# Semi-decidability of may, must and probabilistic testing in a higher-type setting

#### Martín Escardó

School of Computer Science, Birmingham University, UK

MFPS 2009, Oxford, Friday 3rd April 2009

#### Main result

#### Theorem

May, must and probabilistic testing are semi-decidable, in a fairly general setting including higher-types.

#### Observations:

- Must testing is perhaps surprising: It involves universal quantification over an infinite set.
- The other two involve existential quantification and integration.

#### Ingredient 1

Can reduce to quantification and integration over the Cantor space.

This is the space of infinite sequences of binary digits.

#### Ingredient 2

Can algorithmically quantify and integrate over the Cantor space.

Quantification amounts exhaustive search in finite time.

#### Organization

- A programming language for non-determinism and probability.
- 2 Logical types. For results of semi-decisions.
- An executable program logic.
- Operational semantics of the executable logic. Algorithms.
- Denotational semantics of the executable logic. Correctness.

#### Brief discussion of effects

#### ML way.

- All effects are possible at all types.
- 2 Come up with a monad that combines all effects.
- The semantics is in the Kleisli category of that big monad.

#### Haskell way.

- Explicitly define various monads as type constructors.
- Por each effect, or maybe for each combination of a set of effects.
- 3 Several monads are used in the same program.
- The programmer decides which monads he wants for each sub-program.

#### We develop our results in the Haskell way.



## A programming language for non-determinism and probability

Ground types:

$$\gamma := \mathtt{Bool} \mid \mathtt{Nat}$$

Powertype constructors:

$$F ::= H \mid S \mid P \mid V$$

- 4 Hoare, Smyth, Plotkin, Probabilistic.
- 2 May, must, may/must, on average.
- 3 Angelic, demonic, human.

Types:

$$\sigma, \tau ::= \gamma \mid \sigma \times \tau \mid \sigma \to \tau \mid F\sigma$$

Cartesian closed language.



## Example

The type

$$\sigma \times \tau \rightarrow V \tau$$

can be used to code labeled Markov processes with:

- label space  $A = \sigma$ ,
- 2 state space  $S = \tau$ , and
- **3** transition function  $t: A \times S \rightarrow VS$ .

#### **Terms**

For the sublanguage over the PCF types

$$\sigma, \tau ::= \gamma \mid \sigma \times \tau \mid \sigma \to \tau$$

we take the PCF terms.

(Conditional, arithmetic,  $\lambda$ -calculus, fixed-point recursion.)

So no non-determinism or probability.

#### Non-deterministic choice constants

For each type  $\sigma$  and each type constructor  $F \in \{H, S, P\}$ , we have a constant

$$(\bigcirc^{\sigma})$$
:  $F\sigma \times F\sigma \to F\sigma$ ,

Idea. The term

this 🕔 that

non-deterministically evaluates to this or that, angelically or demonically.

#### Probabilistic choice constants

For each type  $\sigma$ , we have an infix constant

$$(\oplus^{\sigma})$$
:  $V \sigma \times V \sigma \rightarrow V \sigma$ .

Idea. The term

this  $\oplus$  that

non-deterministically evaluates to this or that, with equal probability.

## Monad syntax

Functor. If  $f: \sigma \to \tau$  is a term, then so is

*Ff* : 
$$F\sigma \rightarrow F\tau$$
.

Unit. For each type  $\sigma$ , we have a term

$$\eta_F^{\sigma} \colon \sigma \to F\sigma$$
.

Multiplication. For each type  $\sigma$ , we have a constant

$$\mu_F^{\sigma} \colon FF\sigma \to F\sigma.$$

Strength. Left to the audience.

#### Remark

We could have worked with monads as Kleisli triples (as in Haskell).

This makes no difference, but our choice is presentationally more convenient.

#### Example

$$\eta(\lambda x.0) \oslash \eta(\lambda x.1) \colon F(\sigma \to \mathtt{Nat})$$
  
 $\lambda x.\eta(0) \oslash \eta(1) \colon \sigma \to F\mathtt{Nat}$ 

Remark. If we apply the ML way to a call-by-name language, the terms

$$(\lambda x.0) \otimes (\lambda x.1)$$

and

$$\lambda x.(0 \otimes 1)$$

behave in the same way!

## Example: randomly choose an infinite sequence of booleans with uniform distribution

```
\mathtt{Cantor} = (\mathtt{Nat} \to \mathtt{Bool}).
cons: Bool \rightarrow Cantor \rightarrow Cantor.
prefix: Bool \rightarrow V Cantor \rightarrow V Cantor.
prefix p = V(\cos p).
random: V Cantor.
random = (prefix False random) \oplus (prefix True random).
```

#### Possible-results operational semantics

$$\frac{M \Downarrow v}{M \otimes N \Downarrow v} \qquad \frac{N \Downarrow v}{M \otimes N \Downarrow v} \qquad \frac{M \Downarrow v}{M \oplus N \Downarrow v} \qquad \frac{N \Downarrow v}{M \oplus N \Downarrow v}$$

$$\frac{M \Downarrow \eta(v) \quad f(v) \Downarrow w}{Ff(M) \Downarrow \eta(w)} \qquad \frac{M \Downarrow v}{\eta(M) \Downarrow \eta(v)} \qquad \frac{M \Downarrow \eta(V) \quad V \Downarrow \eta(W)}{\mu(M) \Downarrow \eta(W)}$$

#### **Schedulers**

Think of elements of the Cantor space as "schedulers".

Can decorate the operational semantics with schedulers,

$$M \Downarrow^{s} v$$
,

so that

 $M \Downarrow v$  iff there is some s with  $M \Downarrow^s v$ .

## May and must convergence

*M* must converge  $\iff$  for every s there is v with  $M \Downarrow^s v$ .

*M* may converge  $\iff$  there are s and v with  $M \Downarrow^s v$ .

Our approach is based on this idea.

But we implement it in a different way.

## The Sierpinski type

Term formation rules for a Sierpinski type S:

- $\bullet$   $\top$ : S is a term.
- ② If M: S and  $N: \sigma$  are terms then (if M then N):  $\sigma$  is a term.
- 1 If M, N: S are terms then so is  $M \vee N: S$ .

The only value (or canonical form) of type S is  $\top$ .

$$\frac{M \Downarrow \top \quad N \Downarrow V}{\text{if } M \text{ then } N \Downarrow V} \qquad \frac{M \Downarrow \top}{M \lor N \Downarrow \top} \qquad \frac{N \Downarrow \top}{M \lor N \Downarrow \top}.$$

$$\frac{M \Downarrow \top}{M \vee N \Downarrow \top}$$

$$\frac{\textit{N}\Downarrow\top}{\textit{M}\vee\textit{N}\Downarrow\top}$$

#### Computational adequacy of Scott model

If M is a closed term of ground type and v is a value then

$$\llbracket M \rrbracket = v \text{ iff } M \Downarrow v.$$

- Interpretated as the cpo  $([0,1], \leq)$ .
- **②** Computations of terms M: I allow to semi-decide the condition p < M with p rational.
- 3 But not the conditions M = p or M < p in general.

- 1 Interpretated as the cpo  $([0,1], \leq)$ .
- ② Computations of terms M: I allow to semi-decide the condition p < M with p rational.
- **3** But not the conditions M = p or M < p in general.
- Naturally regarded as a sub-dcpo of the unit-interval domain.
- **5** Think of  $x \in I$  as the interval [x, 1].

- 1 Interpretated as the cpo  $([0,1], \leq)$ .
- ② Computations of terms M: I allow to semi-decide the condition p < M with p rational.
- **3** But not the conditions M = p or M < p in general.
- Naturally regarded as a sub-dcpo of the unit-interval domain.
- **5** Think of  $x \in I$  as the interval [x, 1].
- We take the primitive operations those for Real PCF, restricted to such intervals.
- Arithmetic functions,  $p < (-): I \rightarrow S$  and pif.
- Same operational rules.

- Interpretated as the cpo  $([0,1], \leq)$ .
- ② Computations of terms M: I allow to semi-decide the condition p < M with p rational.
- **3** But not the conditions M = p or M < p in general.
- Naturally regarded as a sub-dcpo of the unit-interval domain.
- **5** Think of  $x \in I$  as the interval [x, 1].
- We take the primitive operations those for Real PCF, restricted to such intervals.
- Arithmetic functions,  $p < (-): I \rightarrow S$  and pif.
- Same operational rules.

## Computational adequacy

 $[\![M]\!] = x$  iff for every rational number p, we have that

$$p < x \iff (p < M) \Downarrow \top$$
.

## Definability results

#### There are programs:

#### Based on papers:

- PCF extended with real numbers, 1996.
- Integration in Real PCF (with Edalat), 2000.
- Synthetic topology of data types and classical spaces, 2004.
- Exhaustible sets in higher-computation, 2008.

#### Some code

$$\exists (p) = p(\bot) \lor (\exists (\lambda s.p(\mathsf{cons}\,\mathsf{False}\,s)) \lor \exists (\lambda s.p(\mathsf{cons}\,\mathsf{True}\,s))),$$

$$\forall (p) = p(\mathsf{if}\,\forall (\lambda s.p(\mathsf{cons}\,\mathsf{False}\,s)) \land \forall (\lambda s.p(\mathsf{cons}\,\mathsf{True}\,s)) \,\mathsf{then}\,c),$$

$$\int f = \mathsf{max}\,\Big(f(\bot), \int \lambda s.f(\mathsf{cons}\,\mathsf{False}\,s) \oplus \int \lambda s.f(\mathsf{cons}\,\mathsf{True}\,s)\Big).$$

## Executable program logic

We extend the programming language PCF + S + I with modal operators.

We get an executable program logic, MMP.

## May and must testing

The S-valued terms are characteristic functions of open sets:

$$\mathcal{O}\,\sigma = (\sigma \to \mathtt{S}).$$

$$\Diamond_F^{\sigma} \colon \mathcal{O} \sigma \to \mathcal{O} F \sigma, \quad \text{for } F \in \{\mathtt{H},\mathtt{P}\},$$

$$\square_F^{\sigma} \colon \mathcal{O} \sigma \to \mathcal{O} F \sigma, \quad \text{for } F \in \{S, P\}.$$

Idea. If  $u: \mathcal{O} \sigma$  and  $N: P \sigma$ ,

$$\Diamond(u)(N) = \top \iff u(x) = \top \text{ for some outcome } x \text{ of a run of } N$$

and

$$\square(u)(N) = \top \iff u(x) = \top \text{ for all outcomes } x \text{ of runs of } N.$$

#### Example

- Want to semi-decide whether n: FNat must be prime.
- **2** Write a semi-decision term  $prime: Nat \rightarrow S$ .
- **3** Run, in the executable logic, the ground term  $\Box$  prime n.

Of course, on can also semi-decide whether n must be non-prime.

#### However:

- It doesn't follow that primeness of all outcomes of n is decidable.
- ② If *n* has at least one non-divergent run, then both must tests diverge.

## Example

Recursively define a term  $f: \mathbb{N}$ at  $\to \mathbb{P} \mathbb{N}$ at by

$$f(n) = \eta(n) \otimes f(n+1),$$

and let converge: Nat  $\rightarrow$  S be a term such that

$$\mathtt{converge}(n) = \top \iff n \neq \bot.$$

Then we intend that

$$\Diamond \operatorname{converge}(f(0)) = \top$$

and that

$$\square$$
 converge $(f(0)) = \bot$ 

but

$$\square$$
 converge $(\eta(0) \otimes \eta(1)) = \top$ .

## Parallel-convergence is definable from may testing

Taking converge:  $S \rightarrow S$  as the identity, the function

$$(\vee): S \times S \rightarrow S$$

is characterized by the equation

$$(p \lor q) = \Diamond \operatorname{converge}(\eta(p) \oslash \eta(q)).$$

However, it cannot be defined from must testing.

Notice that 
$$(p \wedge q) = \square \operatorname{converge}(\eta(p) \otimes \eta(q))$$
.

## Probabilistic testing

Define a type of expectations:

$$\mathcal{E} \sigma = (\sigma \to \mathbf{I}).$$

We add a constant to the logic:

$$\bigcap^{\sigma} : \mathcal{E} \sigma \to \mathcal{E} \vee \sigma.$$

For a  $\{0,1\}$ -valued term  $u: \mathcal{E} \sigma$  and a term  $N: V \sigma$ ,

 $\bigcirc(u)(N)$ : I is the probability that u holds for outcomes of runs of N.

## Example

Recursively define a term  $g: Nat \rightarrow V Nat$  by

$$g(n) = \eta(n) \oplus g(n+1),$$

Then we intend that

$$\bigcirc$$
 converge $(g(0)) = 1$ 

and

$$\bigcirc$$
 converge<sub>n</sub> $(g(0)) = 2^{-n-1}$ 

where converge<sub>n</sub>: Nat  $\rightarrow$  S is a term such that

$$converge_n(x) = \top \iff x = n.$$

## Parallel-convergence is definable from probabilistic testing

$$(p \lor q) = 0 < \bigcirc \text{converge}(\eta(p) \oplus \eta(q)).$$

## Example: uniform distribution on I

Define a term prefix:  $I \rightarrow VI \rightarrow VI$  by

$$\operatorname{prefix} x = V(\lambda y. x \oplus y),$$

Define random: VI by

$$random = (prefix 0 random) \oplus (prefix 1 random).$$

For example  $\bigcap (\lambda x.p < x)$  random = 1 - p for any  $p \in I$ .

# Existential quantification in MMP

Recall that  $\mathcal{O} \sigma = (\sigma \to S)$ 

$$\diamondsuit : \mathcal{O} \sigma \to \mathcal{O} H \sigma$$

Define

$$\exists$$
:  $\operatorname{H}\sigma \to ((\sigma \to \operatorname{S}) \to \operatorname{S})$ 

as

$$\exists (C)(u) = \Diamond(u)(C).$$

The idea is that this stands for

$$\exists x \in C.u(x).$$

### Universal quantification in MMP

Similarly, from the must testing operator

$$\Box: \mathcal{O} \sigma \to \mathcal{O} S \sigma$$

we get a term

$$\forall : \ \mathtt{S}\,\sigma \to ((\sigma \to \mathtt{S}) \to \mathtt{S}),$$

The Ploktin powertype has both quantifiers.

# Integration in MMP

Recalling that  $\mathcal{E} \sigma = (\sigma \to \mathbf{I})$ , from the probabilistic testing operator

$$\bigcirc: \mathcal{E} \sigma \to \mathcal{E} \mathsf{V} \sigma$$

we get a term

$$\int \colon \operatorname{V} \sigma o ((\sigma o \operatorname{I}) o \operatorname{I})$$

defined by

$$\int_{\mathcal{U}} u = \bigcirc(u)(\nu).$$

where  $\nu$ :  $\nabla \sigma$  and u:  $\sigma \rightarrow I$ .

### Example

Let  $(\sigma, f_1, \dots, f_n, p_1, \dots, p_n)$  be an IFS with probabilities.

Its invariant measure  $\nu$ :  $\nabla \sigma$  can be defined as

$$\nu = \text{weighted-choice}(p_1, \dots, p_n)(V(f_1)(\nu), \dots, V(f_n)(\nu)),$$

Scriven (MFPS 2008) developed a PCF program for computing integrals of functions  $u: \sigma \to I$  with respect to the invariant measure.

Here we get the alternative algorithm  $\int_{\nu} u = \bigcirc(u)(\nu)$  in the program logic MMP instead.

# Operational semantics of the executable logic MMP

- By compositional compilation into its deterministic sub-language PCF + S + I.
- ② The translation is the identity on PCF + S + I terms.
- **3** Reduce may, must and probabilistic testing in MMP to quantification and integration in PCF + S + I.

# Translation of types

This is defined by induction:

$$egin{array}{lll} \phi(\gamma) &=& \gamma, \ \phi(\sigma imes au) &=& \phi(\sigma) imes \phi( au), \ \phi(\sigma o au) &=& \phi(\sigma) o \phi( au), \ \phi(F\sigma) &=& { ext{Cantor}} o \phi(\sigma). \end{array}$$

Recall that  $Cantor = (Nat \rightarrow Bool)$ .

(Hence the translation is the identity on PCF + S + Ic types.)

### Translation of terms

$$\begin{array}{rcl} \phi(x) & = & x \\ \phi(\lambda x.M) & = & \lambda x.\phi(M) \\ \phi(MN) & = & \phi(M)\phi(N) \\ \phi(\operatorname{PCF} + S + I \ \operatorname{constant}) & = & \operatorname{itself} \\ \phi(\operatorname{any} \ \operatorname{fixed-point} \ \operatorname{combinator}) & = & \operatorname{itself} \end{array}$$

(Hence the translation is the identity on PCF + S + I terms.)

### Translation of choice operators

For  $\star \in \{ \circlearrowleft, \oplus \}$ , we define

$$\phi(\star) = \lambda(k_0, k_1).\lambda s.$$
 if head(s) then  $k_0(tail(s))$  else  $k_1(tail(s))$ .

Here  $k_0$  and  $k_1$  range over  $\phi(F\sigma) = \mathtt{Cantor} \to \phi(\sigma)$ .

### Translation of the modal operators: may

Typing:

$$\diamondsuit$$
 :  $(\sigma \to \mathtt{S}) \to (F\sigma \to \mathtt{S}),$   $\phi(\diamondsuit)$  :  $(\phi(\sigma) \to \mathtt{S}) \to ((\mathtt{Cantor} \to \phi(\sigma)) \to \mathtt{S}).$ 

We define

$$\phi(\diamondsuit) = \lambda u.\lambda k. \exists s. u(k(s)).$$

Here

$$\underbrace{(\phi(\sigma) \to \mathtt{S})}_{u} \to \underbrace{((\underbrace{\mathtt{Cantor}}_{\mathtt{S}} \to \phi(\sigma)) \to \mathtt{S}).$$

The quantification is over the Cantor space.

### Translation of the modal operators: must

Typing:

$$egin{array}{lll} & \square & : & (\sigma 
ightarrow \mathtt{S}) 
ightarrow (F\sigma 
ightarrow \mathtt{S}), \ \phi(\Box) & : & (\phi(\sigma) 
ightarrow \mathtt{S}) 
ightarrow ((\mathtt{Cantor} 
ightarrow \phi(\sigma)) 
ightarrow \mathtt{S}). \end{array}$$

We define

$$\phi(\Box) = \lambda u.\lambda k. \forall s. u(k(s)).$$

Here

$$\underbrace{(\phi(\sigma) \to \mathtt{S})}_{u} \to \underbrace{((\underbrace{\mathtt{Cantor}}_{s} \to \phi(\sigma)) \to \mathtt{S}).$$

The quantification is over the Cantor space.

### Translation of the modal operators: probabilistic

Typing:

$$\bigcirc \quad : \quad (\sigma \to \mathtt{I}) \to (\mathtt{V}\,\sigma \to \mathtt{I}), \\ \phi(\bigcirc) \quad : \quad (\phi(\sigma) \to \mathtt{I}) \to ((\mathtt{Cantor} \to \phi(\sigma)) \to \mathtt{I}).$$

We define

$$\phi(\bigcirc) = \lambda u.\lambda k. \int u(k(s)) s.$$

Here

$$\underbrace{(\phi(\sigma) \to \mathtt{I})}_{u} \to \underbrace{((\underbrace{\mathtt{Cantor}}_{s} \to \phi(\sigma)) \to \mathtt{I}).$$

The integration is over the Cantor space.



### Translation of the monad constructions: functor

$$\phi(Ff) = \lambda k.\lambda s. f(k(s)).$$

### Translation of the monad constructions: unit

$$\phi(\eta_F) = \lambda x. \lambda s. x.$$

### Translation of the monad constructions: multiplication

We consider PCF terms

evens, odds: Cantor 
$$\rightarrow$$
 Cantor

that take subsequences at even and odd indices.

Define:

$$\phi(\mu_F) = \lambda k.\lambda s.k(\text{evens}(s))(\text{odds}(s)).$$

### Translation of the monad constructions: strength

Left as an exercise to the audience.

### Ground evaluation

For MMP terms  $M: \sigma$  with  $\gamma \neq I$  ground, define

$$M \Downarrow v \iff \phi(M) \Downarrow v$$
.

### Denotational semantics of the executable logic

As predicted by the audience.

### Types:

- Hoare powertype → Hoare powerdomain.
- ② Smyth powertype → Smyth powerdomain.
- Plotkin powertype 
   → Plotkin powerdomain.
- Probabilistic powertype 

  probabilistic powerdomain.

#### Terms:

- These are monads, which have the binary choice operators we need.
- ② The modal operators correspond to the usual descriptions of the open sets of the powerdomains.
- The probabilistic operator is interpreted by integration.

### Computational adequacy

To establish semi-decidability of may, must and probabilistic testing, we first prove *computational adequacy* of the model:

#### Lemma

For any closed MMP-term M of ground type other than I, and all syntactical values v,

$$\llbracket M \rrbracket = \llbracket v \rrbracket \iff M \Downarrow v.$$

In particular, for M: I closed and  $r \in \mathbb{Q}$ ,

$$r < \llbracket M \rrbracket \iff r < M \Downarrow \top.$$

### Computational adequacy: technical aspects

Because the model is already known to be computationally adequate for the deterministic sub-language PCF + S + I:

#### Lemma

Computational adequacy holds if and only if  $\llbracket M \rrbracket = \llbracket \phi(M) \rrbracket$  for every closed term M of ground type.

### Correctness of the semi-decision procedures

Follows directly from computational adequacy.

**BUT** 

### Trouble

- For the proof of computational adequacy, we rely on the abstract description of the powerdomains by free algebras.
- For the proof of correctness, we rely on the concrete descriptions of the powerdomains:
  - Set of closed sets (Hoare).
  - Set of compact sets (Smyth).
  - Senses (Plotkin).
  - Continuous valuations with total mass 1 (Probabilistic).
- The abstract and concrete descriptions agree only for special kinds of domains.

### Partial results

#### Theorem

- For any type  $\sigma$ , may testing on terms of type  $\operatorname{H} \sigma$  is semi-decidable.
- **②** For any continuous type  $\sigma$ , must testing on terms of type S  $\sigma$  is semi-decidable.
- **3** For any RSFP type  $\sigma$ , may and must testing on terms of type  $P \sigma$  are semi-decidable.
- For any continuous type  $\sigma$ , probabilistic testing on terms of type  $V\sigma$  is semi-decidable.

#### Remark

- If we hadn't included the probabilistic powertype in our language, we wouldn't have had any of the above difficulties.
- May and must testing would be semi-decidable for all types.
- What causes the restrictions is the presence of the probabilistic powertype.
- Out still the restrictions are not severe in practice.
- For example, probabilistic computations on any PCF type of any order have semi-decidable probabilistic testing.

# Syntactical description of some types we account for

Define:

$$S ::= \gamma \mid S \times S \mid (C \to S) \mid H C \mid S C,$$

$$R ::= S \mid R \times R \mid (R \to R) \mid P R,$$

$$C ::= R \mid C \times C \mid V C.$$

By a *continuous Scott domain* we mean a bounded complete continuous dcpo.

#### **Proposition**

- The interpretation of an S type is a continuous Scott domain.
- 2 The interpretation of an R type is an RSFP domain.
- **3** The interpretation of a C type is a continuous dcpo.

# End and summary

#### **Theorem**

- For any type  $\sigma$ , may testing on terms of type  $\operatorname{H} \sigma$  is semi-decidable.
- **2** For any continuous type  $\sigma$ , must testing on terms of type S  $\sigma$  is semi-decidable.
- **3** For any RSFP type  $\sigma$ , may and must testing on terms of type P  $\sigma$  are semi-decidable.
- For any continuous type  $\sigma$ , probabilistic testing on terms of type V  $\sigma$  is semi-decidable.

This applies to a large class of (syntactically described) types.

