket \Gamma \vdash M : A \rrbracket^{\text{Kn}} = \mathbf{cplays} \llbracket \Gamma \vdash N : A \rrbracket^{\text{Kn}}$$

**Lemma.** The set of complete plays in  $\llbracket \Gamma \vdash M : A \rrbracket^{\text{Kn}}$  is regular.

**Note.** Up to order 2, justification pointers may be ignored; so plays are just words over alphabet of moves.

## Decidability and undecidability results

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Two orthogonal directions of extension:

<b>Fragments of finitary IA</b>	<b>Is observational equivalence decidable?</b>
2nd-order	<b>Yes.</b> (Ghica+McCusker 00)

Can Ghica-McCusker's results be extended to larger fragments?

## Decidability and undecidability results

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2nd-order	<b>Yes.</b> (Ghica+McCusker 00)
2nd-order + iteration 2nd-order + recursion	<b>Yes</b> (GM 00); <b>PSPACE-complete</b> (Murawski 03) <b>No.</b> (Ong LICS'02)

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3rd-order 4th-order or higher	<b>Yes:</b> reduction to DPDA Equivalence. (Ong 02) <b>No.</b> (Murawski LICS 03)

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3rd-order + iteration	<b>?</b>

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3rd-order 4th-order or higher	<b>Yes:</b> reduction to DPDA Equivalence. (Ong 02) <b>No.</b> (Murawski LICS 03)
3rd-order + iteration	<b>Yes.</b> Rationally innocent strategies.

A **rationally innocent strategy** is generated by a view function whose domain is a disjoint union of a finite number of regular sets such that the function acts uniformly on each set.



## Type-theoretic orders and expressiveness

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Consider finitary IA generated from base types  $\Sigma = \{x_1, \dots, x_n\}$ , com and loc. For a language  $L \subseteq \Sigma^*$ , we say that  $\Gamma \vdash M : A$  represents  $L$  just in case

$$L = \mathbf{cplays}[\![\Gamma \vdash M : A]\!] \upharpoonright \Sigma$$

**Theorem** (Murawski 03) Let  $L \subseteq \Sigma^*$ .

- (i)  $L$  representable by a 2nd-order IA-term-in-context iff  $L$  is regular.
- (ii)  $L$  representable by a 3rd-order IA-term-in-context iff  $L$  is context-free.
- (iii)  $L$  representable by a 4th-order IA-term-in-context iff  $L$  is r.e.

## Obs. Equiv of 3rd-order IA is decidable: Proof Idea

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At 3rd and higher orders, pointers can no longer be ignored. We use **view offset** to encode pointers.

We give an intensional, **state-explicit** representation of the fully abstract game semantics  $\llbracket \Gamma \vdash M : A \rrbracket^{\text{state}}$  (so that each move in a play is annotated with a state).

**Lemma.** (i)  $\llbracket \Gamma \vdash M : A \rrbracket^{\text{state}}$  is **compactly innocent** i.e. generated by a finite (view) function  $f_M$ . (ii) Further  $f_M$  determines an associated DPDA  $P_{f_M}$ .

**Theorem.** The language recognized by the DPDA  $P_{f_M}$  is precisely the complete plays of  $\llbracket \Gamma \vdash M : A \rrbracket^{\text{Kn}}$ .

Thus we can decide observational equivalence of 3rd-order IA, provided there is a procedure to decide: **DPDA Equivalence**.

**DPDA Equivalence:** Given two DPDAs, do they recognize the same language?

First posed in 1966, it was proved to be decidable by Seíizergues in 1998/2001 (Gödel Prize 2002). Primitive recursive bound by Stirling (*TCS* **255**:1-31, 2001).

**Theorem.** There is an algorithm for deciding

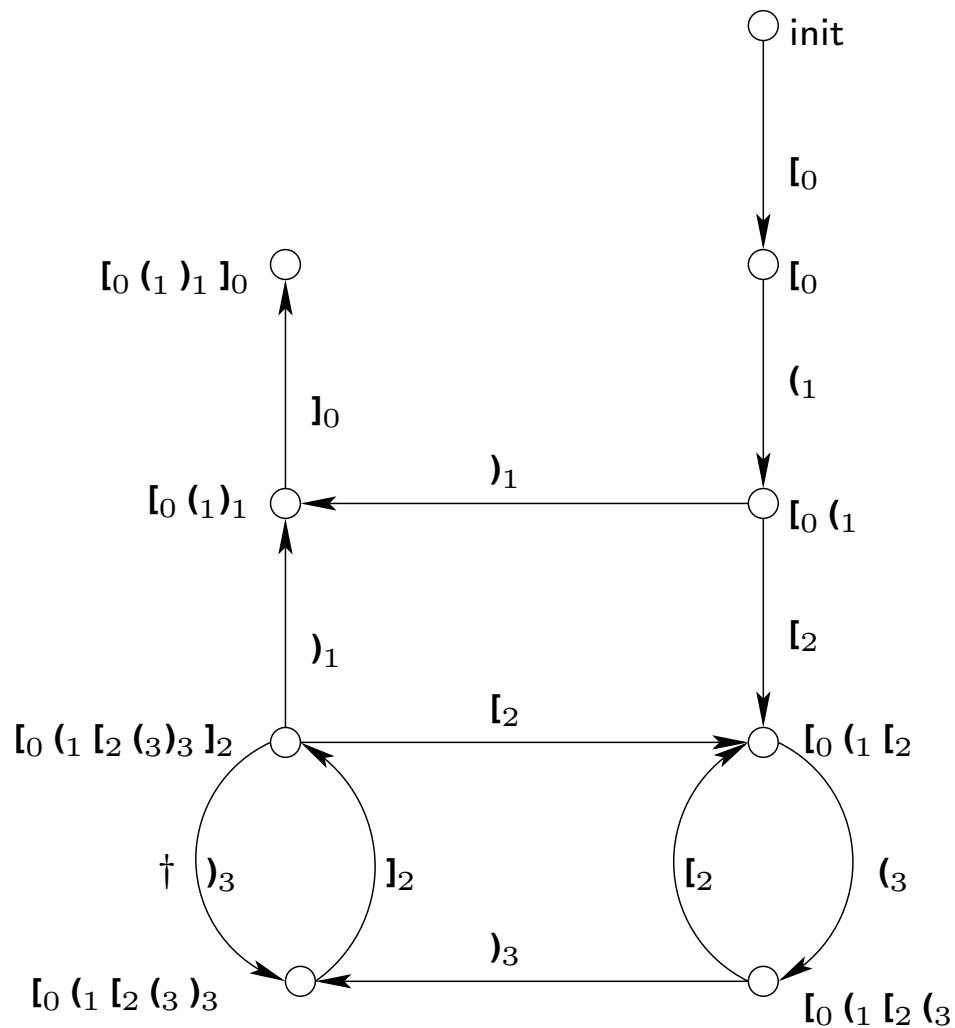
Given two finitary 3rd-order IA terms  $M$  and  $N$ , does  $M$  observationally approximate  $N$ ?

in  $O(2^{2^n})$ .

Proof: **superdeterministic PDAs**: subclass with a decidable inclusion problem.

Or use **Visibly pushdown automata** [AM04]!

Example: DPDA defined by  $\lambda f.f(\lambda x.x) : ((o \rightarrow o) \rightarrow o) \rightarrow o$



## **IV. Applications to Software Model Checking**

## Prototype Tool (developed by Dan Ghica)

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A compiler transforming an open procedural program into finite automaton representing its fully abstract game semantics. See [AGMO04] at TACAS '04.

Parser + type inference + back-end processing in CAML. Back-end heavy-duty regular language processing uses AT&T FSM Library.

### **A case study: Bubble sort**

**Why sorting?** Well-known pathological case involving complicating interactions between data and control control.

“... it seems impossible to use Model Checking to verify that a sorting algorithm is correct since sorting correctness is a data-oriented property involving several quantifications and data structures.” [Bandera user manual]

**Why bubble sort?** Not for any algorithmic virtues, but because it is a straightforward non-recursive sorting algorithm.

Program parameterized over array size ( $n$ ) and basic data type ( $\mathbb{Z} \text{ MOD } 3$ ).  
The DFA model is fully abstract.

**Some performance data:** (SunBlade 100, 2GB RAM)

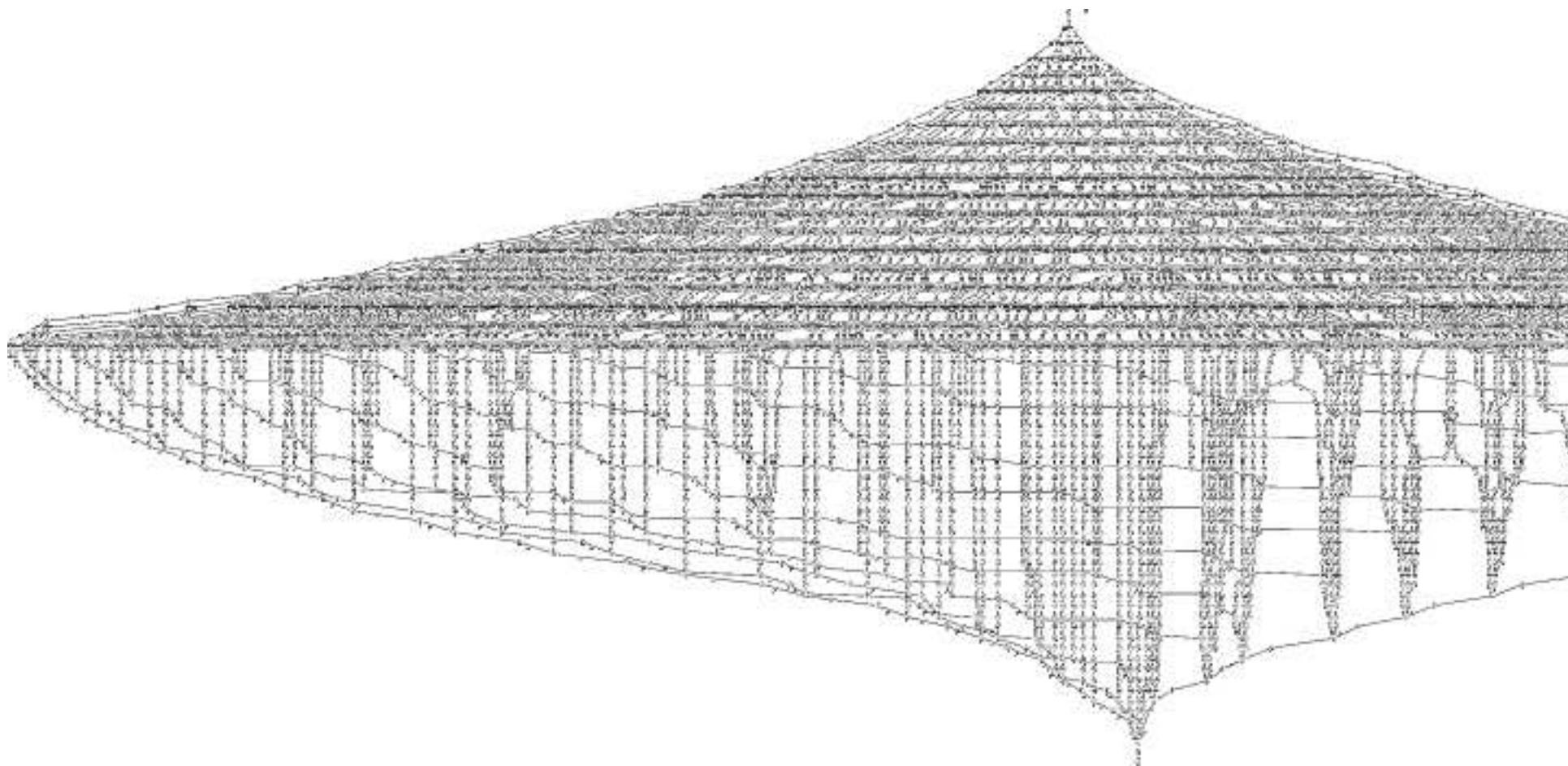
array size $n$	model construction time
2	5 mins
5	10 mins
10	15 mins
20	4 hours
25	10 hours

An array of size 20 (over integers MOD 3) has *circa*  $3^{20}$  states.

**Key features of our Model:**

- representation of the **fully abstract** semantics.
- **highly compact**: it has only about 5500 states!
- **extensional**: tranforms of all (correct) sorting algorithms are isomorphic.

**Related work:** Lazic (Warwick) has an IA-to-CSP compiler for FDR checking.





## A new approach to Software Model Checking

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Though we emphasize observational equivalence, the same algorithmic representations of program meanings can be used to verify a wide range of program properties  $\Xi \models \phi$  where  $\Xi$  is a term-in-context, provided  $\phi$  is a regular property.

E.g. take  $\Xi = p : \text{int} \rightarrow \text{int}, x : \text{loc} \vdash M : \text{com}$ , and

$\phi =$  “in  $M$ , whenever  $p$  is called, its argument is read from  $x$  and its result is (immediately) written into  $x$ ”

can be captured by the regular expression: for appropriate move sets  $X, Y$  and  $Z$

$$(X^* (q^1 \text{ read}^3 \sum_{d \in D} (d^3 d^1) Y^* \sum_{d \in D} (d^3 \text{ write}(d)^3) \text{ok}^3 Z)^*)^*$$

## A new approach to Software Model Checking (con'd)

**Fact.** Definability by regular expressions is equivalent to definability in QPLTL.

Thus we obtain for free a model checker for a temporal style of program correctness assertions verifiable by checking for **emptiness of the intersection of the program automaton and the complement of the property automaton**.

We intend to:

- Combine these ideas with the standard methods of **over-approximation** and **data-abstraction**
- Investigate applications in **inter-procedural dataflow analysis** and **reachability analysis**.

**Goal:** Build on the tools and methods of the verification community, while exploring the advantages offered by our semantics-based approach.

## Further directions: Verification of recursive HOPL Programs

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### Verifying infinitary computation against infinitary properties

Finitary computation	Finitary properties	Yes
Infinitary computation	Finitary properties	Yes
Infinitary computation	Infinitary properties	?

E.g. **Model Checking**. Given a order- $n$  recursively-defined IA term  $M$  and a  $\mu$ -calculus formula  $\phi$ , does  $\llbracket M \rrbracket \models \phi$ ?

General problem is hard: Don't have a sensible model of computation for generating  $\llbracket M \rrbracket$  for  $n > 3$ .

First step: restrict to **Pure functional fragment of IA** - already very rich; e.g. it contains the hierarchy of **safe higher-order recursion scheme** Damm / Knapik-Niwinski-Urzyczyn / Caucal etc. Many intriguing and challenging problems.