# ALGORITHMIC GAME SEMANTICS 

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## GAME SEMANTICS

```
et rec add_identifier id id_typt
    match env with
        [ ] -> [ ( id,[id_type]) ]
        | (top_id, ty) :: env_tl ->
        if top_id = id then (top_ic
        else (top_id, ty) :: add_ic
    et rec rem_identifier id env =
    match env with
        [ ] -> raise Undeclared_ident
        | ( top_id, ty) :: env_tl ->
        if top_id = id the\overline{n}}\mathrm{ (if ty=
nv_tl)
            else (top_id, ty) :: rem_id
```



## FULL ABSTRACTION

$M$ and $N$ are contextually equivalent ( $M \cong N$ ) if they can be used interchangeably in any context (without affecting the computational outcome).

$$
\forall \mathbb{C}[-] . \quad \mathbb{C}[M] \Downarrow \quad \Longleftrightarrow \quad \mathbb{C}[N] \Downarrow
$$

$$
\llbracket M \rrbracket=\llbracket N \rrbracket \Longleftrightarrow M \cong N
$$

## GAMES FORTYPES

## -Who plays?

0
Opponent

$$
\mathbb{C}[-]
$$

P
Proponent

M
JUSTIFIED SEQUENCES

- How do they play?


O begins. Subsequent moves must be justified by earlier moves made by the opposite player .

## GAMES PLAYED IN ARENAS

An arena $A$ is specified by a structure $\left\langle M_{A}, \lambda_{A}, \vdash_{A}\right\rangle$.

- $M_{A}$ is a set of moves.
- $\lambda_{A}: M_{A} \rightarrow\{O, P\} \times\{Q, A\}$ is a labelling function.
$-\vdash_{A}$ is an enabling relation between $\{\dagger\}+M_{A}$ and $M_{A}$.
- If $\dagger \vdash m$ then $\lambda_{A}(m)=O$ and $n \vdash_{A} m$ implies $n=\dagger$.
- If $m \vdash m^{\prime}$ then $\lambda_{A}(m) \neq \lambda_{A}\left(m^{\prime}\right)$.


A justified sequence over arena $A$ is a sequence of moves from $M_{A}$ together with an associated sequence of pointers satisfying the following conditions.

- The first move is enabled by $\star$ and has no outgoing pointer.
- Any other move $m$ must have a pointer to an earlier move $n$ such that $n \vdash_{A} m$.


## N.B. Papers on game semantics use variations on the concept of a justified sequence to suit the programming paradigm being modelled.

A play is a justified sequence that additionally satisfies ... We shall write $P_{A}$ for the set of plays over arena $A$.

## SOME EXAMPLES

- Sequential computation: alternation
- Absence of control effects: well-bracketing
$\cdots q^{\curvearrowleft} q_{1} a_{1} \cdots q_{n}{ }^{\curvearrowleft} a_{n} a \cdots$
- First-order store only: visibility


In his next move $P$ cannot use $\cdots$ for justification.

## HISTORY

## All the conditions were already present in

J. M. E. Hyland, C.-H. Luke Ong: On Full Abstraction for PCF: I, II, and III. Inf. Comput. 163(2): 285-408 (2000)

## But it took a few years to match them with other computational paradigms.

Samson Abramsky, Kohei Honda, Guy McCusker: A Fully Abstract Game Semantics for General References. LICS 1998: 334-344

James Laird: Full Abstraction for Functional Languages with Control. LICS 1997: 58-67

Samson Abramsky, Guy McCusker: Linearity, Sharing and State: a fully abstract game semantics for Idealized Algol with active expressions. Electr. Notes Theor. Comput. Sci. 3: 2-14 (1996)

## REASONING WITH GAMES

- Plays have operational flavour.
- The course of play is often described through metaphores.
- This account has not been formalized yet.
- Operational game semantics: marriage of games and traces


## $\vdash$ bool $\rightarrow$ bool

## BN


cBV

$\begin{array}{ll}\text { Questions } & q_{0}, q_{1} \\ \text { Answers } & \mathrm{t}_{0}, \mathrm{f}_{0}, \mathrm{t}_{1}, \mathrm{f}_{1}\end{array}$
Plays


Questions
$q, \mathrm{t}_{1}, \mathrm{f}_{1}$
Answers
$\star, t_{0}, f_{0}$

$$
\left.q^{\curvearrowleft} \star^{\prime}\left(b_{1}{ }_{1}{ }^{1}\right)_{0}\right)^{\prime}
$$

## STRATEGIES

- Types are interpreted by games.
- Terms are interpreted by strategies.

A strategy $\sigma$ in arena $A$ is a prefix-closed set of plays over $A$ such that
$s \in \sigma$ and $s o \in P_{A}$ implies $s o \in \sigma$.

## Games and strategies are treated as first-class mathematical objects.

## GAME CONSTRUCTORS

$$
A_{1} A_{2}
$$

$$
\begin{array}{ll}
R_{1}^{\prime} & R \\
A_{1} & A_{2}
\end{array}
$$

$$
A_{1}+A_{2}
$$

## IDENTITY STRATEGY

$$
A \Rightarrow A
$$

$\begin{array}{ccc}O & m_{L} & \\ P & & m_{R} \\ & & \vdots\end{array}$

$\begin{array}{ccc}O & & m_{R}^{\prime} \\ P & m_{L}^{\prime} & \\ & & \vdots\end{array}$

Given $\sigma: A_{1} \Rightarrow A_{2}$ and $\tau: A_{2} \Rightarrow A_{3}$ one can define $\sigma ; \tau: A_{1} \Rightarrow A_{3}$.

- Moves in $A_{2}$ have a double identity.
- We can exploit the duality to play $\sigma$ and $\tau$ against each other in $A_{2}$.
- Following the exchange between $\sigma$ and $\tau$ we can hide the interaction in $A_{2}$ to obtain a play in $A_{1} \Rightarrow A_{3}$.


## COMPOSITION

$$
\begin{array}{ccc}
A_{1} \stackrel{\sigma}{\Rightarrow} & A_{2} \stackrel{\tau}{\Rightarrow} & A_{3} \\
\hline & & o \\
& & p \\
& & o / p \\
p & & \\
o & & \\
& & \\
& & \\
p & o / p & \\
o & & \\
& & \\
& & p / o \\
& o / p & \\
& p / o & \\
& & \\
& & \\
& & \\
& &
\end{array}
$$

# COMPOSITIONAL INTERPRETATION 

- The game-semantic denotations are obtained compositionally by induction on term structure.
- Free identifiers are interpreted by identity strategies.
- All other cases are handled through composition with suitably-crafted strategies.


## POINTERS (CBN)

## $f:($ int $\rightarrow$ int $) \rightarrow$ int


$f\left(\lambda x^{\text {int }} . f\left(\lambda y^{\text {int }} . y\right)\right)$


## POINTERS (CBV)

$f:$ int $\rightarrow$ int $\rightarrow$ int
let val $g=f(0)$ in let val $h=f(1)$ in $g(2)$

let val $g=f(0)$ in
let val $h=f(1)$ in $h(2)$


## FULL ABSTRACTION

## $M$ and $N$ are contextually equivalent if and only if they induce the same sets of complete plays (all questions must be answered).

Samson Abramsky, Guy McCusker: Linearity, Sharing and State: a fully abstract game semantics for Idealized Algol with active expressions. Electr. Notes Theor. Comput. Sci. 3: 2-14 (1996)

## EXAMPLE (○'HEARN)

Idealized Algol: an applied lambda calculus over com, int and var with call-by-name evaluation and fixed-point combinators.
$p: \mathbf{c o m} \rightarrow \operatorname{com} \vdash p(\Omega): \mathbf{c o m}$
$p: \operatorname{com} \rightarrow \operatorname{com} \vdash$ new $x$ in $x:=0$;

$$
p(x:=1)
$$

if $x=0$ then skip else $\Omega:$ com

The equivalence of the two terms cannot be validated using state-transformer semantics.

## GAME-SEMANTIC ARGUMENT



$$
\begin{aligned}
p: \operatorname{com}_{4} \rightarrow & \operatorname{com}_{2} \vdash p: \operatorname{com}_{1} \rightarrow \operatorname{com}_{0} \\
& \text { run }_{0} \text { run }_{2}\left(\text { run }_{3} \text { run }_{1} \text { done }_{1} \text { done }_{3}\right)^{*} \text { done }_{2} \text { done }
\end{aligned} 0
$$

$$
\text { run }_{0} \text { run }_{2} \text { done }_{2} \text { done }_{0}
$$

## $p(x:=1)$



- $p$
run $_{0}$ run $_{2}\left(\text { run }_{3} \text { run }_{1} \text { done }_{1} \text { done }_{3}\right)^{*}$ done $_{2}$ done $_{0}$
- $x:=1$
run $_{0}$ write(1) ok done ${ }_{0}$
- $p(x:=1)$
run $_{0}$ run $_{2}\left(\text { run }_{3} \text { write(1) ok done }{ }_{3}\right)^{*}$ done $_{2}$ done $_{0}$


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- $p$
run $_{0}$ run $_{2}\left(\text { run }_{3} \text { run }_{1} \text { done }_{1} \text { done }_{3}\right)^{*}$ done $_{2}$ done $_{0}$
- $x:=1$
run $_{0}$ write (1) ok done ${ }_{0}$
- $p(x:=1)$
run $_{0}$ run $_{2}\left(\text { run }_{3} \text { write(1) ok done }{ }_{3}\right)^{*}$ done $_{2}$ done $_{0}$
- $p(x:=1)$

$$
\text { run }_{0} \text { run }_{2}\left(\text { run }_{3} \text { write }(1) \text { ok done }{ }_{3}\right)^{*} \text { done }_{2} \text { done }_{0}
$$

- $x:=0 ; p(x:=1)$; if $x=0$ then () else $\Omega$
run $_{0}$ write (0) ok run $\left.2_{2}\left(\text { run }_{3} \text { write (1) ok done }\right)_{3}\right)^{*}$ done $_{2}$ read 0 done $_{0}$
- new $x$ in $x:=0 ; p(x:=1)$; if $x=0$ then () else $\Omega$

$$
\text { run }_{0} \text { run }_{2} \text { done }_{2} \text { done } 0_{0}
$$

new is interpreted by composition with a strategy ensuring that read's and write $(i)$ 's match.

## Same complete plays imply equivalence.

## RECIPE

- Analyze the underlying process of composition.
- Understand what "really happens".
- Express strategy-building in a concrete way as an operation on formal languages.
- Remember to encode pointers, if necessary.
- Prove language equivalence using the chosen representation.


## TYPE ORDER

$$
\operatorname{ord}(\theta)= \begin{cases}0 & \theta \equiv \mathbf{c o m}, \text { int }, \text { var } \\ \max \left(\operatorname{ord}\left(\theta_{1}\right)+1, \operatorname{ord}\left(\theta_{2}\right)\right) & \theta \equiv \theta_{1} \rightarrow \theta_{2}\end{cases}
$$

- $I A_{k}$ consists of terms of the form

$$
x_{1}: \theta_{1}, \cdots, x_{n}: \theta_{n} \vdash M: \theta
$$

with $\operatorname{ord}\left(\theta_{i}\right)<k$ and $\operatorname{ord}(\theta) \leq k$.

- Looping and recursion are not available in $\mathrm{I} \mathrm{A}_{k}$.
- We write $\mathbf{Y}_{k}$ to stress the availability of the fixed-point combinator $\mathbf{Y}_{\theta}:(\theta \rightarrow \theta) \rightarrow \theta$ for $\theta$ of order $k$.


## DECIDABILITY

We assume finite ground types!

|  | pure | + while | $+\mathbf{Y}_{0}$ | $+\mathbf{Y}_{1}$ |
| :---: | :---: | :---: | :---: | :---: |
| $\mathrm{IA}_{1}$ | + | + | + | - |
| $\mathrm{IA}_{2}$ | + | + | + | - |
| $\mathrm{IA}_{3}$ | + | + | + | - |
| $\mid \mathrm{A}_{4}$ | - | - | - | - |

The results were obtained using FA, DPDA and VPA.

## BIBLIOGRAPHY

Dan R. Ghica, Guy McCusker: Reasoning about Idealized ALGOL Using Regular Languages. ICALP 2000: 103-115

Andrzej S. Murawski: Games for complexity of second-order call-by-name programs Theor. Comput. Sci. 343(1-2): 207-236 (2005)
C.-H. Luke Ong: Observational Equivalence of 3rd-Order Idealized Algol is Decidable. LICS 2002: 245-256

Andrzej S. Murawski, C.-H. Luke Ong, Igor Walukiewicz: Idealized Algol with Ground Recursion, and DPDA Equivalence. ICALP 2005: 917-929

Andrzej S. Murawski, Igor Walukiewicz: Third-Order Idealized Algol with Iteration Is Decidable. FoSSaCS 2005: 202-218

Andrzej S. Murawski: On Program Equivalence in Languages with Ground-Type References. LICS 2003: 108-

## COMPLEXITY

## Equivalence of terms in beta-normal form.

|  | pure | + while | $+\mathbf{Y}_{0}$ | $+\mathbf{Y}_{1}$ |
| :--- | :---: | :---: | :---: | :---: |
| $\mathrm{IA}_{1}$ | CONP-complete | PSPACE-complete | $?$ | - |
| $\mathrm{IA}_{2}$ | PSPACE-complete | PSPACE-complete | $?$ | - |
| $\mathrm{IA}_{3}$ | EXPTIME-complete | EXPTIME-complete | $?$ | - |
| $\mathrm{IA}_{4}$ | - | - | - | - |

Non-elementary in general.

## UNDECIDABILITY

- It may seem surprising that program equivalence in a language over finite datatypes is undecidable.
- This is all due to the rich structure of interactions afforded by higher-order types.
- At fourth order there are patterns of interaction between $O$ and $P$ that resemble actions of a queue.
- Moreover, there exists a program that can detect whether $O$ follows the queue-pattern.
- Game semantics tames higher-order interaction.


## NONDETERMINISM

## May-termination $\Downarrow_{\text {may }}$ Must-termination $\Downarrow_{\text {must }}$

- May-equivalence

$$
\forall \mathbb{C}[-] . \quad \mathbb{C}[M] \Downarrow_{\text {may }} \quad \Longleftrightarrow \quad \mathbb{C}[N] \Downarrow_{\text {may }}
$$

- Must-equivalence

$$
\forall \mathbb{C}[-] . \quad \mathbb{C}[M] \Downarrow_{\text {must }} \Longleftrightarrow \mathbb{C}[N] \Downarrow_{\text {must }}
$$

- May \& Must-equivalence


## MAY-EQUIVALENCE

Characterization via complete plays still applies.

|  | pure | + while | $+\mathbf{Y}_{0}$ |
| :--- | :---: | :---: | :---: |
| EA $_{1}$ | PSPACE-complete | EXPSPACE-complete | - |
| EA $_{2}$ | EXPSPACE-complete | EXPSPACE-complete | - |
| EA $_{3}$ | 2-EXPTIME-complete | 2-EXPTIME-complete | - |
| EA $_{4}$ | - | - | - |

## MUST-EQUIVALENCE

Russell Harmer, Guy McCusker: A Fully Abstract Game Semantics for Finite Nondeterminism. LICS 1999: 422-430

A strategy $\sigma$ on an arena $A$ is a pair $\left(T_{\sigma}, D_{\sigma}\right)$. The first component $T_{\sigma}$, known as the traces of $\sigma$, is a non-empty set of even-length legal plays of $A$ satisfying

$$
s a b \in T_{\sigma} \Rightarrow s \in T_{\sigma} .
$$

We write $\operatorname{dom}(\sigma)$ for the domain of $\sigma$, i.e. the set $\left\{s a \in L_{A} \mid \exists b . s a b \in T_{\sigma}\right\}$ and $c c(\sigma)$ for the contingency closure of $\sigma$, i.e. $T_{\sigma} \cup \operatorname{dom}(\sigma)$. Given $s a \in \operatorname{dom}(\sigma)$, let $\operatorname{rng}_{\sigma}(s a)=\left\{b \in M_{A} \mid s a b \in T_{\sigma}\right\}$.

The second component $D_{\sigma}$ is known as the divergences of $\sigma$; it's a set of odd-length legal plays of $A$ satisfying

## Characterization via quotienting.

## WINNING REGIONS

Let $O$ and $P$ play a reachability game over the traces of $\sigma . O$ will be declared a winner if he reaches a complete play without encountering any divergences. This induces winning regions for $O$ and $P$.

Two terms are must-equivalent if and only if any difference between the induced strategies (trace or divergence) is compensated by a winning region for $P$.

Andrzej S. Murawski: Reachability Games and Game Semantics: Comparing

Nondeterministic Programs. LICS 2008: 353-363

## MUST-EQUIVALENCE

|  | pure | +while | $+\mathbf{Y}_{0}$ |
| :--- | :---: | :---: | :---: |
| $\mathrm{EA}_{1}$ | PSPACE-complete | 2-EXPTIME-complete | - |
| $\mathrm{EA}_{2}$ | 2-EXPTIME-complete | 2-EXPTIME-complete | - |
| $\mathrm{EA}_{3}$ | 3-EXPTIME-complete | 3-EXPTIME-complete | - |
| $\mathrm{EA}_{4}$ | - | - | - |

## PROBABILISTIC EQUIVALENCE

$$
\Downarrow_{p}
$$

$$
\forall \mathbb{C}[-] . \quad \mathbb{C}[M] \Downarrow_{p} \quad \Leftrightarrow \quad \mathbb{C}[N] \Downarrow_{p}
$$

## PROBABILISTIC STRATEGIES

The definition comes in two steps. First of all, we define a prestrategy $\sigma$ on an arena $A$ to be a (set-theoretic) function $\sigma: \mathcal{L}_{A}^{\text {even }} \rightarrow[0, \infty]$. Such a prestrategy is a strategy iff
(p1) $\sigma(\varepsilon)=1$; (p2) if $s a \in \mathcal{L}_{A}^{\text {odd }}$ then $\sigma(s) \geq \sum_{t \in \mathrm{ie}(s a)} \sigma(t)$.

Vincent Danos, Russell Harmer: Probabilistic game semantics. ACM Trans. Comput. Log. 3(3): 359-382 (2002)

# PROBABILISTIC LANGUAGE EQUIVALENCE 

Two probabilistic programs are equivalent if and only if the corresponding probabilistic strategies assign the same probabilities to all complete plays.

## APEX tool

Axel Legay, Andrzej S. Murawski, Joël Ouaknine, James Worrell: On Automated Verification of Probabilistic Programs. TACAS 2008: 173-187

## DINING CRYPTOGRAPHERS



## WAS IT ONE OFTHEM?

## One of the cryptographers paid $\Longleftrightarrow$ \#"Disagree" is odd

$$
f:\{0,1,2,3\} \rightarrow\{0,1\}
$$

```
x:int%4 |-
    var%4 whopaid; var%2 first; var%2 left;
    var%2 right; var%2 parity; var%4 i;
    whopaid:=x; first:=coin; right:=first; i:=1;
    while (i) do
    {
        left:= if (i=3) then first else coin;
        if not((left=right)+(whopaid=i))
            then parity:=not(parity);
        right := left;
        i:=i+1
    };
    parity : int%2
```


## CORRECTNESS



## ANONYMITY (VIEWS)

```
cn:var%2, ch:var%2 |-
var%4 whopaid;
whopaid := 2;
if (whopaid <= 1) then diverge else
{
    var%2 first; var%2 left; var%2 right; var%4 i;
    first:=coin; right:=first; i:=1;
    while (i) do
    {
        left:=if (i=3) then first else coin;
        if (i=1) then { cn:=right; cn:=left };
        if ((left=right)+(whopaid=i)) then ch:=1 else ch:=0;
        right := left;
        i := i+1
    }
}: com
```


## WHAT CAN HE SEE?

## 2 paid



## 3 paid



## WHAT CAN HE SEE?



## MORE CRYPTOGRAPHERS



## OTHERTOOLS

- Homer

David Hopkins, C.-H. Luke Ong: Homer: A Higher-Order Observational Equivalence Model checkER. CAV 2009: 654-660

- MAGE

Adam Bakewell, Dan R. Ghica: On-the-Fly Techniques for Game-Based Software Model Checking. TACAS 2008: 78-92

## CALL-BY-VALUE EVALUATION

## Call-by-value Idealized Algol

RML: an ML-like language with integer references, including "bad" ones

$$
\text { ref int }=(\text { unit } \rightarrow \text { int }) \times(\text { int } \rightarrow \text { unit })
$$

PRO: Finite alphabet, if finitely many values!
CON: Equivalences relying on ref int may be affected.

Samson Abramsky, Guy McCusker: Call-by-Value Games. CSL 1997: 1-17

## SOME SURPRISES?

- unit $\rightarrow$ unit $\rightarrow$ unit is problematic.

$$
q^{\curvearrowleft} \star q^{n} a \cdots q^{\curvearrowleft} a
$$

There are many $a$ 's to point at...

- (unit $\rightarrow$ unit $) \rightarrow$ (unit $\rightarrow$ unit $) \rightarrow$ unit is undecidable.

Andrzej S. Murawski: Functions with local state: Regularity and undecidability. Theor. Comput. Sci. 338(1-3): 315-349 (2005)

## SOME RESULTS

Assume finite ground types and absence of recursion.

- Regular

$$
\text { (unit } \rightarrow \text { unit) } \rightarrow \text { unit } \vdash \text { unit } \rightarrow \text { unit }
$$

- Visibly context-free

$$
((\text { unit } \rightarrow \text { unit }) \rightarrow \text { unit }) \rightarrow \text { unit } \vdash(\text { unit } \rightarrow \text { unit }) \rightarrow \text { unit }
$$

David Hopkins, Andrzej S. Murawski, C.-H. Luke Ong: A Fragment of ML Decidable by Visibly Pushdown Automata. ICALP (2) 2011: 149-161

## SUMMARY

- Many decision procedures have been obtained via game semantics in recent years.
- Some have been implemented and observed to beat alternative approaches.
- Several tools use game semantics as a main engine.
- Ready for "realistic" applications?

