



# Structuring Computations

Radboud University Nijmegen



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No explicit message;  
some type/object-related  
topics that I like;  
and you too, hopefully!

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## Purely functional programs

Writing  $X$  for the type of inputs,  $Y$  for outputs ...

... a functional program from  $X$  to  $Y$  is simply a function

$$X \longrightarrow Y$$

## I. Sneak preview



## Imperative, state-based programs

Writing  $S$  for the type of states ...

... an **imperative** program is:

$$X \times S \longrightarrow Y \times S$$

Or, equivalently,

$$X \longrightarrow (Y \times S)^S$$

Involving the **State Monad**  $Y \longleftarrow (Y \times S)^S$

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## Quantum program

A possible **quantum** program is:

$$X \times X \longrightarrow \text{CmplxNr}^{(Y \times Y)}$$

It is a “superoperator” on “density matrices” (or quantum states)—after Vizotto, Altenkirch, Sabry

It forms an example of an **Arrow**: computations with unit and composition.

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## Reactive, stream-based programs

A **reactive** program is:

$$X^{\mathbb{N}} \longrightarrow Y^{\mathbb{N}}$$

Or, equivalently,

$$X^{\mathbb{N}} \times \mathbb{N} \longrightarrow Y$$

Involving the **Stream Comonad**  $X \longleftarrow X^{\mathbb{N}} \times \mathbb{N}$

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## Overview

- **Functional:**  $X \longrightarrow Y$
- **Imperative:**  $X \longrightarrow T(Y)$ , with  $T$  monad (including Java programs)
- **Reactive:**  $G(X) \longrightarrow Y$ , with  $G$  comonad
- **Quantum:**  $A(X, Y)$ , with  $A$  “arrow”

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## II. Comonads

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### Comonads for computations

- Monads are well-established in functional programming & language semantics
- But little attention for the dual notion of comonad ...
- ... until Uustalu & Vene recently used them for structuring reactive/dataflow programming—building on Brookes & Geva
- **Slogan:** monads structure output, comonads structure input

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### Comonad structure

- **Categorically:** endofunctor  $G: \mathbb{C} \rightarrow \mathbb{C}$  with two natural transformations  $\varepsilon: G \Rightarrow \text{Id}$  and  $\delta: G \Rightarrow G^2$  satisfying standard equations
- **Computationally:** Type operator  $G$  with
  - **coreturn:**  $GX \rightarrow X$
  - **cobind:**  $(GX \rightarrow Y) \rightarrow (GX \rightarrow GY)$
 satisfying suitable equations
- **Logically:** structure for weakening and contraction (like bang ! in linear logic)

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### Comonad example

- Mapping  $X \mapsto X^{\mathbb{N}} \times \mathbb{N}$
- Input streams with past / current / future:
 
$$x_0, x_1, \dots, x_{n-1}, \boxed{x_n}, x_{n+1}, x_{n+2}, \dots$$
- Count / coreturn:  $X^{\mathbb{N}} \times \mathbb{N} \rightarrow X$ 

$$(\alpha, n) \mapsto \alpha(n)$$
- Delta:  $X^{\mathbb{N}} \times \mathbb{N} \rightarrow (X^{\mathbb{N}} \times \mathbb{N})^{\mathbb{N}} \times \mathbb{N}$ 

$$(\alpha, n) \mapsto (\lambda m: \mathbb{N}. (\alpha, m), n)$$

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## coKleisli category of computations

- coKleisli maps  $X^{\mathbb{N}} \times \mathbb{N} \rightarrow Y$  form a category
- Identity via coreturn; composition via delta/cobind
- Gives output in  $Y$  for completely given input stream of  $X$ 's
- Basis for dataflow calculus by Uustalu & Vene  
(like in Lustre, Lucid)

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## Discrete time signals

Three basic **comonads**:

$$\begin{array}{ccccc} X^* \times X & \xleftarrow[\text{no future}]{\text{causality}} & X^{\mathbb{N}} \times \mathbb{N} & \xrightarrow[\text{no past}]{\text{anti-causality}} & X^{\mathbb{N}} \\ (\langle \alpha(0), \dots, \alpha(n-1) \rangle, \alpha(n)) & \longleftarrow & (\alpha, n) & \longleftarrow & \lambda m. \alpha(n+m) \end{array}$$

with “comonad homomorphisms” between them

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## Continuous time signals

Analogue fundamental diagram of **comonads**:

$$\coprod_{t \in [0, \infty)} X^{[0,t)} \times X \quad \xleftarrow{\quad} \quad X^{[0,\infty)} \times [0, \infty) \quad \xrightarrow{\quad} \quad X^{[0,\infty)}$$

where:

$$\coprod_{t \in [0, \infty)} X^{[0,t)} \times X \cong \coprod_{t \in [0, \infty)} X^{[0,t]} \cong X^{[0,1]} \times [0, \infty)$$

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## III. Arrows

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## Arrow overview

- Introduced in Haskell by Hughes in 2000, as common interface extending monads (parser as main example)
- Binary type operation  $A(-, +)$  with three operations: arr,  $\ggg$ , first.
- Folklore claim: Arrows are Freyd categories (Power & Robinson'99)
- Recently substantiated by first describing arrows as **monoids** in a category of bifunctors  $\mathbb{C}^{\text{op}} \times \mathbb{C} \rightarrow \mathbf{Sets}$

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## Arrow in Haskell

Introduced as type class:

```
class Arrow A where
    arr :: (X → Y) → A X Y
    (≫>) :: A X Y → A Y Z → A X Z
    first :: A X Y → A(X, Z)(Y, Z)
```

Which should satisfy 8 equations, such as:

$$\begin{aligned}(a \ggg b) \ggg c &= a \ggg (b \ggg c) \\ a \ggg \text{arr}(1) &= a \\ \text{first}(\text{arr}(f)) &= \text{arr}(f \times 1), \quad \text{etc}\end{aligned}$$

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## Arrow examples

- $(X, Y) \longmapsto (X \rightarrow T(Y))$ , for  $T$  monad
- $(X, Y) \longmapsto (G(X) \rightarrow Y)$ , for  $G$  comonad
- $(X, Y) \longmapsto (X \times X \rightarrow \text{CmplxNr}^{(Y \times Y)})$  for quantum computation
- $(X, Y) \longmapsto (X^{\mathbb{N}} \rightarrow \mathcal{P}(Y^{\mathbb{N}}))$  for “non-deterministic dataflow”
- $(X, Y) \longmapsto (2 \times S^*) \times ((S^* \times X) \rightarrow (1 + (S^* \times Y)))$   
for Swierstra-Duponcheel parser that motivated Hughes

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## Arrows, categorically

- $A$  is functorial: for  $f: X' \rightarrow X$  and  $g: Y \rightarrow Y'$ ,

$$A(X, Y) \xrightarrow{A(f, g)} A(X', Y')$$

$$a \longmapsto \text{arr}(f) \ggg a \ggg \text{arr}(g)$$

- $\text{arr}: (+)^{(-)} \rightarrow A(-, +)$  is natural transformation (natro, for short)
- $\ggg$  is natro  $A \otimes A \rightarrow A$ , for tensor product of distributors / profunctors
- first corresponds to “internal strength”

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## Excuse: monoid in a category

- Standardly, a monoid is a set  $M$  with associative  $m: M \times M \rightarrow M$  and two-sided unit  $e: 1 \rightarrow M$
- Can be formulated in category with finite products  $(1, \times)$ : equations become diagrams
- No projections/diagonals needed: also in monoidal category with  $(I, \otimes)$ . Eg.

$$\begin{array}{ccccc}
 M \otimes M & \xleftarrow{1 \otimes e} & M \otimes I & \xleftarrow{\cong} & M \\
 m \downarrow & & \nearrow & & \downarrow m \\
 M & = & M & = & M
 \end{array}$$

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## Arrows are also monoids

- Arrows are monoids in category of bifunctors  $\mathbb{C}^{\text{op}} \times \mathbb{C} \rightarrow \mathbf{Sets}$
- Tensor  $\otimes$  more complicated, with exponentiation/hom as unit
- Allows for precise comparison with Freyd categories (bijective correspondence)
- Details in Heunen & Jacobs, MFPS'06.



## Excuse: monads are monoids

- The functor category  $\mathbb{C}^{\mathbb{C}}$  is monoidal:
- $$F \otimes G = F \circ G \quad I = \text{Id}$$
- A monoid in  $\mathbb{C}^{\mathbb{C}}$  is a functor  $M: \mathbb{C} \rightarrow \mathbb{C}$  with natros:

$$\begin{array}{ccc}
 M \otimes M & \xrightarrow{\mu} & M \\
 \parallel & & \\
 M \circ M & & 
 \end{array}
 \quad \text{Id} \quad \xleftarrow{\eta}$$

satisfying the monoid equations

- A monoid in  $\mathbb{C}^{\mathbb{C}}$  is precisely a monad!



## Arrows, intuitively

- Most fundamental mathematical structure in computing?
- Monoid  $(A, ;, \text{skip})$  of programs/actions  $A \in \mathbf{Sets}$  with sequential composition
- Adding input and output makes  $A(-, +)$  binary operator
- Hence carrier  $A$  becomes bifunctor  $\mathbb{C}^{\text{op}} \times \mathbb{C} \rightarrow \mathbf{Sets}$
- Keeping the monoid structure leads to Hughes' Arrow



## IV. Monads

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### Java monad

- Definition [Jacobs & Poll'03]:

$$J(X) = (1 + S \times X + S \times E)^S$$

- Combination of state, lift, exception monad
- Actual “abnormal” termination in Java more complicated: exceptions, return, break, continue
- Exception mechanism (plus logic) axiomatised as equaliser by [Schröder & Mossakowski]

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### Monad overview

- Introduced by Moggi (1991), popularised in functional programming by Wadler
- for structuring outputs / computational effects
- Standard examples:
  - lift / maybe  $1 + (-)$
  - exception  $E + (-)$
  - list  $(-)^*$
  - state  $(- \times S)^S$
  - non-determinism  $\mathcal{P}$  (powerset)
  - probability  $\mathcal{D}$  (distribution)

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### Kleisli composition for Java monad

- Kleisli composition for  $J$  is “argument evaluation, before use” (and not sequential composition ; )
- For  $a: X \rightarrow J(Y)$ , and  $p: Y \rightarrow J(Z)$ ,

$$p \bullet a = \lambda x: X. \lambda s: S.$$

CASES  $a x s$  OF

$$\begin{aligned} * &\mapsto * && // \text{non-termination} \\ (s', y) &\mapsto p y s' && // \text{normal termination} \\ (s', e) &\mapsto (s', e) && // \text{except. termination} \end{aligned}$$

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## V. Java program verification (at Nijmegen)

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### JML: Java Modeling Language

JML [Leavens et al.] adds specifications as special comments in Java code, mainly for:

- Class invariants and constraints
- Method specifications:

```
/*@ behavior
@ requires <precondition>
@ assignable <items that may be modified>
@ diverges <precondition for non-termination>
@ ensures <postcond for normal termination>
@ signals <postcond for exceptional
@ termination>
*/
void method() { ... }
```

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### Developments

- **Original focus:** theorem proving for small Java programs (for smart cards)
- **Outcome:**
  - No scaling beyond couple of pages
  - Practical experience, formalisations & deeper theory
- **Shift of focus:**
  - Extension to security properties (esp. confidentiality)
  - Static checking primary, theorem proving secondary

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### JML: example

JML method specifications may clarify the behaviour of Java methods:

```
/*@ normal_behavior
@ requires x >= 0;
@ assignable \nothing;
@ ensures \result * \result <= x &&
@           x < (\result+1) * (\result+1);
*/
int f(int x) {
    int count = 0, sum = 1;
    while (sum <= x) {
        count++;
        sum += 2 * count + 1;
    }
    return count;
}
```

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## LOOP project

- LOOP tool: compiles Java+JML to PVS
- Based on formalised semantics of Java+JML in PVS
- Including Hoare logic (see later) & WP-reasoner  
(all with provably sound rules)
- Used for several non-trivial case studies, but now in “sleep mode”
- Static checking is simply more effective; theorem proving best for difficult left-overs.

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## VI. Static Checking for Java

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## ESC/Java and ESC/Java2

Extended static checker: original ESC/Java by Leino et. al at Compaq, but no longer supported.

- tries to prove correctness of specifications, at compile-time, fully automatically
- not sound, not complete, but finds lots of potential bugs quickly
- Original ESC/Java only supports a (not fully compatible) subset of full JML
- New ESC/Java2 is open source, compatible and handles more (eg. assignable clauses).

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## ESC/Java “demo”

```
class Bag {  
    int[] a;  
    int n;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int minIndex = 0;  
        for (int i = 1; i <= n; i++) {  
            if (a[i] < m) { minIndex = i; m = a[i]; } } }  
        n--;  
        a[minIndex] = a[n];  
        return m;  
    }
```

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## ESC/Java “demo”

```
class Bag {  
    int[] a;  
    int n;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int minIndex = 0;  
        for (int i = 1; i <= n; i++) {  
            if (a[i] < m) { minIndex = i; m = a[i]; } } }  
        n--;  
        a[minIndex] = a[n];  
        return m;  
    }
```

Warning: possible null deference. Plus other warnings

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## ESC/Java “demo”

```
class Bag {  
    int[] a; // @ invariant a != null;  
    int n;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int minIndex = 0;  
        for (int i = 1; i <= n; i++) {  
            if (a[i] < m) { minIndex = i; m = a[i]; } } }  
        n--;  
        a[minIndex] = a[n];  
        return m;  
    }
```

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## ESC/Java “demo”

```
class Bag {  
    int[] a; // @ invariant a != null;  
    int n;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int minIndex = 0;  
        for (int i = 1; i <= n; i++) {  
            if (a[i] < m) { minIndex = i; m = a[i]; } } }  
        n--;  
        a[minIndex] = a[n];  
        return m;  
    }
```

Warning: Array index possibly too large

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## ESC/Java “demo”

```
class Bag {  
    int[] a; // @ invariant a != null;  
    int n; // @ invariant 0 <= n && n <= a.length;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int minIndex = 0;  
        for (int i = 1; i <= n; i++) {  
            if (a[i] < m) { minIndex = i; m = a[i]; } } }  
        n--;  
        a[minIndex] = a[n];  
        return m;  
    }
```

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## ESC/Java “demo”

```
class Bag {  
    int[] a; // @ invariant a != null;  
    int n; // @ invariant 0 <= n && n <= a.length;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int minIndex = 0;  
        for (int i = 1; i <= n; i++) {  
            if (a[i] < m) { minIndex = i; m = a[i]; } } }  
    n--;  
    a[minIndex] = a[n];  
    return m;  
}
```

Warning: Array index possibly too large

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## ESC/Java “demo”

```
class Bag {  
    int[] a; // @ invariant a != null;  
    int n; // @ invariant 0 <= n && n <= a.length;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int minIndex = 0;  
        for (int i = 0; i < n; i++) {  
            if (a[i] < m) { minIndex = i; m = a[i]; } } }  
    n--;  
    a[minIndex] = a[n];  
    return m;  
}
```

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## ESC/Java “demo”

```
class Bag {  
    int[] a; // @ invariant a != null;  
    int n; // @ invariant 0 <= n && n <= a.length;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int minIndex = 0;  
        for (int i = 0; i < n; i++) {  
            if (a[i] < m) { minIndex = i; m = a[i]; } } }  
    n--;  
    a[minIndex] = a[n];  
    return m;  
}
```

Warning: Possible negative array index

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## ESC/Java “demo”

```
class Bag {  
    int[] a; // @ invariant a != null;  
    int n; // @ invariant 0 <= n && n <= a.length;  
    // @ requires n > 0;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int minIndex = 0;  
        for (int i = 0; i < n; i++) {  
            if (a[i] < m) { minIndex = i; m = a[i]; } } }  
    n--;  
    a[minIndex] = a[n];  
    return m;  
}
```

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## ESC/Java “demo”

```
class Bag {  
    int[] a; // @ invariant a != null;  
    int n; // @ invariant 0 <= n && n <= a.length;  
    // @ requires n > 0;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int mindex = 0;  
        for (int i = 0; i < n; i++) {  
            if (a[i] < m) { mindex = i; m = a[i]; } } }  
    n--;  
    a[mindex] = a[n];  
    return m;  
}
```

No more warnings about this code

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## ESC/Java “demo”

```
class Bag {  
    int[] a; // @ invariant a != null;  
    int n; // @ invariant 0 <= n && n <= a.length;  
    // @ requires n > 0;  
    int extractMin() {  
        int m = Integer.MAX_VALUE;  
        int mindex = 0;  
        for (int i = 0; i < n; i++) {  
            if (a[i] < m) { mindex = i; m = a[i]; } } }  
    n--;  
    a[mindex] = a[n];  
    return m;  
}
```

... but warnings about calls to `extractMin()` that do not ensure precondition : **design by contract**

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## VII. Hoare logic for JML

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## Hoare logic issues for Java & JML

- Complications in Hoare logic for Java:
  - exceptions and other abrupt control flow
  - expressions may have side effects
- Thus:
  - not Hoare *triples* but Hoare *n-tuples*,
  - both for statements & expressions

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## Hoare Logic assertions

For  $\{ \text{Pre} \} m \{ \text{Post} \}$  write  

$$\begin{pmatrix} \text{requires} & = & \text{Pre} \\ \text{statement} & = & m \\ \text{ensures} & = & \text{Post} \end{pmatrix}$$

For JML one needs: 
$$\begin{pmatrix} \text{diverges} & = & D \\ \text{requires} & = & \text{Pre} \\ \text{statement} & = & m \\ \text{ensures} & = & \text{Post} \\ \text{signals} & = & S \end{pmatrix}$$

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## Hoare composition Rule

$$\left( \begin{array}{l} \text{diverges} = \lambda x. b \\ \text{requires} = \text{Pre} \\ \text{statement} = s_1 \\ \text{ensures} = Q \\ \text{signals} = S \end{array} \right) \quad \left( \begin{array}{l} \text{diverges} = \lambda x. b \\ \text{requires} = Q \\ \text{statement} = s_2 \\ \text{ensures} = \text{Post} \\ \text{signals} = S \end{array} \right)$$

$$\left( \begin{array}{l} \text{diverges} = \lambda x. b \\ \text{requires} = \text{Pre} \\ \text{statement} = s_1 ; s_2 \\ \text{ensures} = \text{Post} \\ \text{signals} = S \end{array} \right)$$

Intermediate predicate provided by the user in JML

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## Use of the Hoare logic

- Actual use seems clumsy, but PVS takes care of the bookkeeping
- This logic forms basis for semantics of JML

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## VIII. Conclusions

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### Main points

- There is mathematical uniformity & elegance in the structure of computation
- Main notions: monad / comonad / arrow
- This elegance is not completely lost in concrete languages / systems
- For our Java work: practice preceded theory
- Theorem proving cannot beat static checking in program verification

***Thanks for your attention!***

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