

# Tutorial on Semantics

## Part II

### Domain Theory

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Fields Institute, Toronto: 20th June 2011

- 1 Cartesian closed categories
- 2 Approximation and continuous domains
- 3 Categories of algebraic domains
- 4 Denotational semantics of PCF
- 5 Adequacy of the denotational semantics
- 6 Full abstraction

# What we need

- We saw that we needed fixed-point theory at *all* types.
- We therefore need to define models of data types that support this.
- We also need functions between data types to be data types.
- Since we are looking at properties of all data types together we need to look at the *category* of data types.

# Categories Uber Alles

## Definition

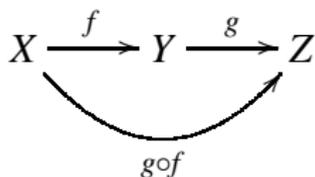
A **category**  $\mathcal{C}$  consists of two collections:  $\mathcal{C}_0$  **objects** and  $\mathcal{C}_1$  **morphisms**.

There are functions  $dom, cod : \mathcal{C}_1 \rightarrow \mathcal{C}_0$  and a partial function  $\circ : \mathcal{C}_1 \times \mathcal{C}_1 \rightarrow \mathcal{C}_1$  called **composition**.

The function  $g \circ f$  is defined if and only if  $cod(f) = dom(g)$  and when it is defined  $dom(g \circ f) = dom(f)$ ,  $cod(g \circ f) = cod(g)$ .

For every  $X \in \mathcal{C}_0$  there is a unique morphism  $id_X$  which is an identity for composition.

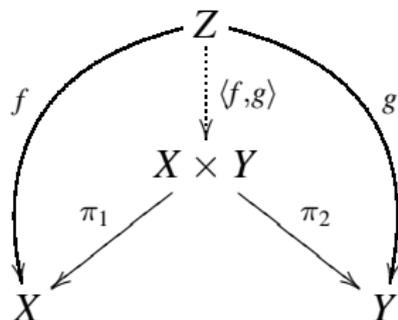
Composition is associative.



# Some categorical concepts

- The collection of objects can be a set: small category.
- The collection of morphisms between two objects can be a set: locally small category. We write  $Hom(A, B)$  or  $\mathcal{C}(A, B)$ : homset.
- A **functor**  $\mathcal{F}$  relates two categories: it maps objects to objects and morphisms to morphisms and it preserves identities and composition.

The diagram illustrates the preservation of composition by a functor  $\mathcal{F}$ . On the left, a sequence of objects  $X \xrightarrow{f} Y \xrightarrow{g} Z$  is shown with a curved arrow from  $X$  to  $Z$  labeled  $g \circ f$ . A dotted arrow labeled  $\mathcal{F}$  maps this sequence to the right. On the right, the sequence of objects is  $\mathcal{F}(X) \xrightarrow{\mathcal{F}(f)} \mathcal{F}(Y) \xrightarrow{\mathcal{F}(g)} \mathcal{F}(Z)$ , with a curved arrow from  $\mathcal{F}(X)$  to  $\mathcal{F}(Z)$  labeled  $\mathcal{F}(g \circ f) = \mathcal{F}(g) \circ \mathcal{F}(f)$ .



A category may or may not have products.

$$\begin{array}{ccc} X \times Y^X & \xrightarrow{ev} & Y \\ \langle id_x, \hat{f} \rangle \uparrow & & \nearrow f \\ X \times Z & & \end{array}$$

This makes the concept of homset (or function space) *internal*; i.e. there are objects that behave like the homsets.

## Definition

An object in a category is **terminal** if there is a unique morphism to it from every object.

## Definition

An object in a category is **initial** if there is a unique morphism from it to every object.

# Cartesian closed categories

- A CCC has finite products,
- a terminal object
- and exponentials.
- We want our domains to form a CCC.

# Basic properties of domains

- Domains should capture the idea of *partial information*.
- This is expressed *qualitatively* through a domain.
- A domain should be a poset with a least element.
- A directed set  $X \subseteq D$  satisfies:  $\forall x, y \in X \exists z \in X$  with  $x, y \leq z$ . It represents a *consistent* collection of data. Every directed set should have a least upper bound ( $\sup, \bigvee$ ).
- Such posets are called **dcpos** for directed-complete posets.
- Henceforth, all domains will be dcpos; more conditions later.
- Functions between domains should be monotone.
- Functions between domains should preserve sups of directed sets: continuity.

# Approximation

- We want some concept of “piece of information”.
- We say that  $b$  is an *essential approximation* of  $y$  if whenever there is a directed set  $X$  with  $y \leq \bigvee X$  then for some  $x \in X$  we have  $b \leq x$ ; we write  $b \ll y$ .
- Any limiting process that passes  $y$  must pass  $b$  at some *finite stage*.
- Example: consider the domain consisting of subsets of the integers. Then an essential approximation of the set of positive even numbers is  $\{2, 6, 8\}$  but the set of positive powers of two is an approximation but not an essential approximation.
- We will write  $\downarrow(x)$  for the set of essential approximations to  $x$ .

- We would like to have a collection of “tractable” elements that allow one to represent everything in the domain.
- A **basis**  $B$  for a domain  $D$  is a (countable) family of elements such that for every  $d \in D$  the set of elements  $B_d = B \cap \downarrow(d)$  is directed and  $\bigvee B_d = d$ .
- A domain with a (countable) basis is said to be ( $\omega$ -)**continuous**.
- We say that  $e$  is *finite* (compact) if  $e \ll e$ .
- Sometimes we do not have enough finite elements but we can often find enough essential approximations.
- Example:  $[0, 1]$  with the usual order has only one finite element but the rational form a nice countable basis.

# Examples of continuous domains

- The set of all subsets of positive integers, ordered by inclusion. Take the *finite* subsets as the basis. These are actually *finite elements*; which partly explains the terminology.
- The set of all partial functions from a countable set to itself ordered by inclusion of graphs.
- The set of all subprobability distributions on a finite set, ordered pointwise.
- A countable basis is given by all the distributions that assign rational weights to each point.
- Continuous domains arise whenever one is dealing with real numbers: probabilistic systems, real-time systems, computing with real numbers.

# Algebraic domains

- One wants to relate the denotational semantics with the operational semantics; one needs to work with “syntactically representable elements” as a way of forging this connection.
- It usually happens that this connection is mediated by finite elements.
- A continuous domain in which all the basis elements are finite (not finite in number!) is called an **algebraic** domain.
- For the traditional semantic applications algebraic domains are very important. For more recent applications to real-time, hybrid and probabilistic systems continuous domains are necessary.
- Whence comes this name “algebraic”?
- The collection of finitely generated subgroups in the lattice of subgroups of a given group forms an algebraic dcpo. Many examples in algebra come from finitely generated meaning “finite”.

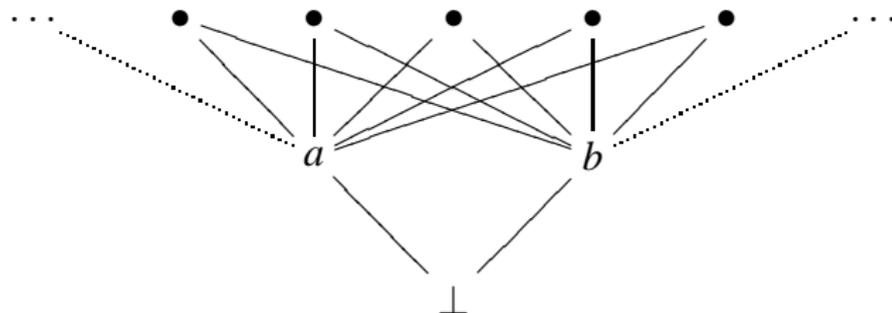
- What are general functions spaces?
- If  $D$  and  $E$  are dcpos then we define  $[D \rightarrow E]$  to be the poset of *continuous* functions from  $D$  to  $E$  with the following order

$$f \leq g \text{ iff } \forall d \in D, f(d) \leq_E g(d).$$

- It is not hard to show that  $[D \rightarrow E]$  is itself a dcpo.
- We can define  $D \times E$  as  $\{(x, y) | x \in D, y \in E\}$  with the order  $(x, y) \leq (x', y')$  iff  $x \leq_D x'$  **and**  $y \leq_E y'$ .
- If we define **Dcpo** to be the category with dcpos as objects and continuous functions as morphisms we get a cartesian closed category.

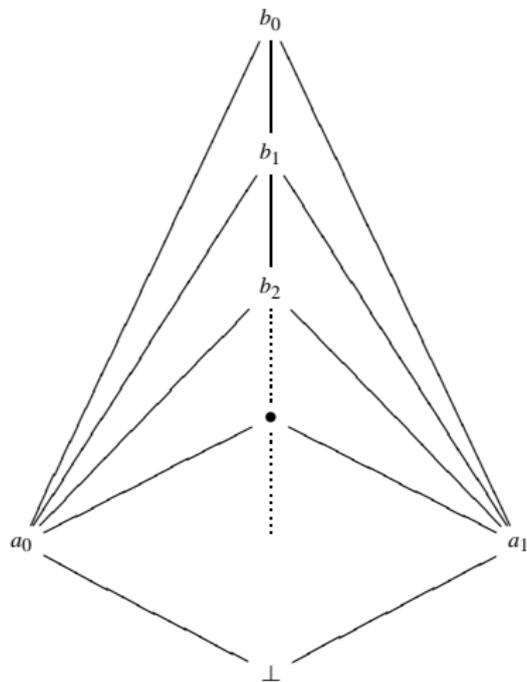
- If we adopt  $\omega$ -algebraicity as a basic requirement for our domains we need to ensure that the function spaces are also  $\omega$ -algebraic.
- However, we cannot take domains to be arbitrary  $\omega$ -algebraic dcpos.
- There are three famous examples due to Gordon Plotkin of  $\omega$ -algebraic dcpos  $D$  with  $[D \rightarrow D]$  not  $\omega$ -algebraic.

# Plotkin's first example

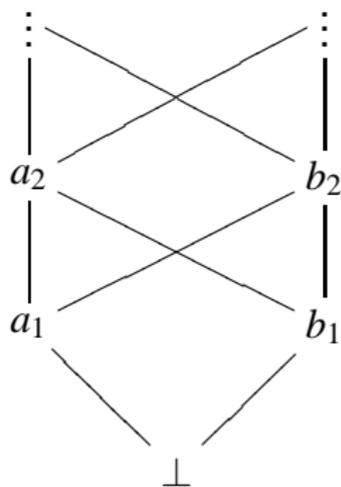


This is not too bad, it *is* algebraic but not  $\omega$ -algebraic.

# Plotkin's second example



# Plotkin's third example



These last two are really terrible!

## Definition

A pair of elements  $x, y$  in a dcpo are said to be **bounded** or **consistent** if there is some  $z$  such that  $x, y \leq z$ .

## Definition

A **Scott domain** is an  $\omega$ -algebraic dcpo such that every non-empty finite set of elements has a least upper bound.

They are also called bounded-complete dcpos or consistently-complete dcpos.

# Function spaces of Scott domains

- Easy to see that Plotkin's examples are all ruled out.
- Easy fact: if  $e_1, e_2$  are compact and  $e_1 \sqcup e_2$  exists, then it is also compact; hence, same is true for finite sets of compact elements.
- If  $D$  and  $E$  are Scott domains and the finite elements are denoted  $\{d_i\}$  and  $\{e_j\}$  respectively, then the following are compact elements of the function space

$$d_i \nearrow e_j(x) = \begin{cases} e_j, & \text{if } d_i \leq x; \\ \perp & \text{otherwise.} \end{cases}$$

- They are called step functions.
- Do reasonable sups of these things always exist?

# Sups of step functions

- When should  $d_1 \nearrow e_1$  and  $d_2 \nearrow e_2$  be consistent?
- When  $d_1$  and  $d_2$  are consistent then  $e_1$  and  $e_2$  should be consistent.
- In that case  $e = e_1 \sqcup e_2$  exists,
- *because of bounded completeness!*
- Then we can define

$$(d_1 \nearrow e_1 \sqcup d_2 \nearrow e_2)(x) = \begin{cases} e_1, & \text{if } d_1 \leq x \text{ but } d_2 \not\leq x; \\ e_2, & \text{if } d_2 \leq x \text{ but } d_1 \not\leq x; \\ e, & \text{if } d_1 \leq x \text{ and } d_2 \leq x; \\ \perp & \text{otherwise.} \end{cases}$$

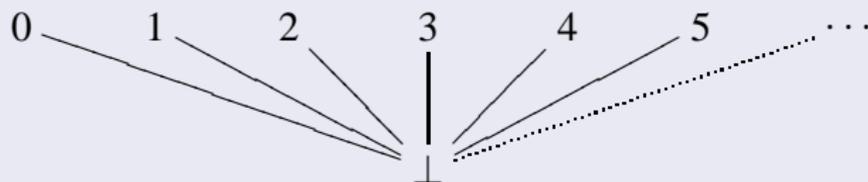
- Now we can get a basis for the function space by taking sups of all bounded (consistent) finite collections of step functions.
- The category of Scott domains is cartesian closed.

# Is this the best one can do?

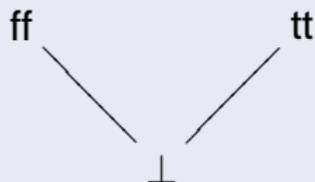
- Gordon Plotkin defined a larger category – the SFP domains – which ruled out his three examples and showed that this gives a CCC of  $\omega$ -algebraic domains. He needed it for his work on powerdomains and nondeterministic computation.
- Mike Smyth showed that this is the *largest* CCC of  $\omega$ -algebraic domains.
- Carl Gunter showed that the Scott domains are the largest *first-order axiomatizable* CCC of  $\omega$ -algebraic domains.
- Achim Jung showed that there were exactly 4 maximal CCCs of algebraic domains.
- Why do we need more CCCs if Scott domains are good enough for PCF?
- We need them when we add new features – nondeterminism, probability – to the language and need to model them.

# Basic domains for PCF

The “flat” domain of naturals:  $\mathbb{N}_\perp$



The flat domain of booleans:  $\mathcal{B}_\perp$



- The ground types

$$\llbracket Nat \rrbracket = \mathbb{N}_\perp; \quad \llbracket Bool \rrbracket = \mathcal{B}_\perp.$$

- The higher types

$$\llbracket \sigma \times \tau \rrbracket = \llbracket \sigma \rrbracket \times \llbracket \tau \rrbracket; \quad \llbracket \sigma \rightarrow \tau \rrbracket = \llbracket \llbracket \sigma \rrbracket \rightarrow \llbracket \tau \rrbracket \rrbracket.$$

- The constants, pairing, projection, plus, equals and conditionals are interpreted the obvious way.
- The  $\lambda$ -calculus part is interpreted in the manner we have already indicated. We need to show various things are continuous.
- It only remains to explain *fix*.

# Fix

- Given  $D$  a Scott domain (any dcpo with  $\perp$  will do); define  $\text{fix}_D : [D \rightarrow D] \rightarrow D$  by  $\text{fix}_D(f) = \bigvee \{\perp, f(\text{bot}), \dots, f^{(n)}(\perp), \dots\}$ .
- This is itself a continuous function.
- The family  $\text{fix}_D$  is the *unique* family satisfying the following uniformity condition. If  $h$  is strict ( $h(\perp) = \perp$ ) and the diagram

$$\begin{array}{ccc} D & \xrightarrow{f} & D \\ \downarrow h & & \downarrow h \\ E & \xrightarrow{g} & e \end{array}$$

commutes, then  $h(\text{fix}_D(f)) = \text{fix}_E(g)$ .



$$\llbracket \text{fix}(M) \rrbracket = \text{fix}(\llbracket M \rrbracket).$$

## Theorem

*If  $\Gamma \vdash M : \tau$  is a valid typing judgment and  $M \xrightarrow{*} N$  then  $\Gamma \vdash N : \tau$  is a valid typing judgment.*

## Theorem

*If  $\Gamma \vdash M : \tau$  and  $M \xrightarrow{*} N$  then  $\llbracket M \rrbracket = \llbracket N \rrbracket$ .*

- A **context** in PCF is essentially a term with a “hole” in it into which another term of the appropriate type can be plugged in.
- For example  $\lambda x. \langle 2, x[\cdot] \rangle$ . If we put a term of the right type in the hole, we will get a PCF term.
- A semantics is *compositional* if  $\llbracket M \rrbracket = \llbracket N \rrbracket$  implies that for all contexts  $C[\cdot]$  (of the right type)  $\llbracket C[M] \rrbracket = \llbracket C[N] \rrbracket$ .
- The denotational semantics of PCF based on domains (the standard model) is compositional.
- If  $C[\cdot]$  is such that  $C[M]$  is of ground type, we say  $C$  is a ground context.

# Observations

- We cannot test terms of all types for equality, only ground types.
- We can observe a ground term by seeing to what value it reduces.
- We write  $M \Downarrow m$  if the term  $M : Nat$  eventually reduces to the number  $m$ .
- What can we observe about higher type terms?
- We say  $M, N$  are **observationally equivalent** if for all *ground* contexts  $C[\cdot]$  for  $M$  and  $N$ ,  $C[M] \Downarrow v$  if and only if  $C[N] \Downarrow v$ ; we write  $M \equiv_{obs} N$ .
- We write  $M \Downarrow \perp$  to mean  $\forall v. \neg(M \Downarrow v)$ .
- We would like our denotational semantics to be a good guide to observational equivalence.

## Definition

We say a semantics is **adequate** if

$$\llbracket M \rrbracket = \llbracket N \rrbracket \Rightarrow M \equiv_{obs} N.$$

This is equivalent to

## Theorem

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

## Proof sketch

Assume  $\llbracket M \rrbracket = \llbracket N \rrbracket$  and the proposition holds. Let  $C[\cdot]$  be a ground context and  $v$  a value such that  $C[M] \Downarrow v$ . Thus  $\llbracket C[M] \rrbracket = \llbracket C[v] \rrbracket = \llbracket C[N] \rrbracket$ , where we have used compositionality. Thus,  $C[N] \Downarrow v$ .

# The grand theorem of PCF

## Theorem

*The denotational semantics of PCF is adequate.*

# Reasoning with higher-type languages

- How can we reason about higher type languages?
- We use both the term structure and the type structure.
- Terms of simple structure – like variables – can have arbitrarily complicated types.
- Therefore the induction arguments are not just nicely nested.
- Furthermore, we have to deal with substitutions into open terms.
- The main technique uses *logical relations* invented by Tait in 1967 to prove strong normalization of simply-typed  $\lambda$ -calculus.
- We will illustrate logical relations with the proof of adequacy.
- For simplicity, I will forget about products.

# The computability predicate

- If  $M : Nat$  is *closed* it is said to be **computable** if  $\llbracket M \rrbracket = \llbracket v \rrbracket$  implies  $M \Downarrow v$ .
- If  $M : \tau \rightarrow \tau'$  is closed it is computable if, for every closed *computable* term  $N : \tau$ ,  $MN : \tau'$  is computable.
- If  $M$  has free variables  $\{x_1, \dots, x_k\}$  then it is computable if for every substitution  $M[N_1/x_1, \dots, N_k/x_k]$  of closed computable terms for the free variables we get a computable term.
- We call such a substitution computable.
- We write  $\sigma$  for a substitution and  $\sigma[M]$  for the term resulting from the substitution.

- We claim every PCF term is computable. Induction on structure of terms and types.
- $M = x : \tau$ ; a computable substitution will certainly produce a computable term.
- Cases where  $M$  is a conditional or *plus* are easy structural induction cases.

- $M = \lambda x.Q : \tau_1 \rightarrow \tau_2$ . Let  $\sigma$  be a computable substitution and let  $\vec{T}$  be a sequence of closed computable terms such that  $\sigma[M]\vec{T}$  is of ground type and that  $\llbracket \sigma[M]\vec{T} \rrbracket = \llbracket v \rrbracket$ .
- $\sigma[M]\vec{T} = \sigma[\lambda x.Q]T_1T_2 \dots T_k = (\lambda x.\sigma[Q])T_1T_2 \dots T_k$
- $= (\sigma[Q][T_1/x_1])T_2 \dots T_k$ .
- Now the term  $(\sigma[Q][T_1/x_1]) = Q[T_1/x_1, S_1/y_1, S_2/y_2, \dots]$  is just another substitution instance of  $Q$  by a computable substitution  $\sigma'$ . Hence, by the induction hypothesis it is computable.
- Thus  $\llbracket \sigma[M]\vec{T} \rrbracket = \llbracket \sigma'[Q]T_2 \dots T_k \rrbracket = \llbracket v \rrbracket$  implies that  $\sigma'[Q]T_2 \dots T_k \Downarrow v$ .
- Hence  $\sigma[M]\vec{T} \Downarrow v$ .
- One can prove the application case with similar arguments.

# The Proof III: Fix sketched

- Here we need another theorem: approximation.
- Imagine the recursion unwound to some depth and then wherever  $fix$  occurs we replace it with  $\perp$ .
- The collection of partial unwindings are the *syntactic approximants*.
- We can show that the denotational semantics of the syntactic approximants give a directed set with least upper bound the meaning of the original term.
- We can show that if any of the approximants applied to closed computable terms converges to  $v$  then so does the original term.
- We prove by induction on the depth of the unwinding that the unwindings are computable.
- Putting all this together we can complete the argument.

# A perfect match?

- We would like our denotational semantics to be a perfect match with observational equivalence.

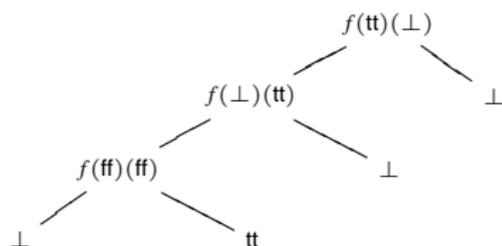
$$\llbracket M \rrbracket = \llbracket N \rrbracket \Leftrightarrow M \equiv_{obs} N.$$

- Unfortunately, it is not!
- Consider the function “parallel or” with the following table

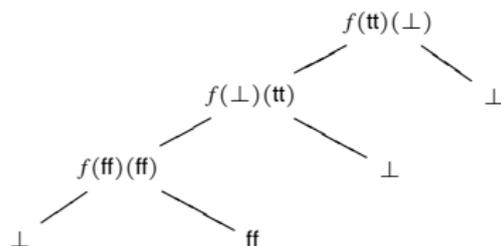
por	$\perp$	tt	ff
$\perp$	$\perp$	tt	$\perp$
tt	tt	tt	tt
ff	$\perp$	tt	ff

- This function cannot be defined in PCF; proved by Plotkin in 1977.
- This function is “listening in parallel” to two inputs and will use whichever one converges first.
- However, the operational semantics of PCF is sequential.

# The problem with parallel or



Call this term  $T$ .



Call this term  $F$ .

Consider the terms  $(\lambda f.T)_{por} = tt$  and  $(\lambda f.F)_{por} = ff$ . So it is definitely the case that  $\llbracket T \rrbracket \neq \llbracket F \rrbracket$ . However, no PCF definable term will ever see the difference.

# What can be done about this?

- Add parallel or to the language or some other parallel construct.
- Various extended languages were shown to have fully abstract domain models.
- Key step in proving full abstraction: all the finite elements are definable.
- Construct a fully abstract model from the syntax: Milner 1977.
- All fully abstract models are isomorphic, so the question is one of presenting a fully abstract model in an insightful way. The domain model gives insight into the nature of computation that is not just mimicking the operational semantics.
- Try to characterize sequential computation mathematically.

# Stable domain theory: Berry

- Berry introduced a new restriction and a new order on functions – the stable order – and introduced stronger finiteness conditions.
- In Scott domains a finite (i.e. compact) element can be above infinitely many elements! This does not happen in stable domain theory.
- PCF can be given an adequate semantics with stable domains.
- Parallel or does not appear in stable domains.
- Unfortunately, other more complicated examples can be given – discovered by Berry himself – that show that full abstraction fails.

# Need a more intensional view

- Berry and Curien started the study of sequential *algorithms* on concrete data structures.
- Girard invented linear logic in the mid 1980s and this made a huge impact on the semantics community by making resource sensitivity an integral part of logic and proof theory.
- Abramsky and Jagadeesan developed full completeness results for linear logic based on dialogue games.
- Abramsky, Jagadeesan and Malacaria and simultaneously and independently Hyland and Ong and also independently Nickau developed fully abstract games models for PCF.
- O'Hearn and Riecke gave domain theoretic fully abstract models but they were also based on intensional ideas.

- Ralph Loader showed that observational equivalence of even finitary PCF is undecidable.
- This means that no fully abstract model can be effectively presented.

# The Game Universe

- The basic idea is to model data types as dialogue games and programs as strategies: there is no notion of winning or losing.
- Remarkably different programming paradigms appear as different restrictions on allowed strategies.
- Two important restrictions needed for modelling PCF are called *innocence* and *bracketing*. Loosening these restrictions yields fully abstract models of extensions of PCF!

