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

> Albert Benveniste<sup>1</sup> Benoît Caillaud<sup>1</sup> Timothy Bourke<sup>1</sup> Marc Pouzet<sup>1,2,3</sup>

1. INRIA

2. Institut Universitaire de France

3. École normale supérieure (LIENS)



LCTES 2011, CPS Week, April 11–14, Chicago, IL, USA

Motivation Simulink Hybrid Systems Modelers

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

Motivation Simulink Hybrid Systems Modelers Ptolemy

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

Conservative extension of a synchronous data-flow language

Motivation Simulink Hybrid Systems Modelers Ptolemy

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

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)

## Modeling

Model discrete systems with data-flow equations

Model physical systems with Ordinary Differential Equations (ODEs)

$$\dot{\mathbf{y}}(t) = f(t, \mathbf{y})$$

instantaneous derivatives variables

$$\mathbf{y}(0) = \mathbf{y}_i$$

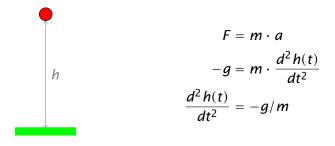
#### (Causal) First-order ODEs

 Causal: inputs on right, outputs on left

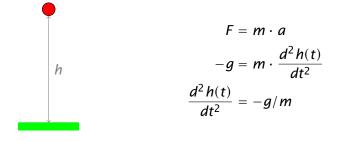
 First-order: one equation = one variable

h

 $F = m \cdot a$  $-g = m \cdot \frac{d^2 h(t)}{dt^2}$  $\frac{d^2 h(t)}{dt^2} = -g/m$ 

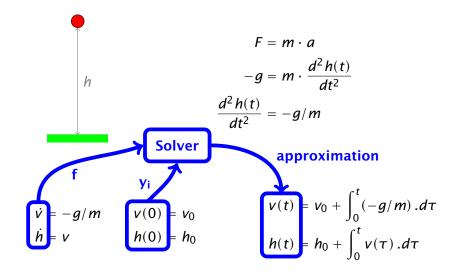


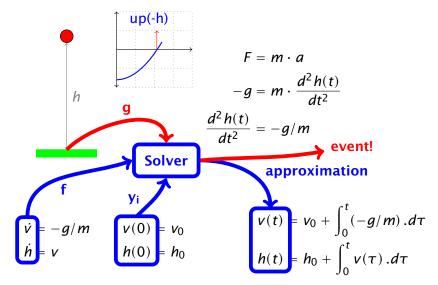
$$\dot{v} = -g/m$$
  $v(0) = v_0$   
 $\dot{h} = v$   $h(0) = h_0$ 



 $\dot{v} = -g/m$   $v(0) = v_0$   $v(t) = \dot{h}$  $\dot{h} = v$   $h(0) = h_0$   $h(t) = \dot{h}$ 

$$v(t) = v_0 + \int_0^t (-g/m) . d\tau$$
$$h(t) = h_0 + \int_0^t v(\tau) . d\tau$$





 $\rightarrow t$ 

→ t



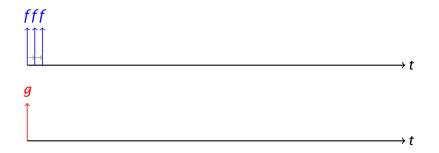
→t

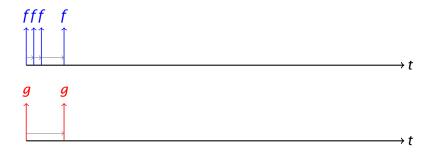


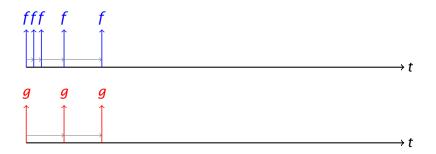
→ t



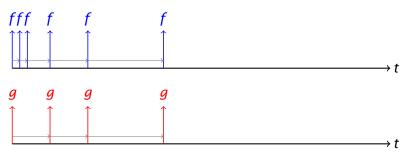
→t

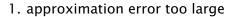


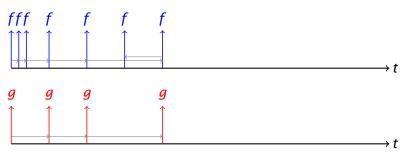




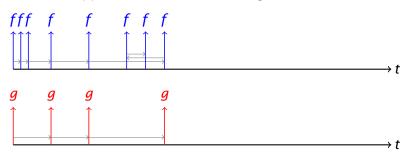
1. approximation error too large

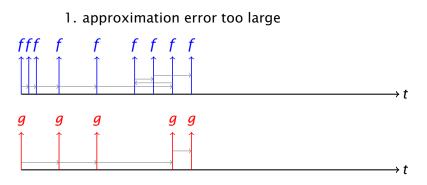


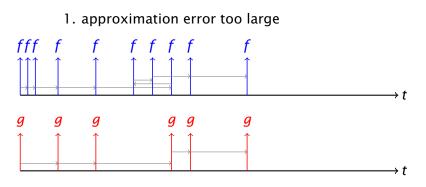


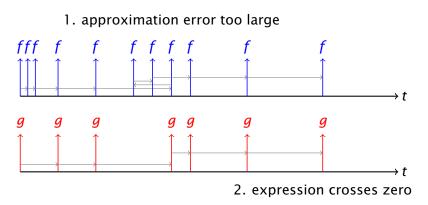


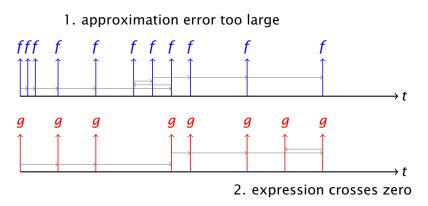
1. approximation error too large

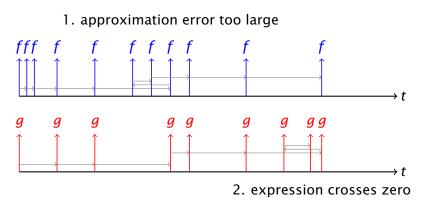


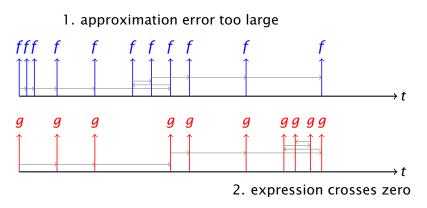


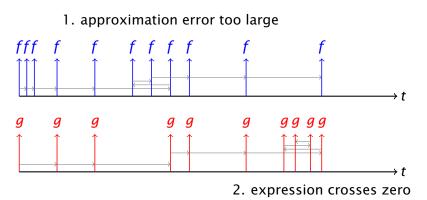












- Bigger and bigger steps (bound by  $h_{min}$  and  $h_{max}$ )
- t does not necessarily advance monotonically
  - Ok for continuous states (managed by solver)
  - Cannot change state within f or g

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

$$\dot{\mathbf{x}}(t) = f(t, \mathbf{x})$$
instantaneous
derivatives
$$\dot{\mathbf{x}}(0) = \mathbf{x}_i$$
initial values

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

$$\dot{\mathbf{x}}(t) = f(t, \mathbf{x})$$
instantaneous
derivatives
$$\dot{\mathbf{x}}(0) = \mathbf{x}_i$$
initial values

Rather than  $\dot{x} = e_d$  and  $x(0) = x_i$ , write

der 
$$x = e_d$$
 init  $x_i$ 

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

$$\dot{\mathbf{x}}(t) = f(t, \mathbf{x})$$
instantaneous
derivatives
$$\begin{aligned} \mathbf{x}(0) &= \mathbf{x}_i \\ \mathbf{x}(0) &=$$

Rather than  $\dot{x} = e_d$  and  $x(0) = x_i$ , write

der  $x = e_d$  init  $x_i$  reset  $e_1$  every  $up(e_{z_1})$ 

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

$$\dot{\mathbf{x}}(t) = f(t, \mathbf{x})$$
instantaneous
derivatives
$$\mathbf{x}(0) = \mathbf{x}_i$$
initial values

Rather than  $\dot{x} = e_d$  and  $x(0) = x_i$ , write

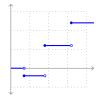
der 
$$x = e_d$$
 init  $x_i$  reset  $e_1$  every  $up(e_{z_1})$   
 $\cdots$   $| e_n$  every  $up(e_{z_n})$ 

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

$$\dot{\mathbf{x}}(t) = f(t, \mathbf{x})$$
instantaneous
derivatives
$$\dot{\mathbf{x}}(0) = \mathbf{x}_i$$
initial values

Rather than  $\dot{x} = e_d$  and  $x(0) = x_i$ , write

der 
$$x = e_d$$
 init  $x_i$  reset  $e_1$  every  $up(e_{z_1})$   
 $\cdots$   $| e_n$  every  $up(e_{z_n})$ 



x = (pre h + 1) every up(e) init  $e_i$ 

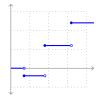
h

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

$$\dot{\mathbf{x}}(t) = f(t, \mathbf{x})$$
instantaneous
derivatives
$$\begin{aligned} \mathbf{x}(0) = \mathbf{x}_i \\ \mathbf{x}(0) = \mathbf{x}_i \\ \mathbf{x}(0) = \mathbf{x}_i \end{aligned}$$

Rather than  $\dot{x} = e_d$  and  $x(0) = x_i$ , write

der 
$$x = e_d$$
 init  $x_i$  reset  $e_1$  every  $up(e_{z_1})$   
 $\cdots$   $| e_n$  every  $up(e_{z_n})$ 



x = (pre h + 1) every up(e)init  $e_i$ 

purely sync every event

d

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

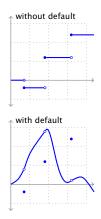
$$\dot{\mathbf{x}}(t) = f(t, \mathbf{x})$$
instantaneous
derivatives
$$\begin{aligned} \mathbf{x}(0) = \mathbf{x}_i \\ \text{initial values} \end{aligned}$$

Rather than  $\dot{x} = e_d$  and  $x(0) = x_i$ , write

der 
$$x = e_d$$
 init  $x_i$  reset  $e_1$  every  $up(e_{z_1})$   
 $\cdots$   $| e_n$  every  $up(e_{z_n})$ 

x = (pre h + 1) every up(e) default  $e_c$  init  $e_i$ 





# Basic Hybrid Language

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

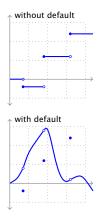
$$\dot{\mathbf{x}}(t) = f(t, \mathbf{x})$$
instantaneous
derivatives
$$variables$$
initial values

Rather than  $\dot{x} = e_d$  and  $x(0) = x_i$ , write

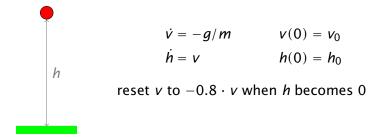
der 
$$x = e_d$$
 init  $x_i$  reset  $e_1$  every  $up(e_{z_1})$   
 $\cdots$   $| e_n$  every  $up(e_{z_n})$ 

x = (pre h + 1) every up(e) default  $e_c$  init  $e_i$ | purely sync every event

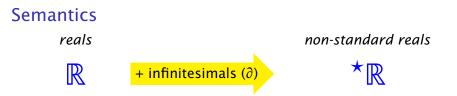
Very simple: no clocks, no automata, no higher-order

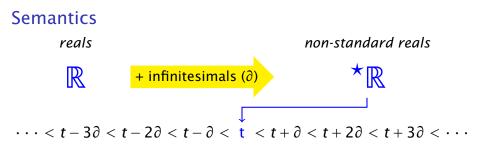


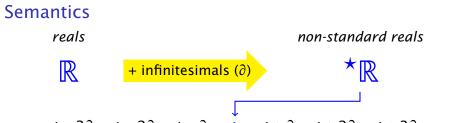
# Bouncing ball



```
let hybrid ball () =
   let
   rec der v = (-. g / m) init v0
        reset (-. 0.8 *. last v) every up(-. h)
   and der h = v init h0
   in (v, h)
```



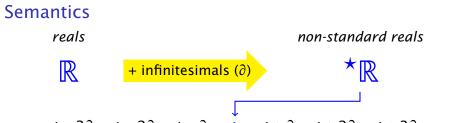




 $\cdots < t - 3\partial < t - 2\partial < t - \partial < t < t + \partial < t + 2\partial < t + 3\partial < \cdots$ 

- dense and discrete
- base clock for both continuous and discrete behaviors
- ▶  $\forall t$ . •*t* is the previous instant, *t* is the next instant

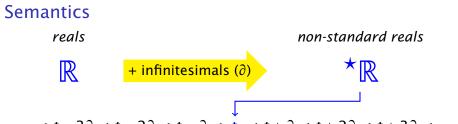
$integr^{\#}(T)(s)(s_{0})(hs)(t) s'(t) s'(t) s'(t)$	=		where if $t = \min(T)$ if $handler^{\#}(T)(hs)(t) = NoEvent$ if $handler^{\#}(T)(hs)(t) = Xcrossing(v)$
$up^{\#}(T)(s)(t)$ $up^{\#}(T)(s)(t^{\bullet})$ $up^{\#}(T)(s)(t^{\bullet})$	=	false true false	if $t = \min(T)$ if $(s(^{\bullet}t) \le 0) \land (s(t) > 0)$ and $(t \in T)$ otherwise



 $\cdots < t - 3\partial < t - 2\partial < t - \partial < t \ < t + \partial < t + 2\partial < t + 3\partial < \cdots$ 

- dense and discrete
- base clock for both continuous and discrete behaviors
- ▶  $\forall t$ . •*t* is the previous instant, *t* is the next instant

$$\begin{array}{rcl} integr^{\#}(T)(s)(s_{0})(hs)(t) &=& s'(t) & \text{where} \\ s'(t) &=& s_{0}(t) & \text{if } t = \min(T) \\ s'(t) &=& s'(\overset{\bullet}{t}) + \partial s(\overset{\bullet}{t}) & \text{if } handler^{\#}(T)(hs)(t) = NoEvent \\ s'(t) &=& v & \text{if } handler^{\#}(T)(hs)(t) = Xcrossing(v) \\ up^{\#}(T)(s)(t) &=& \text{false} & \text{if } t = \min(T) \\ up^{\#}(T)(s)(\overset{\bullet}{t}) &=& \text{true} & \text{if } (s(\overset{\bullet}{t}) \leq 0) \land (s(t) > 0) \text{ and } (t \in T) \\ up^{\#}(T)(s)(\overset{\bullet}{t}) &=& \text{false} & \text{otherwise} \end{array}$$



 $\cdots < t - 3\partial < t - 2\partial < t - \partial < t < t + \partial < t + 2\partial < t + 3\partial < \cdots$ 

- dense and discrete
- base clock for both continuous and discrete behaviors
- ▶  $\forall t$ . •*t* is the previous instant, *t* is the next instant

$$integr^{\#}(T)(s)(s_{0})(hs)(t) = s'(t) \quad \text{where}$$

$$s'(t) = s_{0}(t) \quad \text{if } t = \min(T)$$

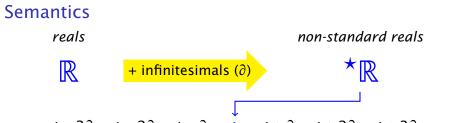
$$s'(t) = s'(\bullet, t) + \partial s(\bullet, t) \quad \text{if } handler^{\#}(T)(hs)(t) = NoEvent$$

$$s'(t) = v \quad \text{if } handler^{\#}(T)(hs)(t) = Xcrossing(v)$$

$$up^{\#}(T)(s)(t) = \text{false} \quad \text{if } t = \min(T)$$

$$up^{\#}(T)(s)(t^{\bullet}) = \text{true} \quad \text{if } (s(\bullet, t) \le 0) \land (s(t) > 0) \text{ and } (t \in T)$$

$$up^{\#}(T)(s)(t^{\bullet}) = \text{false} \quad \text{otherwise}$$



 $\cdots < t - 3\partial < t - 2\partial < t - \partial < t \ < t + \partial < t + 2\partial < t + 3\partial < \cdots$ 

- dense and discrete
- base clock for both continuous and discrete behaviors
- ▶  $\forall t$ . •*t* is the previous instant, *t* is the next instant

$$integr^{\#}(T)(s)(s_{0})(hs)(t) = s'(t) \quad \text{where}$$

$$s'(t) = s_{0}(t) \quad \text{if } t = \min(T)$$

$$s'(t) = s'(^{\bullet}t) + \partial s(^{\bullet}t) \quad \text{if } handler^{\#}(T)(hs)(t) = NoEvent$$

$$s'(t) = v \quad \text{if } handler^{\#}(T)(hs)(t) = Xcrossing(v)$$

$$up^{\#}(T)(s)(t) = \text{false} \quad \text{if } t = \min(T)$$

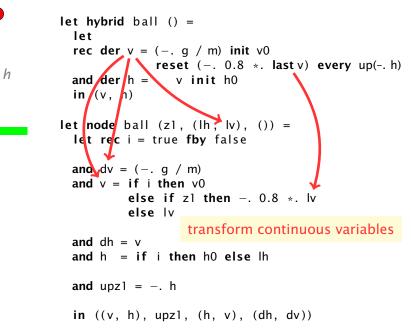
$$up^{\#}(T)(s)(t^{\bullet}) = \text{true} \quad \text{if } (s(^{\bullet}t) \le 0) \land (s(t) > 0) \text{ and } (t \in T)$$

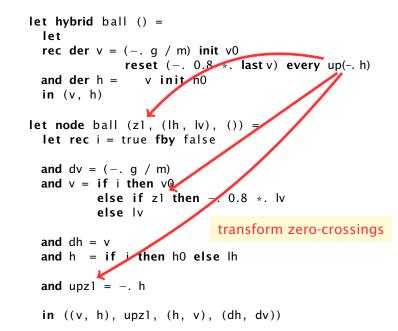
$$up^{\#}(T)(s)(t^{\bullet}) = \text{false} \quad \text{otherwise}$$

```
let hybrid ball () =
    let
    rec der v = (-. g / m) init v0
        reset (-. 0.8 *. last v) every up(-. h)
    and der h = v init h0
    in (v, h)
```

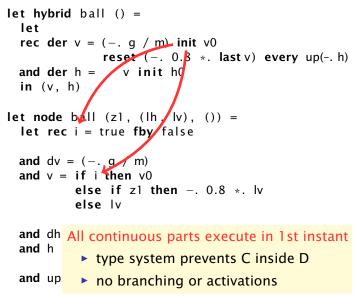
```
let hybrid ball () =
 let
  rec der v = (-, g / m) init v0
              reset (-. 0.8 *. \text{ last v}) every up(-. h)
 and der h = v init h0
 in (v, h)
let node ball (z_1, (lh, lv), ()) =
 let rec i = true fby false
 and dv = (-, g / m)
 and v = if i then v0
          else if z1 then -. 0.8 *. lv
          else Iv
 and dh = v
 and h = if i then h0 else lh
 and upz1 = -. h
 in ((v, h), upz1, (h, v), (dh, dv))
```

```
let hybrid ball () =
  let /
  rec der v = (-, g / m) init v0
              reset (-. 0.8 *. \text{ last v}) every up(-. h)
 and der h = v init h0
 in (v, h)
let node ball (z_1, (lh, lv), ()) =
 let rec i = true fby false
 and dv = (-, g / m)
 and v = if i then v0
          else if z1 then -. 0.8 *. lv
          else Iv
                    transform into discrete subset
 and dh = v
 and h = if i then h0 else lh
 and upz1 = -. h
 in ((v, h), upz1, (h, v), (dh, dv))
```



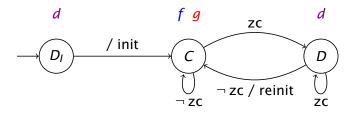


h



in ((v, h), upz1, (h, v), (dh, dv))

## **Execution (Simulation)**



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



#### This compilation/execution scheme only works for some programs!



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 (D) only
  - continuous evolutions in (C) only



#### 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 (D) only
  - continuous evolutions in (C) only
- Reject unreasonable programs
  - where behavior depends 'too much' on simulation parameters (like the step size, or number of iterations)

#### **Typing** Unreasonable programs

der y = 1.0 init 0.0 and x = 
$$(0.0 \rightarrow pre x) + y$$

 $x = 0.0 \rightarrow (pre x + .1.0)$  and der y = x init 0.0

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

## The type language

$$bt ::= float | int | bool | zero$$
  

$$t ::= bt | t \times t | \beta$$
  

$$\sigma ::= \forall \beta_1, ..., \beta_n. t \xrightarrow{k} t$$
  

$$k ::= D | C | A$$



## The type language

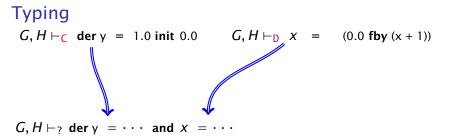
$$\begin{array}{rcl} bt & ::= & \texttt{float} \mid \texttt{int} \mid \texttt{bool} \mid \texttt{zero} \\ t & ::= & bt \mid t \times t \mid \beta \\ \sigma & ::= & \forall \beta_1, ..., \beta_n. t \xrightarrow{k} t \\ k & ::= & \mathsf{D} \mid \mathsf{C} \mid \mathsf{A} \end{array}$$

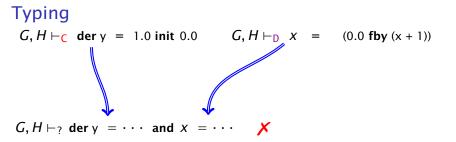


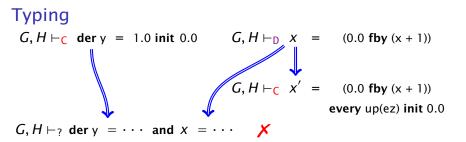
#### Initial conditions

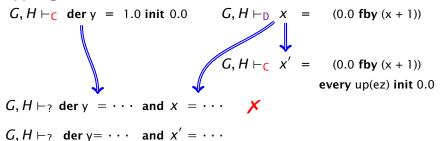
$$\begin{array}{rcl} (+) & : & \operatorname{int} \times \operatorname{int} \xrightarrow{A} \operatorname{int} \\ (=) & : & \forall \beta.\beta \times \beta \xrightarrow{A} \operatorname{bool} \\ \operatorname{if} & : & \forall \beta.\operatorname{bool} \times \beta \times \beta \xrightarrow{A} \beta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

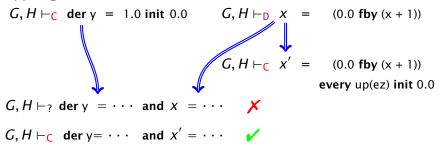
**Typing**  $G, H \vdash_{\mathsf{C}} \mathsf{der y} = 1.0 \mathsf{ init } 0.0$   $G, H \vdash_{\mathsf{D}} x = (0.0 \mathsf{ fby } (x + 1))$ 

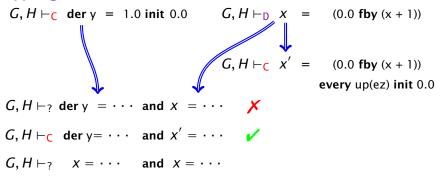


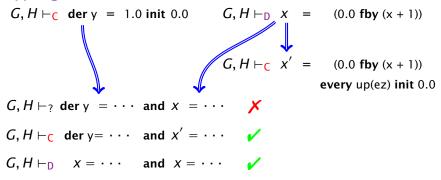


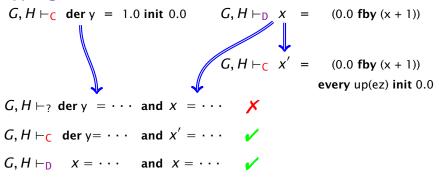












Typing of function body gives its kind  $k \in \{C, D, A\}$ :

$$h: float \times float \xrightarrow{k} float \times float$$

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

 $j: (float_D) \times (float_C) \longrightarrow (float_D) \times (float_C)$ 

# 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
  - Recycle existing compilers
- Execution
  - Simulate using Sundials CVODE solver

# 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
  - Recycle existing compilers
- Execution
  - Simulate using Sundials CVODE solver

# 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
  - Recycle existing compilers
- Execution
  - Simulate using Sundials CVODE solver

#### Ocaml Sundials CVODE interface and compiler available