Stateful synchronous dataflow language. Harnessing distributive laws of a comonad over a monad.

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#### Motivations

Dataflow language are very popular for high level programming. *Lustre, Esterel, Signal, Circuits, ...* 

Hybrid language to integrate stateful computations. *Modes, automata, control, ...* 

Can we define a stateful dataflow language, that merges both? *Consequence for compilation, hands-on memory, ...* 

What are stateful synchronous dataflow programs?

Non-Stateful Synchronous dataflow programs

nats := 0 fby (1 + nats) Input: tt, tt, tt, tt, tt, ... Output: 0, 1, 2, 3, 4, ... What are stateful synchronous dataflow programs?

Non-Stateful Synchronous dataflow programs

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Stateful synchronous dataflow programs

nats := let x = (read 0) in (write 0 (1 + x)); x

Memory at address 0 initialized to 0. Input: tt, tt, tt, tt, tt, ... Output: 0, 1, 2, 3, 4, ...

firstOccurrence

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s = []













#### Semantics

What semantics for such stateful dataflow programs?

Our requirements:

- denotational (make use of Coq for proofs)
- compositional (nicer, and makes proofs easier)

#### **Semantics**

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Prior investigations of Uustalu and Vene.

Denotational and compositional semantics for Lustre (synchronous dataflow language): dataflow primitives are morphisms in a Kleisli category, i.e.,

$$f: W A \to M B$$

where W is a comonad and M is a monad.

#### Dataflow with comonad

Comonad for compositional context:

$$\frac{f: W A \to B \quad g: W B \to C}{??: W A \to C}$$

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$$\frac{f^{\dagger}: W \land A \to W \land B \qquad g: W \land B \to C}{g \circ f^{\dagger}: W \land A \to C}$$

#### Dataflow with comonad

Comonad for compositional context:

$$\frac{f^{\dagger}: W \land A \to W \land B}{g \circ f^{\dagger}: W \land A \to C} g : W \land B \to C$$

Example on the non-empty list (NEList) comonad.

| $x\mapsto 1$ |   | $x \mapsto sum x$ |   | $(x\mapsto 1)^\dagger$ |        | $egin{array}{lll} ({\sf x}\mapsto {\sf sum}\;{\sf x})\;\circ\ ({\sf x}\mapsto 1)^{\dagger} \end{array}$ |   |
|--------------|---|-------------------|---|------------------------|--------|---|---|
| [0]          | 1 | [0]               | 0 | [0]                    | [1]    | [0]   | 1 |
| [1]          | 1 | [1]               | 1 | [1]                    | [1]    | [1]   | 1 |
| [0, 0]       | 1 | [0, 0]            | 0 | [0, 0]                 | [1,1]  | [0,0]   | 2 |
| [0, 1]       | 1 | [0, 1]            | 1 | [0, 1]                 | [1,1]  | [0, 1]  | 2 |
| [1, 0]       | 1 | [1,0]             | 1 | [1, 0]                 | [1, 1] | [1,0]   | 2 |
| [1,1]        | 1 | [1, 1]            | 2 | [1,1]                  | [1, 1] | [1, 1]  | 2 |
|              |   |                   |   |                        |        |   |   |

# Effect with monad

Monads for compositional effects:

$$\frac{f: A \to M B \quad g: B \to M C}{??: A \to M C}$$

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Monads for compositional effects:

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Example on the option monad  $\mathbb{N} + \{\bot\}$ :

$$x \mapsto if (x \mod 3 = 0) and (x \mod 2 = 0)$$
  
then x  
else  $\perp$ 

# Combine dataflow and effects

Composition:

$$\frac{f: W A \to M B}{??: W A \to M C}$$

### Combine dataflow and effects

Composition:

 $\begin{array}{ccc} f: W \ A \to M \ B & g: W \ B \to M \ C \\ f^{\dagger}: W \ A \to W \ M \ B & g^{\star}: M \ W \ B \to M \ C \\ g^{\star} \circ \ \delta \circ f^{\dagger}: W \ A \to M \ C \end{array}$ 

where

- f<sup>†</sup> and g<sup>\*</sup> are reasonable extensions given the comonad W and monad M;
- δ represents the distributive law of the comonad W over the monad M, i.e.,

 $\delta: W \ M \Rightarrow M \ W$ 

with 4 coherence conditions.

### Example for synchronous dataflow.

Uustalu and Vene defined the distributive law:

$$\delta: (\mathbb{N} + \{\bot\})^+ \to \mathbb{N}^+ + \{\bot\}$$

that intuitively acts as:

- if the head of the list is absent (i.e.,  $\perp$ ), return absent;
- otherwise, return the list where all  $\perp$  have been filtered.

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Let

> f := (x → if (head x) mod 2 = 0 then x else ⊥);> g := (x → sum x);

|        | f <sup>†</sup>         | g*      |         | $g^\star \circ \delta \circ f^\dagger$ |         |
|--------|------------------------|---------|---------|--|---------|
| [0]    | [0]                    | $\perp$ | $\perp$ | [0]                                    | 0       |
| [1]    | [⊥]                    | [0]     | 0       | [1]                                    | $\perp$ |
| [0, 0] | [0,0]                  | [1]     | 1       | [0, 0]                                 | 0       |
| [0, 1] | <b>[</b> 0, ⊥ <b>]</b> | [0, 0]  | 0       | [0, 1]                                 | 0       |
| [1, 0] | $[\perp,0]$            | [0, 1]  | 1       | [1, 0]                                 | $\bot$  |
|        |                        |         |         |  |         |

Can we extend to stateful synchronous dataflow?

Main difference with stateless case:

- the option monad is no longer sufficient as their is no notion of states;
- use of a state monad?

# Stateful dataflow: first try

First idea: replace the option monad  $_{-}+\{\bot\}$  with the option state monad  $S \rightarrow (_{-} \times S) + \{\bot\}$ .

But, problem for the distributive law: couldn't find one that satisfies all 4 coherence conditions.

Deadend.. After several attempts, we thought of an alternative.

Let  $\mathbb{C}$  be a category, W a comonad, and M a monad in  $\mathbb{C}$ .

#### Definition (Kleisli Category)

A distributive law of W over M induces a Kleisli category  $\mathbb{C}_{W,M}$ , where:

- ▶ objects are objects in C, and
- ▶ morphisms in  $\mathbb{C}_{W,M}(X, Y)$  are those in  $\mathbb{C}(W X, M Y)$ , i.e., of the form  $W X \to M Y$ .

Composition and identity follow from the Kleisli category.

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#### Definition (Stateful Kleisli Category)

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- ▶ objects are objects in C, and
- morphisms in  $\mathbb{C}^{S}_{W,M}(X, Y)$  are those in  $\mathbb{C}(W(X \times S), M(Y \times S))$ , i.e., of the form  $W(X \times S) \rightarrow M(Y \times S)$ .

Composition and identity follow from the Kleisli category.

Following Uustalu et Vene, we kept the nonempty list comonad  $W = \_^+$  and the option monad  $M = \_ + \{\bot\}$ .

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Lift morphisms to dataflow functions, i.e., operations on streams.

Let  $f : (A \times S)^+ \to (B \times S) + \{\bot\}$  be a morphism in the stateful Kleisli category.

The run operation on f, given  $\sigma \in A^{\omega}$  a stream of inputs in A, and s an initial state, is:

 $\operatorname{run}(f,\sigma,s)\in (B+\{\bot\})^\omega$ 

such that

- f applies to prefixes of σ with an updated state in the non-absent case;
- f applies to prefixes of σ with the same state in the absent case.

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But, problem if absent: some intermediate change of states have been lost!!

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We prove a new distributive law:

$$\delta: (A \times S + E)^+ \to (A \times S)^+ + E$$

where

- if the head is absent, return an exception;
- otherwise return the list where all the exceptions have been filtered.

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The four coherence conditions have been proved in Coq.

We fix the monad to M = -+S. Let  $f : (A \times S)^+ \to (B \times S) + S$  be a morphism in stateful Kleisli category.

Run operation on f with  $\sigma \in A^{\omega}$  a stream of inputs in A, and s an initial state:

$$\operatorname{run}(f,\sigma,s)\in (B+\{\bot\})^\omega$$

such that

f applies to prefixes of σ with an updated state in the non-absent case and in the absent case.

The state is propagated in case of absence!

Examples on some dataflow primitives

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Stateful weak product of two dataflow functions:

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with

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with

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$$g: A \longrightarrow B_2$$

Currying of dataflow function:

scurry 
$$m f : A \longrightarrow (B \longrightarrow C)$$

with

▶ 
$$m: A^+ \times B^+ \to (A \times B)^+$$
  
▶  $f: (A \times B) \longrightarrow C$ 

# Stateful dataflow language (Syntax)

Expressions:

$$\begin{array}{l} e ::= \mathsf{tt} \mid \mathsf{true} \mid \mathsf{false} \mid n \mid e_1 \stackrel{?}{=} e_2 \mid ... \\ e_1 \; ; \; e_2 \mid x \mid \lambda x \cdot e \mid e_1 \; e_2 \mid ... \\ e_1 \; \mathsf{fby} \; e_2 \mid \mathsf{fix} \; n \; e_0 \; e \mid \mathsf{read} \; e \mid \mathsf{write} \; e_1 \; e_2 \end{array}$$

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Example of program:

```
first_occurrence offset :=

\lambda x \cdot

write offset (1 + offset);

if islnList offset x then \perp_{nat}

else

let y = read (1 + offset) in

write y x; write (1 + offset) (1 + y); x
```

# Stateful dataflow language (Semantics)

Fix the state to  $S = \mathbb{N} \to \mathbb{N}$ .

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Semantics for some primitives:

$$\begin{bmatrix} e_1 \stackrel{?}{=} e_2 \end{bmatrix} = \uparrow \stackrel{?}{=} \circ \langle \llbracket e_1 \rrbracket, \llbracket e_2 \rrbracket \rangle$$
  
$$\begin{bmatrix} \text{fix } n \ e_0 \ e \end{bmatrix} = \begin{pmatrix} & \llbracket e_0 \rrbracket & \text{if } n = 0 \\ eval \circ \langle \llbracket e \rrbracket, \ \llbracket \text{fix } (n-1) \ e_0 \ e \rrbracket ) \rangle & \text{otherwise} \end{pmatrix}$$

where

- the equality is applied item-wise on the product ([[e1]], [[e2]]);
- the eval applies the result of the left part of the pair onto the right part.

#### Back to our example

Runnable example in Coq: Compute prefix 6 (run f  $\sigma$   $m_0$ ) = [1;2;  $\perp$ ; 0;  $\perp$ ;  $\perp$ ] Program's property: mix induction (program constructs), and coinduction (program semantics).

ex: bisimulation of the run of nat\_imp and stream of naturals.

Semantics property: show compositionality on runs. The run of the composition of f and g is some form of composition of the run of f and g.

### Conclusion

We presented a denotational and compositional semantics for a Stateful synchronous dataflow language.

We formalized the semantics in Coq, and provide some running examples.