

# Functional Hybrid Modeling from an Object-Oriented Perspective

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# Background (1)

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- **Yampa** is an instance of FRP embedded in Haskell.
- One central idea: **first-class** reactive components (or models):
  - enables highly structurally dynamic systems to be described declaratively;
  - opens up for meta-modelling without additional language layers.

# Background (2)

- Additional interesting aspects:
  - full power of a modern functional language available;
  - polymorphic type system;
  - well-understood underlying semantics.

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# Functional Hybrid Modelling (1)

- Our goal with **Functional Hybrid Modelling** (FHM) is to combine an FRP-approach with non-causal modelling yielding:
  - a powerful, fully-declarative, non-causal modelling language supporting highly structurally dynamic systems;
  - a semantic framework for studying modelling and simulation languages supporting structural dynamism.



# Functional Hybrid Modelling (2)

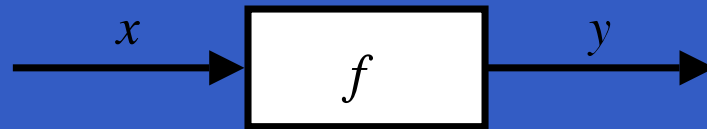
- The idea of FHM goes back a few years (PADL 2003). UK research funding (EPSRC) secured very recently. Thus still work in very early stages.

# The Rest of the Talk

- A brief introduction to FRP/Yampa as a background.
- Sketch the key ideas of how this may be generalized to a non-causal setting.

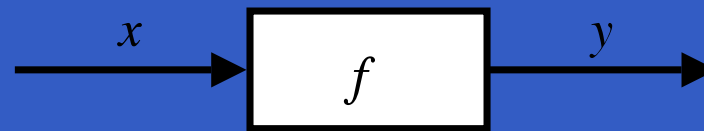
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Intuition:

Signal  $\alpha \approx \text{Time} \rightarrow \alpha$

$x :: \text{Signal } T1$

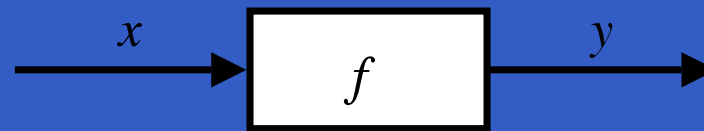
$y :: \text{Signal } T2$

**SF**  $\alpha \beta \approx \text{Signal } \alpha \rightarrow \text{Signal } \beta$

$f :: \text{SF } T1 \ T2$

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Additionally, **causality** required: output at time  $t$  must be determined by input on interval  $[0, t]$ .

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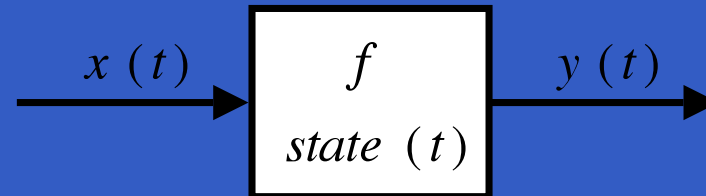
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Signal functions can encapsulate *state*.

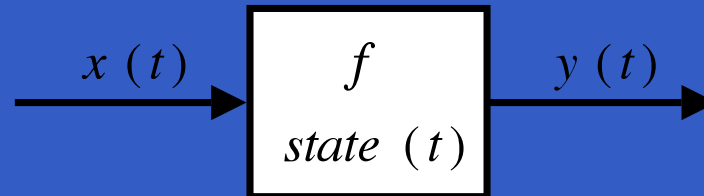


$state(t)$  summarizes input history  $x(t')$ ,  $t' \in [0, t]$ .

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From this perspective, signal functions are:

- **stateful** if  $y(t)$  depends on  $x(t)$  and  $state(t)$
- **stateless** if  $y(t)$  depends only on  $x(t)$

Integral is an example of a stateful signal function.



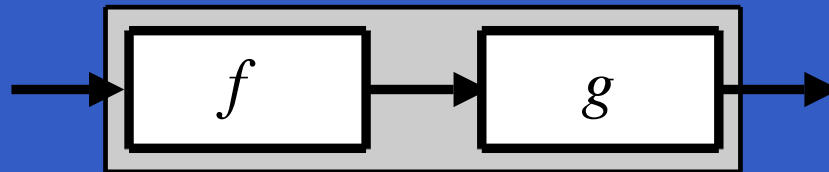
# Programming with signal functions

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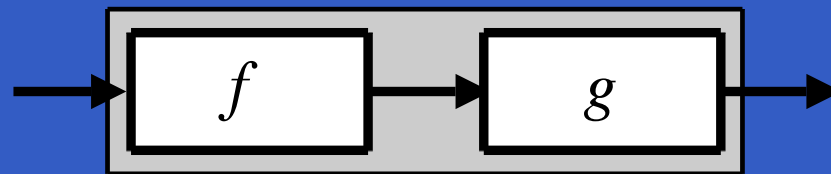
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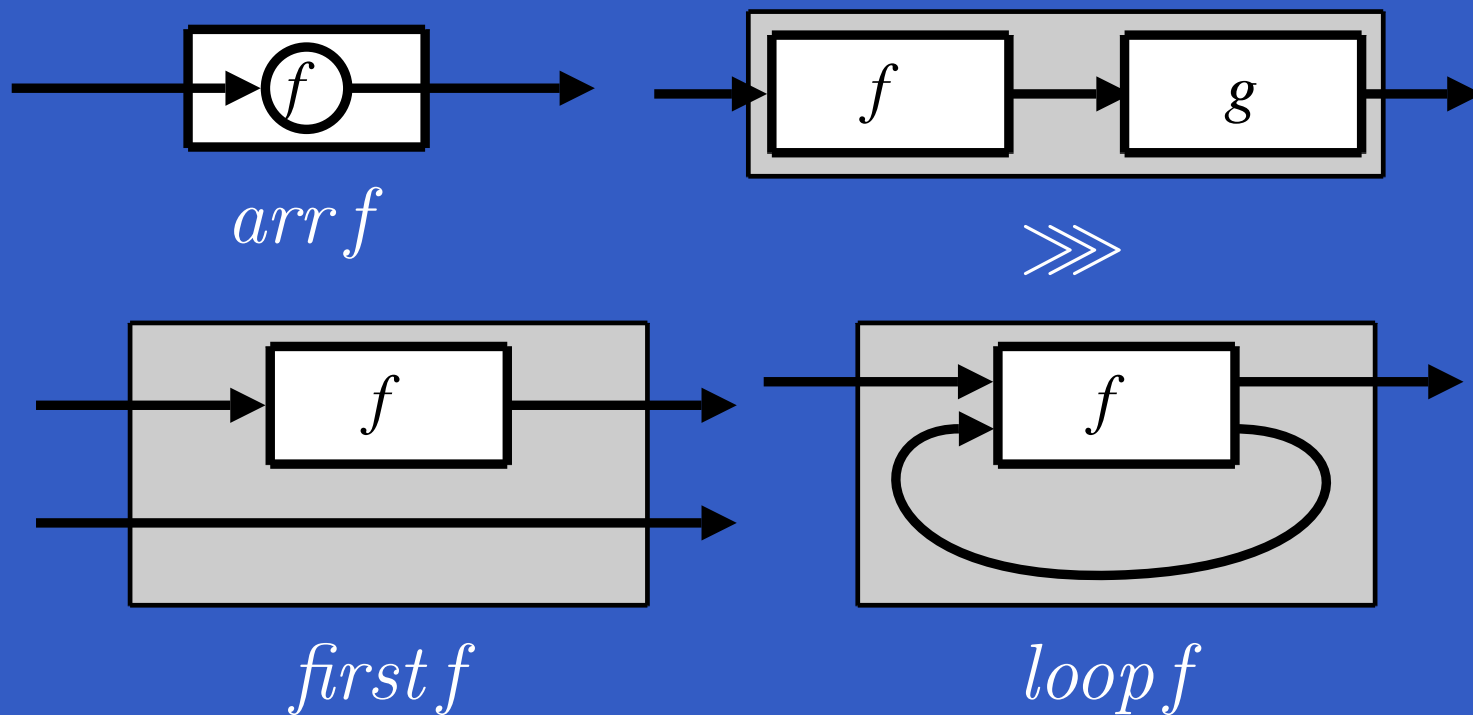
A *combinator* can be defined that captures this:

$$(\ggg) :: SF\ a\ b \rightarrow SF\ b\ c \rightarrow SF\ a\ c$$

Note: plain function operating on first-class signal function.

# The Arrow framework (1)

These diagrams convey the general idea:

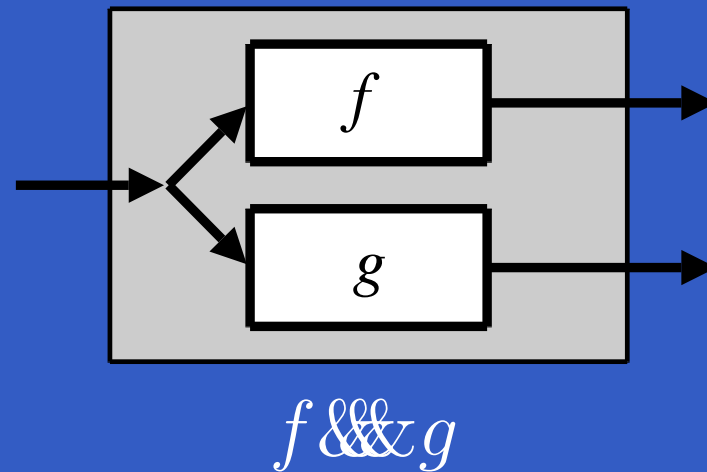
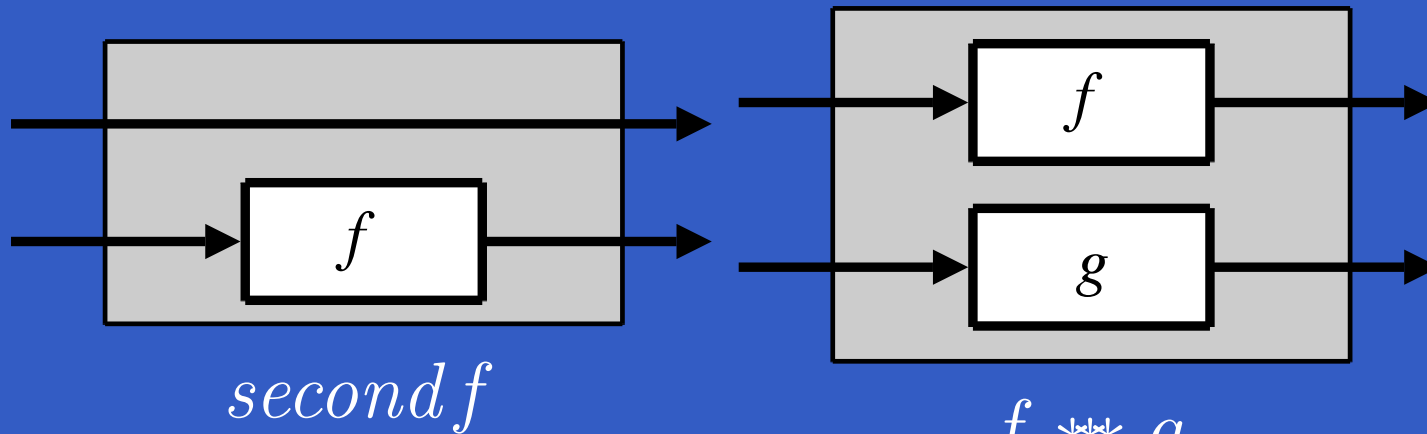


$$first :: SF\ a\ b \rightarrow SF\ (a, c)\ (b, c)$$

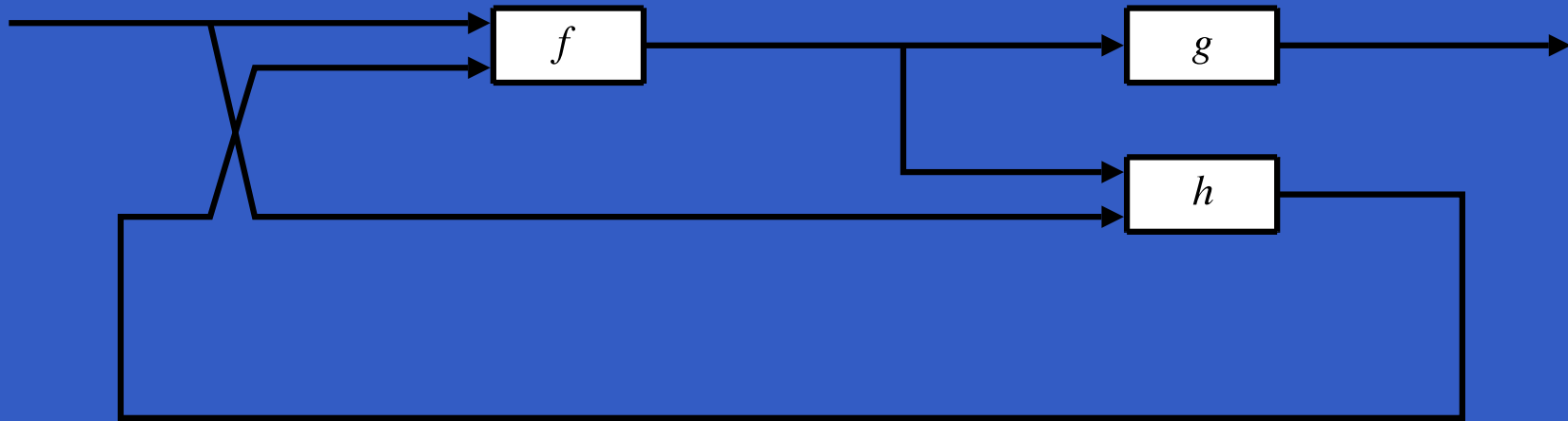
$$loop :: SF\ (a, c)\ (b, c) \rightarrow SF\ a\ b$$

# The Arrow framework (2)

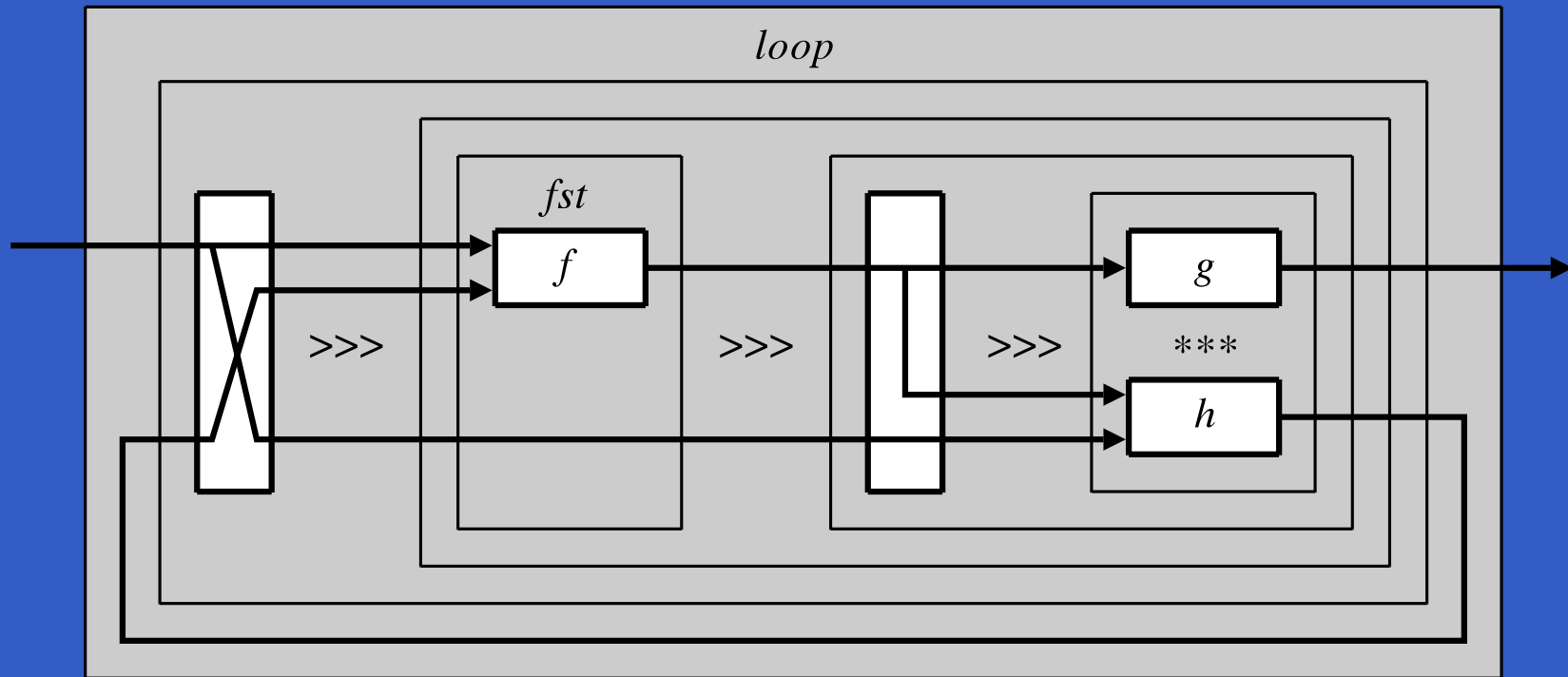
Some derived combinators:



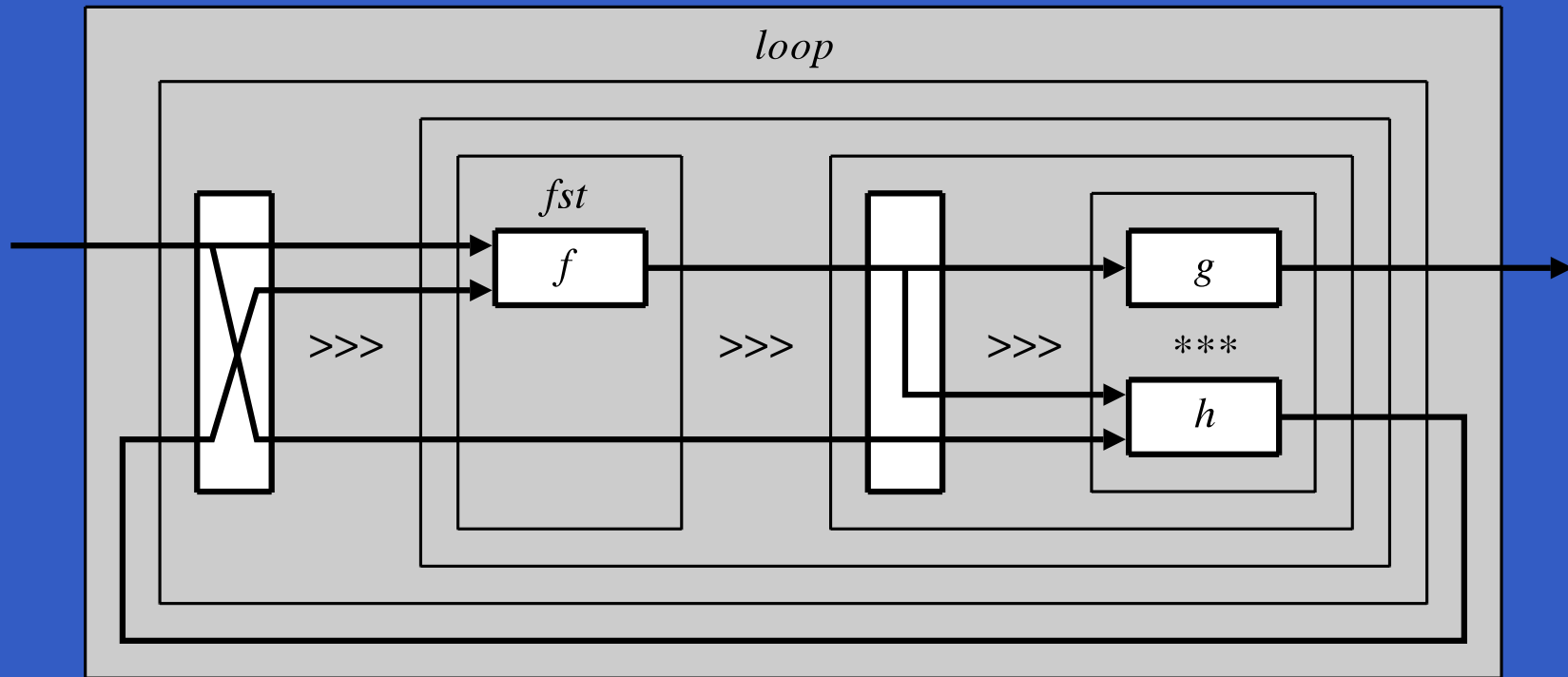
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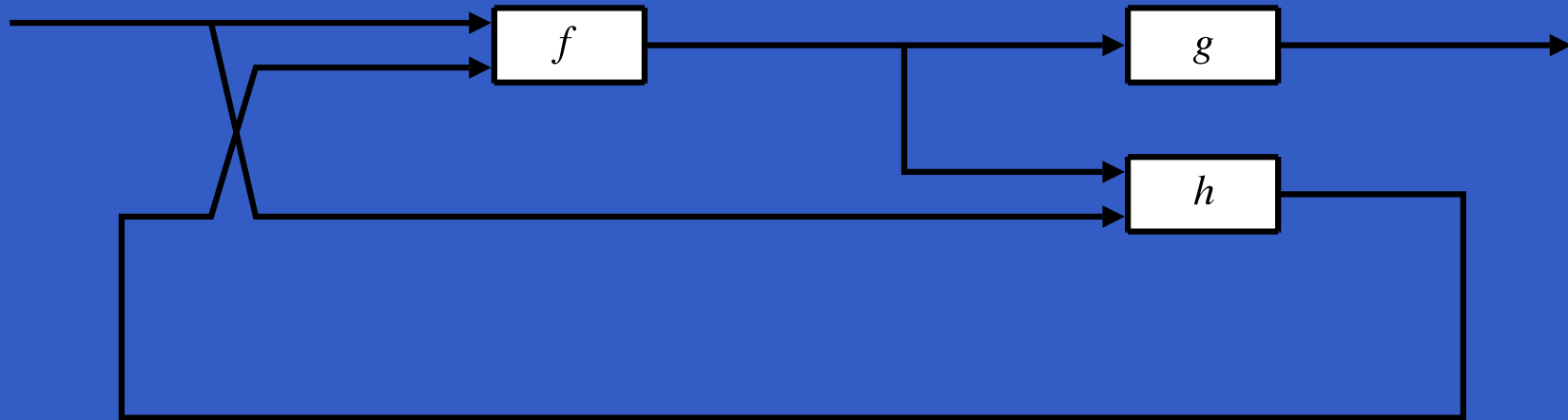
$loop (arr (\lambda(x, y) \rightarrow ((x, y), x)))$

$\ggg (fst f$

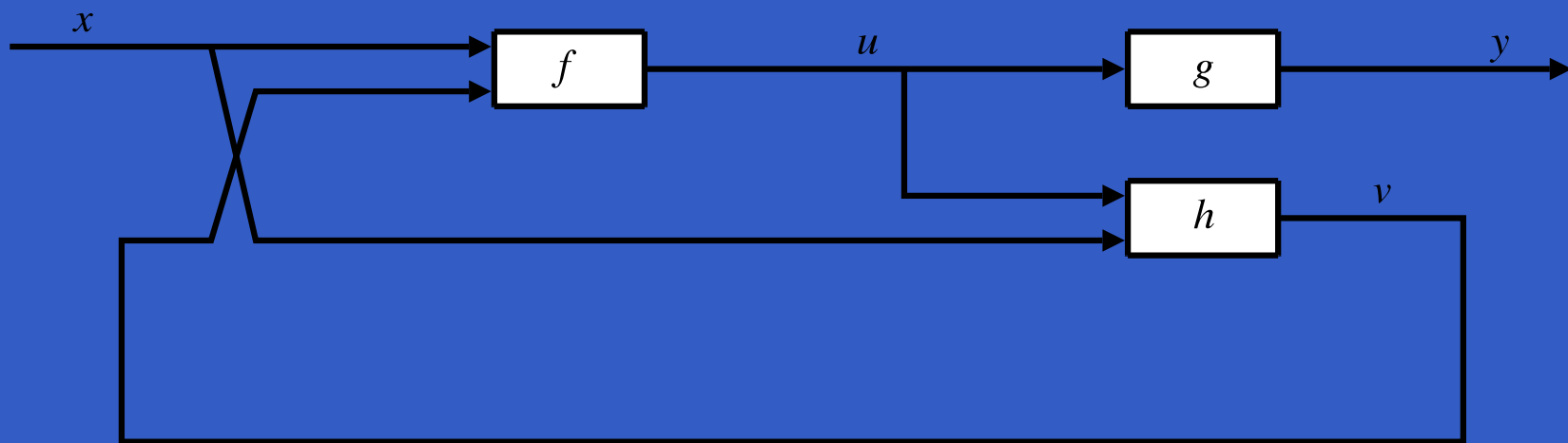
$\ggg (arr (\lambda(x, y) \rightarrow (x, (x, y))) \ggg (g ** h))))$



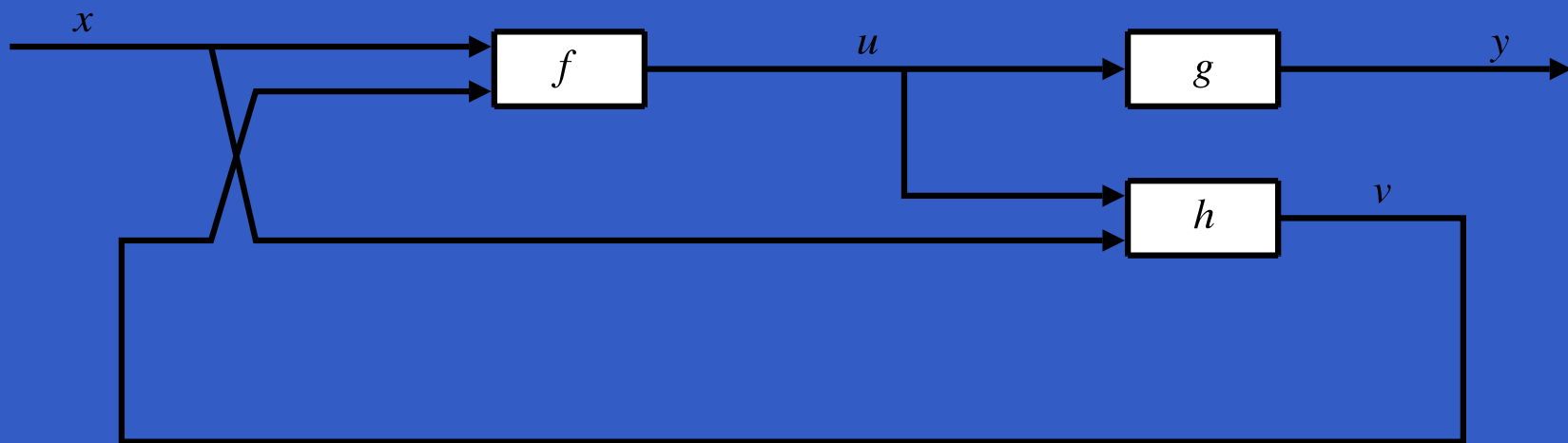
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`proc  $x \rightarrow$  do`

`rec`

`$u \leftarrow f \multimap (x, v)$`

`$y \leftarrow g \multimap u$`

`$v \leftarrow h \multimap (u, x)$`

`return  $A \multimap y$`

# Switching

Some switching combinators:

- $switch :: SF\ a\ (b, Event\ c) \rightarrow (c \rightarrow SF\ a\ b) \rightarrow SF\ a\ b$
- $pSwitchB :: Functor\ col \Rightarrow col\ (SF\ a\ b) \rightarrow SF\ (a, col\ b)\ (Event\ c) \rightarrow (col\ (SF\ a\ b) \rightarrow c \rightarrow SF\ a\ (col\ b)) \rightarrow SF\ a\ (col\ b)$

# What makes Yampa different?

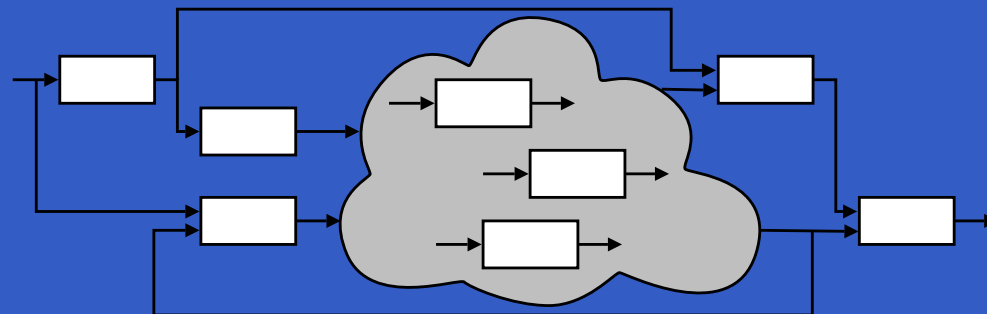
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- First class reactive components (signal functions).
- Supports hybrid (mixed continuous and discrete time) systems: option type *Event* represents discrete-time signals.
- Supports dynamic system structure through ***switching combinators***:



# Example: Space Invaders





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Same conceptual structure as Yampa, but:

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- Employ state-of-the-art symbolic and numerical methods for sound and efficient simulation.

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Same conceptual structure as Yampa, but:

- First-class *relations* on signals instead of functions on signals to enable non-causal modeling.
- Employ state-of-the-art symbolic and numerical methods for sound and efficient simulation.
- Adapted switch constructs.

# First class signal relations

The type for a relation on a signal of type `Signal  $\alpha$` :

`SR  $\alpha$`

Specific relations use a more refined type; e.g. the derivative relation:

`der :: SR (Real, Real)`

Since a signal carrying pairs is isomorphic to a pair of signals, *der* can be understood as a binary relation on two signals.

# Defining relations

The following tentative construct denotes a signal relation:

**sigrel** *pattern* **where** *equations*

The pattern introduces *signal variables* which at each point in time are going to be bound to to a “sample” of the corresponding signal.

Given  $p :: t$ , we have:

**sigrel**  $p$  **where** ...  $:: SR t$

# Equations

Let  $e_i :: t_i$  be non-relational expressions possibly introducing new signal variables.

Point-wise equality; the equality must hold for all points in time:

$$e_1 = e_2$$

Relation “application”; the relation must hold for all points in time:

$$sr \diamond e_3$$

Here,  $sr$  is an **expression** having type  $SR\ t_3$ .

# Equations: examples

Consider a differential equation like  $x' = f(x, y)$ .  
This equation could be written:

$$\text{der} \diamond (x, f(x, y))$$

For convenience, ***syntactic sugar*** closer to standard mathematical notation could be considered:

$$\text{der}(x) = f(x, y)$$

Here, **der** is ***not*** a pure function operating only on instantaneous signal values since it depends on the history of the signal.



# Modeling electrical components (1)

The type `Pin` is assumed to be a record type describing an electrical connection. It has fields  $v$  for voltage and  $i$  for current.

$twoPin :: SR (Pin, Pin, Voltage)$

$twoPin = \mathbf{sigrel} (p, n, v) \mathbf{where}$

$$v = p.v - n.v$$

$$p.i + n.i = 0$$

# Modeling electrical components (2)

*resistor* :: Resistance  $\rightarrow$  SR (Pin, Pin)

*resistor*( $r$ ) = **sigrel** ( $p, n$ ) **where**

*twoPin*  $\diamond$  ( $p, n, v$ )

$r \cdot p.i = v$

*inductor* :: Inductance  $\rightarrow$  SR (Pin, Pin)

*inductor*( $l$ ) = **sigrel** ( $p, n$ ) **where**

*twoPin*  $\diamond$  ( $p, n, v$ )

$l \cdot \mathbf{der}(p.i) = v$

# Modeling electrical components (3)

$capacitor :: \text{Capacitance} \rightarrow \text{SR}(\text{Pin}, \text{Pin})$

$capacitor(c) = \mathbf{sigrel}(p, n) \mathbf{where}$

$twoPin \diamond (p, n, v)$

$c \cdot \mathbf{der}(v) = p.i$

# Modeling an electrical circuit (1)

*simpleCircuit* :: SR Current

*simpleCircuit* = **sigrel** i where

*resistor*(1000)  $\diamond$  (*r1p*, *r1n*)

*resistor*(2200)  $\diamond$  (*r2p*, *r2n*)

*capacitor*(0.00047)  $\diamond$  (*cp*, *cn*)

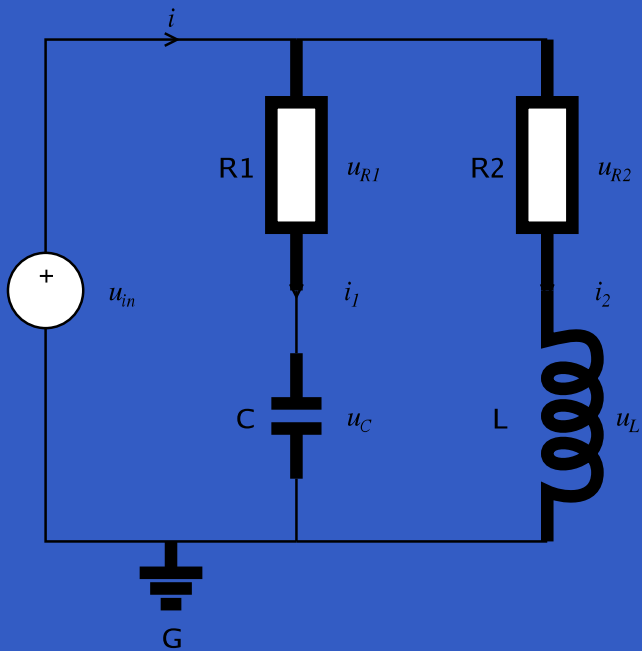
*inductor*(0.01)  $\diamond$  (*lp*, *ln*)

*vSourceAC*(12)  $\diamond$  (*acp*, *acn*)

*ground*  $\diamond$  *gp*

...

# Modeling an electrical circuit (2)



...

**connect**  $acp, r1p, r2p$

**connect**  $r1n, cp$

**connect**  $r2n, lp$

**connect**  $acn, cn, ln, gp$

$i = r1p.i + r2p.i$

# Central Research Questions

- Adapting Yampa's switching constructs, including handling initialization issues.

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- Adapting non-causal modelling and simulation methods to a setting with first class signal relations: causality analysis, symbolic processing code generation after each switch.
- Guaranteeing compositional correctness statically through the type system to the extent possible; e.g. employing dependent types to keep track of variable/equation balance.