Topics in Computer Science: Semantics of programming languages

Dr Philip Saville



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- ▶ Algorithms and complexity: what can be computed? How fast?

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- ▶ Algorithms and complexity: what can be computed? How fast?
- ▶ **Semantics**: what is the mathematical <u>structure</u> of computation?

In other words, what is the meaning of a program?

When we write programs, we have some sense of what they mean.	
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For us:

- ▶ A set is a collection of elements:
- ▶ A function between two sets, written $A \rightarrow B$, is a rule assigning to each element of A an element of B.

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For example, writing \mathbb{N} for the set of natural numbers $0, 1, 2, \ldots$:

- 1. We get a function $\mathbb{N} \to \mathbb{N}$ as the rule $x \mapsto x+1$;
- 2. We get a different function $\mathbb{N} \to \mathbb{N}$ as the rule $x \mapsto 1$.

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???

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```
def another_function(x,y):
    print("hello")
    return x + y
```

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def a_function(x, y):
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A mathematical function:
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But this quickly gets more difficult:

Aim: give you some sense of why we want to do this, and how we do it

Aims of the next four lectures

At the end of the next four lectures you should be able to:

- ► Explain why we do semantics
- ▶ Distinguish between operational and denotational approaches
- ▶ Be able to prove basic semantic facts about some toy languages
- ▶ Outline some directions of where the field goes next



Your PC ran into a problem that it couldn't handle, and now it needs to restart.

You can search for the error online: HAL_INITIALIZATION_FAILED

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But they can also be life-threatening and catastrophic:



Reliability really matters

Software is at the heart of the modern world.

It's crucial we understand what it does!

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Reason 2: to write tools for existing languages (e.g. a compiler) we need to understand their behaviour

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Higher-order languages...encourage the programmer to build abstractions by composing functions. A good compiler must inline many of these calls to recover an efficiently executable program. In principle, inlining is dead simple: just replace the call of a function by an instance of its body. But any compiler-writer will tell you that inlining is a black art, full of delicate compromises that work together to give good performance without unnecessary code bloat.

Simon Peyton-Jones, one of the designers of Haskell

- Reason 1: to verify they do what they're supposed to ... and hopefully make them more reliable
- Reason 2: to write tools for existing languages (e.g. a compiler) we need to understand their behaviour
- Reason 3: to design new programming languages and paradigms
 - (a) by thoroughly understanding the structure of programs, we can discover useful new constructs

 example: effect handlers in Jax and Pyro
 - (b) we can also make sure new features behave correctly

A cautionary tale

The ML language has a range of powerful features that give strong guarantees on program behaviour (e.g. strict typing, type inference, polymorphism ...)

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...but an apparently-innocuous combination of its features broke these guarantees!

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Example 2: specify smooth functions, with a derivative we can compute algorithmically e.g. for writing neural networks

Designing new programming features

We want programs to do increasingly-fancy things.

- Example 1: specify probabilistic models e.g. for pandemic modelling
- Example 2: specify smooth functions, with a derivative we can compute algorithmically e.g. for writing neural networks

Both probabilistic programs and differentiable programs involve

- 1. Powerful program features (e.g. loops, recursion, higher-order functions, ...)
- 2. Sophisticated mathematics (e.g. probability, measure theory, differentiability, ...)

Making sure these combine to do the right thing is both subtle and difficult!

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Do we need semantics?

Can't we just...?

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4.7.3.3 Body replacement and execution. Finally the procedure body, modified as above, is inserted in place of the procedure statement and executed. If the procedure is called from a place outside the scope of any non-local quantity of the procedure body, the conflicts between the identifiers inserted through this process of body replacement and the identifiers whose declarations are valid at the place of the procedure statement or function designator will be avoided through suitable systematic changes of the latter identifiers.

From the Revised Report of Algol 60.

 ${f Side\ effects}={f changes}$ to variables resulting from the evaluation of an expression for which the variable is not local.

An Algol 60 program

```
begin integer a; integer procedure f(x,y); value y,x; integer y,x; a:=f:=x+1; integer procedure g(x); integer x; x:=g:=a+2; a:=0; outreal(1, a+f(a,g(a))/g(a)) end
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Depending on the order of evaluation, the final result can be $4\frac{1}{2}$, $\frac{1}{3}$, $\frac{3}{5}$, $\frac{3}{2}$, $\frac{5}{2}$, $\frac{4}{3}$, $3\frac{3}{5}$, $3\frac{1}{3}$, $5\frac{3}{5}$, $3\frac{1}{2}$, and $7\frac{1}{2}$!

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See also: the huge on-going effort to verify chip architectures.

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- ► formal (not just in English),
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- \dots and which can define the behaviour of any (syntactically correct) program.

In other words, we want a **mathematical model** of programs.

Aside: syntax vs semantics

Every programming language comes with

- 1. **Syntax** = the sequences of symbols that are valid in the language (e.g. where { and } go in Java)
- 2. **Semantics** = the meaning of (correctly-written) programs.

= different ways of modelling programs

▶ Operational: a program's meaning is given in terms of the steps of computation the program makes when you run it. Heavily syntax-oriented and rather intuitive. Very useful in implementation.

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- ▶ Denotational: a program's meaning is given abstractly as an element of some mathematical structure (e.g. some kind of set). Provides the deepest and most widely applicable techniques, borrowed from mathematics.
- ▶ Axiomatic: a program's meaning is given indirectly in terms of the collection of properties it satisfies; these properties are defined via a collection of axioms and rules.

Different approaches complement one another:

- 1. correctness of the proof rules of an axiomatic semantics relies on an underlying denotational or operational semantics,
- 2. correctness of an implementation with respect to a denotational semantics requires a proof that the operational and denotational semantics agree,
- 3. in proving facts about an operational semantics it can be of great help to use a denotational semantics, which abstracts away from unimportant, implementation details.

Time to see some semantics!

What we'll see next:

operational and denotational semantics for a very basic language of numerical expressions.

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This is a short course! The aim is to give a flavour of how things go; at the end we'll add some features and think how to adapt things for that

The language NumExp

The fonts matter! We distinguish between

- 1. numerals like 3 (syntax, part of the language)
- 2. numbers like 3 (semantics, what we usually mean by numbers)

$$egin{array}{llll} \textit{Num} & \mathbf{n} & \coloneqq & \mathbf{0} & \mathbf{1} & \mathbf{2} & \dots \\ \textit{Exp} & \mathbf{e} & \coloneqq & \mathbf{n} & \mathbf{e} & \mathbf{e} & \mathbf{e} & \mathbf{e} & \mathbf{e} \end{array}$$

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We will never write $1 \oplus 2 \otimes 3$, only well-formed expressions like $(4 \oplus 5) \otimes 6$.

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Our informal reading of what NumExp programs mean:

- 1. Every numeral **n** is evaluated to the corresponding number n;
- 2. To find the value associated with an expression of the form $e_0 \oplus e_1$ we evaluate the expressions e_0 and e_1 and take the sum of the results;
- 3. To find the value associated with an expression of the form $e_0 \otimes e_1$ we evaluate the expressions e_0 and e_1 and take the product of the results

These are choices, we could do something different!

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Examples:

- ▶ 42 is evaluated to 42,
- $ightharpoonup (1 \oplus 2) \otimes 3$ is evaluated to 9,
- (1 0 2) 0 0 15 0 0 0 0 0
- ▶ $(1 \oplus 2) \otimes (3 \oplus 4)$ is evaluated to 21.

Operational semantics for NumExp

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"after evaluating **e** by one step, the expression **e**' remains to be evaluated".

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 $\frac{\text{premise}_1 \quad \dots \quad \text{premise}_n}{\text{conclusion}} \text{ side-condition (rule name)}$

"if we have all the premises, and the side-condition holds, we get the conclusion"

Examples of logical rules

$$\frac{\mathbf{e}_0 \to \mathbf{e}_0'}{\mathbf{n}_0 \oplus \mathbf{n}_1 \to \mathbf{n}} \ n = n_0 + n_1(sum) \qquad \frac{\mathbf{e}_0 \to \mathbf{e}_0'}{\mathbf{e}_0 \oplus \mathbf{e}_1 \to \mathbf{e}_0' \oplus \mathbf{e}_1} \ (sumL)$$

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It's sometimes more natural to read from top to bottom: sumL says

To evaluate $e_0 \oplus e_1$ one step, first evaluate e_0 one step.

$Small-step\ operational\ semantics\ for\ {\tt NumExp}$

Small-step = we describe every step the computation makes, not just its final result.

$$\frac{\mathbf{e}_0 \to \mathbf{e}_0'}{\mathbf{n}_0 \oplus \mathbf{n}_1 \to \mathbf{n}} \ n = n_0 + n_1(sum) \quad \frac{\mathbf{e}_0 \to \mathbf{e}_0'}{\mathbf{e}_0 \oplus \mathbf{e}_1 \to \mathbf{e}_0' \oplus \mathbf{e}_1} \ (sumL) \quad \frac{\mathbf{e}_1 \to \mathbf{e}_1'}{\mathbf{e}_0 \oplus \mathbf{e}_1 \to \mathbf{e}_0 \oplus \mathbf{e}_1'} \ (sumR)$$

$$\frac{\mathbf{e}_0 \to \mathbf{e}_0'}{\mathbf{n}_0 \otimes \mathbf{n}_1 \to \mathbf{n}} \ n = n_0 \times n_1(prod) \quad \frac{\mathbf{e}_0 \to \mathbf{e}_0'}{\mathbf{e}_0 \otimes \mathbf{e}_1 \to \mathbf{e}_0' \otimes \mathbf{e}_1} \ (prodL) \quad \frac{\mathbf{e}_1 \to \mathbf{e}_1'}{\mathbf{e}_0 \otimes \mathbf{e}_1 \to \mathbf{e}_0 \otimes \mathbf{e}_1'} \ (prodR)$$

Derivations

We can now start to see when running one program gives another.

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We build *derivations* by correctly stacking rules on top of one another. For example:

$$\frac{\overline{1 \oplus 2 \rightarrow 3} \ ^{3=1+2 \, (sum)}}{(1 \oplus 2) \otimes (3 \oplus 4) \rightarrow 3 \otimes (3 \oplus 4)} (prodL)$$

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We think of this as saying

If we start from $(1 \oplus 2) \otimes (3 \oplus 4)$ then $3 \otimes (3 \oplus 4)$ is an intermediate result in the program's execution.

Definition

A judgement $e \to e'$ is derivable if there is a derivation whose conclusion is $e \to e'$.

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Both of the following judgements are derivable:

$$(1\oplus 2)\otimes (3\oplus 4)\to 3\otimes (3\oplus 4) \qquad (1\oplus 2)\otimes (3\oplus 4)\to (1\oplus 2)\otimes 7$$

and here are their derivations:

$$\frac{\overline{1 \oplus 2 \to 3} \stackrel{3=1+2 (sum)}{= (1 \oplus 2) \otimes (3 \oplus 4) \to 3 \otimes (3 \oplus 4)} (prodL) \qquad \frac{\overline{3 \oplus 4 \to 7} \stackrel{7=3+4 (sum)}{= (1 \oplus 2) \otimes (3 \oplus 4) \to (1 \oplus 2) \otimes 7} (prodR)}{(1 \oplus 2) \otimes (3 \oplus 4) \to (1 \oplus 2) \otimes 7} (prodR)$$

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$$\frac{\overline{1 \oplus 2 \to 3} \stackrel{3=1+2 \, (sum)}{=} (prodL)}{(1 \oplus 2) \otimes (3 \oplus 4) \to 3 \otimes (3 \oplus 4)} (prodL) \qquad \frac{\overline{3 \oplus 4 \to 7} \stackrel{7=3+4 \, (sum)}{=} (prodR)}{(1 \oplus 2) \otimes (3 \oplus 4) \to (1 \oplus 2) \otimes 7} (prodR)$$

Question: Is $3 \otimes 2 \to 5$ derivable? What about $(1 \oplus 2) \otimes (3 \oplus 4) \to 3 \otimes 7$?

Specifying an evaluation order

Our rules so far specify that the left-most operand always gets evaluated first:

$$\frac{\mathsf{e}_1 \to \mathsf{e}_1'}{\mathsf{e}_0 \oplus \mathsf{e}_1 \to \mathsf{e}_0 \oplus \mathsf{e}_1'} \ (sumR) \quad \text{and} \quad \frac{\mathsf{e}_1 \to \mathsf{e}_1'}{\mathsf{e}_0 \otimes \mathsf{e}_1 \to \mathsf{e}_0 \otimes \mathsf{e}_1'} \ (prodR)$$

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We could instead choose to evaluate the right-most operand first:

$$\frac{\mathsf{e}_1 \to \mathsf{e}_1'}{\mathsf{n} \oplus \mathsf{e}_1 \to \mathsf{n} \oplus \mathsf{e}_1'} \; (sumR) \quad \text{and} \quad \frac{\mathsf{e}_1 \to \mathsf{e}_1'}{\mathsf{n} \otimes \mathsf{e}_1 \to \mathsf{n} \otimes \mathsf{e}_1'} \; (prodR)$$

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With these rules $(1 \oplus 2) \otimes (3 \oplus 4) \rightarrow (1 \oplus 2) \otimes 7$ is no longer derivable.

Exercise: show that the following judgements are now derivable:

$$(1\oplus 2)\otimes (3\oplus 4) o 3\otimes (3\oplus 4) o 3\otimes (3\oplus 4) o 3\otimes 7 o 21$$

Specifying an evaluation order — these choices can be **very** important!

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$$(1\oplus 2)\otimes (3\oplus 4) o 3\otimes (3\oplus 4) o 3\otimes (3\oplus 4) o 3\otimes 7 o 21$$

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Now we want to talk about sequences of those steps, and their eventual outcomes.

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Definition

We define the *multiple-step evaluation* relation \to^* as follows. We write $e \to^* e'$ if either:

- 1. e = e' or
- 2. there is a finite sequence $e \to e_1 \to e_2 \to \cdots \to e_k \to e'$.

The relation \to^* is called the reflexive and transitive closure of \to .

If $e \to^* n$ we say that n is the *final answer* of e.

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Question: what is the final answer of $(1 \oplus 2) \otimes (3 \oplus 4)$?

Question: is it true that every expression has a final answer? Are there expressions with more than one final answer?

Summarising small-step operational semantics

- \triangleright We describe individual computation steps using the \rightarrow relation;
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This is very fine-grained, but sometimes can be more than we need.

Next we'll look at the big-step approach, where we only describe the final answer of a computation.

Big-step Operational Semantics

Big-step semantics describes the overall result of an execution. We write

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$$\frac{}{\mathsf{n} \Downarrow \mathsf{n}} \ (\mathit{num}) \quad \frac{\mathsf{e}_0 \Downarrow \mathsf{n}_0 \quad \mathsf{e}_1 \Downarrow \mathsf{n}_1}{\mathsf{e}_0 \oplus \mathsf{e}_1 \Downarrow \mathsf{n}} \ \mathit{n} = \mathit{n}_0 + \mathit{n}_1 \, (\mathit{sum}) \quad \frac{\mathsf{e}_0 \Downarrow \mathsf{n}_0 \quad \mathsf{e}_1 \Downarrow \mathsf{n}_1}{\mathsf{e}_0 \otimes \mathsf{e}_1 \Downarrow \mathsf{n}} \ \mathit{n} = \mathit{n}_0 \times \mathit{n}_1 \, (\mathit{prod})$$

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This hides the information about evaluation order, but for our language we can prove it doesn't matter.

A benefit: much fewer rules!

Big-step operational semantics

We can prove that $(1 \oplus 2) \otimes (3 \oplus 4) \Downarrow 21$:

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$$\frac{\overline{1 \Downarrow 1} \stackrel{(num)}{=} \overline{2 \Downarrow 2} \stackrel{(num)}{=} 3 = 1 + 2 \, (sum)}{1 \oplus 2 \Downarrow 3} \frac{\overline{3 \Downarrow 3} \stackrel{(num)}{=} \overline{4 \Downarrow 4} \stackrel{(num)}{=} 7 = 3 + 4 \, (sum)}{3 \oplus 4 \Downarrow 7} \\ \overline{(1 \oplus 2) \otimes (3 \oplus 4) \Downarrow 21}$$

Evaluating operational semantics

Pros:

- ▶ Fine-grained description of program behaviour
- ▶ Makes precise our intuition about which steps the program makes when: very useful when multiple features are involved
- Quite easy to write down (e.g. you could feed the rules into a proof assistant)

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Next up: a denotational semantics for NumExp

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Remember our original intuitive description of what NumExp-expressions mean:

- 1. Every numeral **n** is evaluated to the corresponding number n:
- 2. To find the value associated with an expression of the form $\mathbf{e}_0 \oplus \mathbf{e}_1$ we evaluate the expressions \mathbf{e}_0 and \mathbf{e}_1 and take the sum of the results;
- 3. To find the value associated with an expression of the form $e_0 \otimes e_1$ we evaluate the expressions e_0 and e_1 and take the product of the results

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What is a NumExp-expression "really" representing? A natural number!

Let's turn our intuitive idea into something precise

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- 1. $[\![n]\!] := n;$
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This defines a function $Exp \to \mathbb{N}$ from the set of NumExp-expressions to the set of natural numbers.

Here \mathbb{N} is the semantic domain. By changing the semantic domain, or the denotation of expressions, we can study different kinds of properties.

Using the denotational semantics

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We can make this intuition precise:

Proposition

 $\textit{For all } \texttt{NumExp-} \textit{expressions } \texttt{e}_1, \, \texttt{e}_2, \, \texttt{e}_3, \, \llbracket (\texttt{e}_1 \oplus \texttt{e}_2) \oplus \texttt{e}_3 \rrbracket = \llbracket \texttt{e}_1 \oplus (\texttt{e}_2 \oplus \texttt{e}_3) \rrbracket.$

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Proof.

$$\begin{split} \llbracket (\mathsf{e}_1 \oplus \mathsf{e}_2) \oplus \mathsf{e}_3 \rrbracket &= \llbracket \mathsf{e}_1 \oplus \mathsf{e}_2 \rrbracket + \llbracket \mathsf{e}_3 \rrbracket \\ &= (\llbracket \mathsf{e}_1 \rrbracket + \llbracket \mathsf{e}_2 \rrbracket) + \llbracket \mathsf{e}_3 \rrbracket \\ &= \llbracket \mathsf{e}_1 \rrbracket + (\llbracket \mathsf{e}_2 \rrbracket + \llbracket \mathsf{e}_3 \rrbracket) \\ &= \llbracket \mathsf{e}_1 \rrbracket + \llbracket \mathsf{e}_2 \oplus \mathsf{e}_3 \rrbracket \\ &= \llbracket \mathsf{e}_1 \oplus (\mathsf{e}_2 \oplus \mathsf{e}_3) \rrbracket \end{split}$$

Tying things together

We've seen two perspectives on NumExp-expressions:

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How do these relate?

Theorem

For all expressions e and numbers n, $[\![e]\!] = n$ if and only if $e \downarrow n$.

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Base case: if e is a numeral, say n, then both [e] = n and $e \downarrow n$.

Inductive step: we suppose that $e = e_1 \oplus e_2$ and that the theorem holds for both e_1 and e_2 , that is:

- 1. We assume that for all numbers k_1 and k_2 , $[e_1] = k_1$ if and only if $e_1 \downarrow k_1$ and $[e_2] = k_2$ if and only if $e_2 \downarrow k_2$,
- 2. We prove that for all numbers n, $[e_1 \oplus e_2] = n$ if and only if $e_1 \oplus e_2 \downarrow n$.

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- 2. We prove that for all numbers n, $[e_1 \oplus e_2] = n$ if and only if $e_1 \oplus e_2 \Downarrow n$.

Suppose that $\llbracket e_1 \oplus e_2 \rrbracket = n$. By definition, $\llbracket e_1 \oplus e_2 \rrbracket = \llbracket e_1 \rrbracket + \llbracket e_2 \rrbracket$. Then $\llbracket e_1 \rrbracket$ and $\llbracket e_2 \rrbracket$ are two numbers, let's call them k_1 and k_2 , that add up to n. By (1), $e_1 \downarrow k_1$ and $e_2 \downarrow k_2$, which by the rule sum of big step operational semantics means that $e_1 \oplus e_2 \downarrow n$.

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Conversely, suppose that $\mathbf{e}_1 \oplus \mathbf{e}_2 \Downarrow \mathbf{n}$. This can only be proved using the *sum* rule, so there must be numbers k_1 and k_2 such that $n = k_1 + k_2$ and $\mathbf{e}_1 \Downarrow \mathbf{k}_1$ and $\mathbf{e}_2 \Downarrow \mathbf{k}_2$. By (1) then $\llbracket \mathbf{e}_1 \rrbracket = k_1$ and $\llbracket \mathbf{e}_2 \rrbracket = k_2$. Hence

$$[\![\mathbf{e}_1 \oplus \mathbf{e}_2]\!] = [\![\mathbf{e}_1]\!] + [\![\mathbf{e}_2]\!] = k_1 + k_2 = n.$$

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Corollary

For all NumExp-expressions e_1 , e_2 , e_3 ,

$$(e_1 \oplus e_2) \oplus e_3 \Downarrow n$$
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Proof.

$$(\mathbf{e}_1 \oplus \mathbf{e}_2) \oplus \mathbf{e}_3 \Downarrow n$$
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What we've seen

For the language NumExp, defined by

$$egin{array}{llll} \textit{Num} & \mathbf{n} & \coloneqq & \mathbf{0} & \mathbf{1} & \mathbf{2} & \dots \\ \textit{Exp} & \mathbf{e} & \coloneqq & \mathbf{n} & \mathbf{e} & \mathbf{e} & \mathbf{e} & \mathbf{e} & \mathbf{e} \end{array}$$

we've seen two semantic approaches:

- 1. **Operational:** the steps they take in running to a final answer (both small-step and big-step);
- 2. **Denotational:** the meaning of the expression, expressed as a natural number.

And we've proven these agree. This can be read in two ways:

- 1. Our operational semantics correctly captures the 'meaning' of programs;
- 2. Our denotational semantics correctly captures the way programs run;

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Possible examples:

- variables
- ▶ other forms of data (arrays / lists, boolean values, ...)
- ▶ other control structures (iteration / loops, if-statements, handlers, call-cc, ...)
- procedures / methods / user-defined functions
- ▶ interaction with the world: state, I/O, printing, exceptions, probability...
- ▶ abstract data types (e.g. to define trees, lists, ...)
- higher-order functions
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- types
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Challenge: think about how these things work together!

NumExp is a very limited language! What other features might we want?

In what follows, we'll think about operational and denotational perspectives on some of the simpler cases.

Semantics for variables

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But we know some things are true no matter what numbers we put in, such as:

- ► The associativity rule we proved above
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To understand these things properly we need variables

What is a variable anyway?

We will use variables in our language as a way to stand for any possible number (like in high-school algebra)

This is a functional perspective. It might not be what you're used to!

Contrast to an *imperative* language, where a variable is a pointer to a memory cell

Adding variables to NumExp

The language NumExp + Var is defined by

We assume x stands for anything in a fixed stock of variables x, y, z, \ldots

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An expression e is open if it contains a variable (e.g. $x, 2 \oplus y, ...$)

If it contains no variables, it is closed (e.g. $7 \oplus 3$)

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But if x can be anything, the final result can also be lots of things (but not anything: why not?)

So x is *incomplete*: we don't know how it runs till you tell me what x is

The small-step rules for NumExp + Var are therefore exactly those of NumExp: we give no rules for running variables

Small-step rules for NumExp + Var

$$\frac{\mathbf{e}_0 \to \mathbf{e}_0'}{\mathbf{n}_0 \oplus \mathbf{n}_1 \to \mathbf{n}} \ n = n_0 + n_1(sum) \quad \frac{\mathbf{e}_0 \to \mathbf{e}_0'}{\mathbf{e}_0 \oplus \mathbf{e}_1 \to \mathbf{e}_0' \oplus \mathbf{e}_1} \ (sumL) \quad \frac{\mathbf{e}_1 \to \mathbf{e}_1'}{\mathbf{e}_0 \oplus \mathbf{e}_1 \to \mathbf{e}_0 \oplus \mathbf{e}_1'} \ (sumR)$$

$$\frac{\mathbf{e}_0 \to \mathbf{e}_0'}{\mathbf{n}_0 \otimes \mathbf{n}_1 \to \mathbf{n}} \ n = n_0 \times n_1(prod) \quad \frac{\mathbf{e}_0 \to \mathbf{e}_0'}{\mathbf{e}_0 \otimes \mathbf{e}_1 \to \mathbf{e}_0' \otimes \mathbf{e}_1} \ (prodL) \quad \frac{\mathbf{e}_1 \to \mathbf{e}_1'}{\mathbf{e}_0 \otimes \mathbf{e}_1 \to \mathbf{e}_0 \otimes \mathbf{e}_1'} \ (prodR)$$

Examples of valid NumExp + Var-derivations:

$$(1 \oplus 2) \otimes x \to 3 \otimes x$$
 $(1 \oplus y) \otimes (3 \oplus 4) \to (1 \oplus y) \otimes 7$

 $\frac{1 \oplus 2 \to 3}{(1 \oplus 2) \otimes x \to 3 \otimes x} \stackrel{(prodL)}{=} \frac{3 \oplus 4 \to 7}{(1 \oplus y) \otimes (3 \oplus 4) \to (1 \oplus y) \otimes 7} \stackrel{(prodR)}{=}$

Big-step rules for NumExp + Var

For the big-step rules, we want to say what the eventual ouput of an expression is.

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Big-step rules (just as for NumExp)

$$\frac{1}{n \Downarrow n} (num) \quad \frac{\mathsf{e}_0 \Downarrow \mathsf{n}_0 \quad \mathsf{e}_1 \Downarrow \mathsf{n}_1}{\mathsf{e}_0 \oplus \mathsf{e}_1 \Downarrow \mathsf{n}} \quad n = n_0 + n_1 (sum) \quad \frac{\mathsf{e}_0 \Downarrow \mathsf{n}_0 \quad \mathsf{e}_1 \Downarrow \mathsf{n}_1}{\mathsf{e}_0 \otimes \mathsf{e}_1 \Downarrow \mathsf{n}} \quad n = n_0 \times n_1 (prod)$$

Big-step rules for NumExp + Var

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An alternative approach would be to say variables don't run:

$$\overline{x \Downarrow x}$$
 (var)

The meaning of a closed term is a number:

$$[\![7 \oplus (\mathbf{3} \otimes \mathbf{1})]\!] = [\![7]\!] + [\![\mathbf{3} \otimes \mathbf{1}]\!] = [\![7]\!] + ([\![\mathbf{3}]\!] \times [\![\mathbf{1}]\!]) = 21$$

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What is the meaning of an open term?

It depends on the values of the variables: on the environment

Definition

An environment ρ for a NumExp + Var-expression e is a function assigning to each variable in e a natural number. Write Env(e) for the set of environments of e.

Formally: ρ is a partial function $Vars \longrightarrow \mathbb{N}$ which is defined on all the variables in e.

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More generally: what is the denotation of $(3 \otimes x) \otimes (x \oplus y)$?

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The denotation of a NumExp + Var-expression e is a function $Env(e) \to \mathbb{N}$. For an environment ρ in Env(e), the denotation of e is given by recursion:

- 1. $[x](\rho) := \rho(x)$
- 2. $[\![n]\!](\rho) := n;$
- 3. $[\![e_0 \oplus e_1]\!](\rho) := [\![e_0]\!](\rho) + [\![e_1]\!](\rho);$
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The definition is still compositional

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Example: what is the denotation of $x \oplus y$?

$$[\![\mathtt{x}\oplus\mathtt{y}]\!](\rho)=[\![\mathtt{x}]\!](\rho)+[\![\mathtt{y}]\!](\rho)=\rho(\mathtt{x})+\rho(\mathtt{y})$$

What about $x \otimes y$?

Tying things together

Proposition

For any closed expression e, we have $e \downarrow n$ if and only if [e] = n.

Proven in the same way as for NumExp

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Something more interesting:

Proposition

For any expression e containing the variables x_1, \ldots, x_k , and any environment ρ assigning $\rho(x_1) = m_1, \ldots, \rho(x_k) = m_k$:

$$[\![e]\!](\rho) = n \quad \text{ if and only if } \quad e' \Downarrow n$$

where e' is obtained from e by replacing each x_i by m_i .

When you have variables, the meaning of programs depends on the values of the variables.

Open expressions don't run, but we can think about their operational semantics by thinking about how we fill in the variables.

For the denotational semantics, we think of programs as depending on a choice of environment. So programs are now interpreted as functions.

If we want to study different properties or features, we need different models. A lot of the work in denotational semantics is coming up with these models: makes use of powerful tools from mathematics (algebra, topology, logic, category theory, ...)