# Divide and Recycle: Types and Compilation for a Hybrid Synchronous Language 

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- Platforms for simulation and development
- More and more important
- Semantics
- Efficiency and predictability
- Fidelity / Consistency

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Conservative extension of a synchronous data-flow language

## Motivation



- Platforms for simulation and development
- More and more important
- Semantics
- Efficiency and predictability
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Conservative extension of a synchronous data-flow language

What distinguishes our approach?

- Compilation with existing tools (after source-to-source transformation)
- Static typing
- Semantics based on non-standard analysis


## Outline

## Background

Hybrid Synchronous Language
Semantics
Compilation
Execution
Typing

Conclusion

## Modeling

Model discrete systems with data-flow equations

Model physical systems with Ordinary Differential Equations (ODEs)

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Model discrete systems with data-flow equations

Model physical systems with Ordinary Differential Equations (ODEs)


$$
y(0)=y_{i}
$$

initial values

- Causal: inputs on right, outputs on left
- First-order: one equation = one variable


## Bouncing ball

model

$$
\begin{aligned}
F & =m \cdot a \\
-g & =m \cdot \frac{d^{2} h(t)}{d t^{2}} \\
\frac{d^{2} h(t)}{d t^{2}} & =-g / m
\end{aligned}
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$$
\begin{aligned}
& v(t)=v_{0}+\int_{0}^{t}(-g / m) \cdot d \tau \\
& h(t)=h_{0}+\int_{0}^{t} v(\tau) \cdot d \tau
\end{aligned}
$$

## Bouncing ball



## Bouncing ball

model


## Solver execution



## Solver execution


$t$

## Solver execution


$\rightarrow t$

## Solver execution


$\rightarrow t$

## Solver execution

fff


9


## Solver execution

fff $f$

$\begin{array}{r}9 \\ \uparrow \\ \\ \\ \hline\end{array}$

## Solver execution



- Bigger and bigger steps (bound by $h_{\min }$ and $h_{\max }$ )


## Solver execution

1. approximation error too large


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## Solver execution

1. approximation error too large

2. expression crosses zero

- Bigger and bigger steps (bound by $h_{\min }$ and $h_{\max }$ )
- $t$ does not necessarily advance monotonically
- Ok for continuous states (managed by solver)
- Cannot change state within $f$ or $g$


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Start with Lucid Synchrone (subset); add first-order ODEs with reset.


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$x=($ pre $\mathrm{h}+1)$ every up(e) init $e_{i}$

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init $e_{i}$
| purely sync every event

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$x=($ pre h +1$)$ every up(e) default $e_{c}$ init $e_{i}$
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$x=($ pre h +1$)$ every up(e) default $e_{c}$ init $e_{i}$ | purely sync every event

Very simple: no clocks, no automata, no higher-order


## Bouncing ball

program

$$
\begin{array}{ll}
\dot{v}=-g / m & v(0)=v_{0} \\
\dot{h}=v & h(0)=h_{0}
\end{array}
$$

$h$
reset $v$ to $-0.8 \cdot v$ when $h$ becomes 0
let hybrid ball () =
let
rec der $v=(-. g / m)$ init $v 0$ reset (-. 0.8 *. last $v$ ) every up(-. h)
and der $h=v$ init ho in ( $v, h$ )

## Semantics

reals
non-standard reals

+ infinitesimals ( $\partial$ )



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reals non-standard reals


+ infinitesimals ( $\partial$ )

$\cdots<t-3 \partial<t-2 \partial<t-\partial<\mathrm{t}<t+\partial<t+2 \partial<t+3 \partial<\cdots$


## Semantics

reals


- dense and discrete
- base clock for both continuous and discrete behaviors
- $\forall t$. ${ }^{\bullet} t$ is the previous instant, $t^{\bullet}$ is the next instant

| integr $^{\#}(T)(s)\left(s_{0}\right)(h s)(t)$ | = | $s^{\prime}(t)$ | where |
| :---: | :---: | :---: | :---: |
| $s^{\prime}(t)$ |  | $s_{0}(t)$ | if $t=\min (T)$ |
| $s^{\prime}(t)$ |  | $s^{\prime}\left({ }^{\bullet} t\right)+\partial s\left({ }^{( } t\right)$ | if handler\# $(T)(h s)(t)=$ NoEvent |
| $s^{\prime}(t)$ | - | $v$ | if handler\# $(T)(h s)(t)=$ Xcrossing $(v)$ |
| $u p^{\#}(T)(s)(t)$ |  | false | if $t=\min (T)$ |
| $u p^{\#}(T)(s)\left(t^{\bullet}\right)$ |  | true | if $\left.\left(s{ }^{\bullet} t\right) \leq 0\right) \wedge(s(t)>0)$ and $(t \in T)$ |
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## Semantics

reals
non-standard reals


- dense and discrete
- base clock for both continuous and discrete behaviors
- $\forall t$. ${ }^{\bullet} t$ is the previous instant, $t^{\bullet}$ is the next instant

| integr\# $^{\#}(T)(s)\left(s_{0}\right)(h s)(t)$ | $=s^{\prime}(t)$ | where |
| :--- | :--- | :--- |
| $s^{\prime}(t)$ | $=s_{0}(t)$ | if $t=\min (T)$ |
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| $s^{\prime}(t)$ | $=v$ | if $\operatorname{handler}^{\#}(T)(h s)(t)=$ Xcrossing $(v)$ |
| $u^{\#}(T)(s)(t)$ |  | fa1se |

## Compilation

let hybrid ball () =
let
rec der $v=(-. g / m)$ init $v 0$
reset ( -0.8 *. last $v$ ) every up(-. h)
and der $h=\quad v$ init $h 0$ in ( $v, h$ )

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let hybrid ball () =
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    rec der \(v=(-. g / m)\) init \(v 0\)
        reset (-. 0.8 *. last \(v\) ) every up(-. h)
    and der \(h=v\) init \(h 0\)
    in ( \(v, h\) )
let node ball (zl, (lh, lv), ()) =
    let rec \(\mathrm{i}=\) true fby false
    and \(\mathrm{dv}=(-. \mathrm{g} / \mathrm{m})\)
    and \(v=\) if \(i\) then \(v 0\)
                                    else if zl then -. 0.8 *. Iv
                                    else Iv
    and \(\mathrm{dh}=\mathrm{v}\)
    and \(h=i f\) i then h0 else lh
    and upzl \(=-. h\)
    in ((v, h), upzl, (h, v), (dh, dv))
```


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let hybrid ball () =
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    and \(\mathrm{dv}=(-. \mathrm{g} / \mathrm{m})\)
    and \(v=\) if i then \(v 0\)
                        else if zool then -.0 .8 *. Iv
                else Iv
                    transform into discrete subset
    and \(\mathrm{dh}=\mathrm{v}\)
    and \(h=i f\) i then \(h 0\) else lh
    and \(u p z l=-. h\)
    in \(((v, h), u p z l,(h, v),(d h, d v))\)
```


## Compilation



## Compilation



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let hybrid ball () =
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reset (-. $0 . \beta$ *. last v) every up(-. h)
and der $h=v$ init $h$ c
let node ball (zl, (lh. Iv), ()) = let rec $i=$ true fby false
and $\mathrm{dv}=(-. \mathrm{g} / \mathrm{m})$
and $v=$ if ithen $v 0$
else if zl then -.0 .8 *. Iv else Iv
and dh All continuous parts execute in 1 st instant and $h$

- type system prevents C inside D
and up no branching or activations
in ((v, h), upzl, (h, v), (dh, dv))


## Execution (Simulation)

$$
\begin{array}{lll}
(u p z, y, d y) & =\operatorname{main}_{\sigma}(z, y) & \\
f(t, y) & =\text { let }\left(\__{-}, d y\right)=\operatorname{main}_{\sigma}(\text { false,y }) & \text { in } d y \\
g(t, y) & =\text { let }(u p z,-,-)=\operatorname{main}_{\sigma}(f a l s e, y) & \text { in upz } \\
d(z, y) & =\text { let }\left(u p z, y,_{-}\right)=\operatorname{main}_{\sigma}(z, y) & \text { in }(u p z, y)
\end{array}
$$



- Only d may have side effects
- Neither $f$, nor $g$ may change the (internal) discrete state


## Typing

Motivation

This compilation/execution scheme only works for some programs!

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We need a type system to:

- Reject programs that do not respect the invariant:
- discrete computations in Donly
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Motivation

This compilation/execution scheme only works for some programs!

We need a type system to:

- Reject programs that do not respect the invariant:
- discrete computations in Donly
- continuous evolutions in Conly
- Reject unreasonable programs
- where behavior depends 'too much' on simulation parameters (like the step size, or number of iterations)


## Typing

Unreasonable programs

$$
\begin{aligned}
& \text { der } y=1.0 \text { init } 0.0 \quad \text { and } \quad x=(0.0 \rightarrow \text { pre } x)+y \\
& x=0.0 \rightarrow(\text { pre } x+.1 .0) \quad \text { and } \quad \text { der } y=x \text { init } 0.0
\end{aligned}
$$

- y is a variable that changes continuously
- x is discrete register
- The relationship between the two is ill-defined


## Typing

The type language

$$
\begin{array}{ll}
b t & ::=\text { float } \mid \text { int | bool| zero } \\
t & ::=b t|t \times t| \beta \\
\sigma & ::=\forall \beta_{1}, \ldots, \beta_{n} \cdot t \xrightarrow{k} t \\
k & ::=\mathrm{D} \mid \mathrm{C\mid A}
\end{array}
$$



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Initial conditions

$$
\begin{array}{ll}
(+) & : \text { int } \times \text { int } \xrightarrow{\mathrm{A}} \text { int } \\
(=) & : \forall \beta . \beta \times \beta \xrightarrow{\mathrm{A}} \text { boo } \\
\text { if } & : \forall \beta . \mathrm{bool} \times \beta \times \beta \xrightarrow{\mathrm{A}} \beta \\
\text { pre(.) } & : \forall \beta . \beta \xrightarrow{\mathrm{D}} \beta \\
. \mathrm{fby} . & : \forall \beta . \beta \times \beta \xrightarrow{\mathrm{D}} \beta \\
\text { up(.) } & : \text { float } \xrightarrow{C} \text { zero }
\end{array}
$$

## Typing

$G, H \vdash^{C}$ der $y=1.0$ init $0.0 \quad G, H \vdash_{\mathrm{D}} \quad x=(0.0 \mathrm{fby}(\mathrm{x}+1))$

## Typing



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## Typing


$G, H \vdash$ ? $\operatorname{der} y=\cdots$ and $x=\cdots$
$G, H \vdash$ ? $\quad \operatorname{der} y=\cdots \quad$ and $x^{\prime}=\cdots$

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$G, H \vdash$ ? $\operatorname{der} y=\cdots$ and $x=\cdots$
$G, H \vdash C \quad \operatorname{der} y=\cdots \quad$ and $x^{\prime}=\cdots$
$G, H \vdash_{D} \quad x=\cdots \quad$ and $x=\cdots$

## Typing

$G, H \vdash \mathrm{c}$ dery $=1.0$ init $0.0 \quad G, H \vdash \mathrm{D}, x=(0.0 \mathrm{fby}(\mathrm{x}+1))$
$G, H \vdash$ ? der $y=\cdots$ and $x=\cdots$
$G, H \vdash C \quad \operatorname{der} y=\cdots \quad$ and $x^{\prime}=\cdots$
$G, H \vdash D \quad x=\cdots \quad$ and $x=\cdots$

Typing of function body gives its kind $k \in\{\mathrm{C}, \mathrm{D}, \mathrm{A}\}$ :

$$
h: \text { float } \times \text { float } \stackrel{k}{\longrightarrow} \text { float } \times \text { float }
$$

Less expressive but simpler than 'per-wire' kinds, e.g. Simulink

## Conclusion

- Simple extension of a synchronous data-flow language
- Add first-order ODEs
- and zero-crossing events
- Non-standard semantics
- Gives a 'continuous base clock'
- Simplifies definitions, clarifies certain features
- Static block-based typing system
- Divide system into continuous and discrete parts
- Compilation
- Source-to-source transformation
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Ocaml Sundials CVODE interface and compiler available

