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Denotational semantics

What we're doing today

- We're looking at how to reason about the effect of a program by mapping it into mathematical objects
 - Specifically, answering the question “which function does this program compute?”
- We'll run into some issues when we get to programs that potentially never stop with a result
 - We're going for functions between environment states, they can only be *partial* functions when there are states that produce no end state

What is a program, anyway?

- As far as the machine is concerned: instructions, data, memory, yadda yadda...
- Those are all configurations of tiny switches, oblivious to the computation they represent in the same way that a traffic light doesn't know what its states and transitions tell people
- Independent of the machine, a program is also a description of a method to compute a result
 - To programmers, at least



What can we compute?

- A *primitive recursive function* is defined in terms of
 - The *constant function* 0 (which takes no arguments, and outputs 0)
 - The *successor function* $S(k) = k+1$ (which adds 1 to a number)
 - The *projection function* $P_i^n(x_1, \dots, x_i, \dots, x_n) = x_i$ (which selects value number i out of a bunch of values)
- These are enough to define a bit of arithmetic:
 - The most tedious addition method in the world...
 - $\text{add}(0, x) = x$ ← base: $x+0 = x$
 - $\text{add}(S(n), x) = S(P_1^3(\text{add}(n, x), n, x))$ ← step: $x+(n+1)=(x+n)+1$
 - The most tedious subtraction method follows, from sub. by differences
 - Multiply and divide can be built from add & sub, and so on and so forth...
 - It all boils down to simple schemes of counting one step at a time

The primitive side of it

- Primitive recursive functions can compute anything which maps uniquely onto all the natural numbers, under some kind of encoding/interpretation
- That is, they're *total*, meaning “uniquely defined for all admissible sets of inputs”
- Everything which maps to natural numbers is quite a bunch of stuff, but it's restricted to programs that terminate with a defined result
 - Hence, no branching and nothing fancy, please
 - That's kind of primitive



Partial recursive functions

- If we add the power of saying something like

$(\exists y) R(y,x)$

to mean

“The smallest x such that $R(y,x)$ is true”, or

“0” if no such y exists

we get a conditional, of sorts.

- We also have equivalence with Turing machines: conditionals + jumps can be written as conditionals + recursion
 - Writing out anything nontrivial in this notation is also the equivalent amount of fun as writing them out in terms of Turing machines
 - Let's not go there, the point is that they're equivalent



That's the edge of the world

(computationally speaking)

- With enough spare time on your hands, it can be proven that the partial recursive functions are also exactly what can be computed by
 - Lambda calculus
 - Register machines
 - A few more exotic models of computation
- At a point where he must have been tired of proving things, Alonzo Church (λ -calculus Guy) made his mind up that these are the functions we can get from any computational model, and left it at that. We'll take his word for it.
- As we know, loops can be infinite, so these functions don't have values for *all* inputs any more



What a program is

- Hence, one way of looking at “a program” is that it's an evaluation of a partial recursive function.
- Neither programmer nor program may care, it just means that you can always write it out that way
 - Programs which stop have their function's value for the given input
 - Programs which don't stop don't have any kind of value, because they never produce one
- Infinite loops can be very annoying
 - At least when you wanted to calculate a result
- Infinite loops can be very useful
 - I will be upset if my laptop halts to conclude that the value of the operating system is 42

Which programs stop?

- We can not compute the answer to that

- Suppose that we could, and had a function

```
halts ( p(x) ) =  
  if magical_analysis(p(x)) then yes  
  else no
```

- Never mind how it works, just suppose that it can take any function p with any input x , and answer whether or not it returns
- This lets us write a function that answers only about programs which have themselves as input:

```
halts_on_self ( p ) =  
  if ( halts (p(p)) ) then yes  
  else no
```



I have a cunning plan...

- We can easily make a function run forever on purpose, so write one which does that when a function-checking function halts on itself:

```
trouble ( p ) =  
  if ( halts_on_self(p) ) then loop_forever  
  else yes
```

- Since 'trouble' is a function-checking function, we can see what it would make of itself:

```
trouble ( trouble ) =  
  if ( halts_on_self(trouble) ) then loop_forever  
  else yes
```

which is equivalent to

```
trouble ( trouble ) =  
  if ( halts(trouble(trouble)) ) then loop_forever  
  else yes
```

- If it halts, it should loop forever ; if it loops forever, it should halt.
- This program can not exist, so the halting function can not.

That's why this gets messy

- We just looked at a pseudocode-y variant of Turing's proof that the halting problem is not computable
- It can also be written out in terms of a counting scheme and partial recursive functions, but this way may be a bit more intuitive
- Bottom line: we can't expect to find well behaved functions for every arbitrary program
- Without that, we have to take extra care of how to define a program in terms of its function

Revisiting the operational approach

- Focus was on *how a program is executed*
- Each syntactic construct is interpreted in terms of the steps taken to modify the state it runs in
- The *semantic function* is described by a recipe for how to compute its value (the final state), when it has one

“Denote” (verb):

- To serve as an indication of
- To serve as an arbitrary mark for
- To stand for

Denotational semantics

- The program is a way to symbolize a semantic function
- Its characters are arbitrary, as long as we can systematically map them onto the mathematical objects they represent
 - The string “10” can mean natural number 10 (decimal), 2 (binary), 16 (hexadecimal)...
 - ...in Roman numerals, 10 is “X”...
 - The symbol is one thing, what it denotes is another



Basic parts

- The hallmarks of denotational semantics are
 - There is a semantic clause for all basis elements in a category of things to symbolize
 - For each method of combining them, there is a semantic clause which specifies how to combine the semantic functions of the constituents

The simplest illustration

- Take this grammar for arbitrary binary strings:
 - $b \rightarrow 0$
 - $b \rightarrow 1$
 - $b \rightarrow b 0$
 - $b \rightarrow b 1$
- ...and let $b, 0, 1$ stand for the symbols in our grammar, while $\{0, 1, 2, \dots\}$ are the natural numbers...

A semantic function

- We can write a function N to attach the natural numbers to valid statements in the grammar:

$$N(0) = 0$$

$$N(1) = 1$$

$$N(b\ 0) = 2 * N(b)$$

$$N(b\ 1) = 2 * N(b) + 1$$

- This is just the ordinary interpretation of binary strings as unsigned integers, written out all formal-like
- Each notation is related to the mathematical object it denotes (here, it's a natural number)

Finding a value

- Using this formalism, we can write out what the value of “1001” is:

$$\begin{aligned} N(1001) &= 2 * N(100) + 1 \\ &= 2 * (2 * N(10)) + 1 \\ &= 2 * (2 * (2 * N(1))) + 1 \\ &= 2 * (2 * (2 * 1)) + 1 \\ &= 2 * (4) + 1 \\ &= \underline{9} \end{aligned}$$

$$\begin{aligned} N(0) &= 0 \\ N(1) &= 1 \\ N(b\ 0) &= 2 * N(b) \\ N(b\ 1) &= 2 * N(b) + 1 \end{aligned}$$



Finding a value

Symbols from grammar are systematically replaced with their semantic interpretations

$$\begin{aligned}
 & \underline{N(1001)} \\
 &= 2 * \underline{N(100)} + 1 \\
 &= 2 * (2 * \underline{N(10)}) + 1 \\
 &= 2 * (2 * (2 * \underline{N(1)})) + 1 \\
 &= 2 * (2 * (2 * 1)) + 1 \\
 &= 2 * (4) + 1 \\
 &= \underline{\mathbf{9}}
 \end{aligned}$$

Result is a thing the input can't contain, and the compiler can't understand

Is this a valuable thing?

- Well... the example is so small that it's almost pointless
- *In principle*, however:
 - Assume an implementation which sets lowest order bit according to last symbol in string, and shifts left to multiply by 2
 - In a signed byte-wide register w. 2's complement, this would make the value of $11111111 = -1$, whereas $N(11111111) = 255$
 - With semantics defined by the implementation, whatever comes out is the standard of what's correct
 - Semantic specification in hand, we can say that such an implementation doesn't do what it's supposed to



Remember the *While* language:

- Syntax:

$a \rightarrow n \mid x \mid a1 + a2 \mid a1 * a2 \mid a1 - a2$

$b \rightarrow \text{true} \mid \text{false} \mid a1 = a2 \mid a1 \leq a2 \mid \neg b \mid b1 \ \& \ b2$

$S \rightarrow x := a \mid \text{skip} \mid S1 ; S2$

$S \rightarrow \text{if } b \text{ then } S1 \text{ else } S2 \mid \text{while } b \text{ do } S$

- Syntactic categories:

n is a numeral

x is a variable

a is an arithmetic expression, valued $A[a]$

b is a boolean expression, valued $B[b]$

S is a statement



Denotational semantics for *While*

- What we attach to the statements should be *a function which describes the effect of a statement*
 - The steps taken to create that effect is presently not our concern

- Skip and assignment are still easy:

$$S_{ds} [x:=a] s = s [x \rightarrow A[a]s] \quad (\text{as before})$$

$$S_{ds} [\text{skip}] = \text{id} \quad (\text{identity function})$$

- Composition of statements corresponds to composition of functions:

$$S_{ds} [S1; S2] = S_{ds} [S2] \circ S_{ds} [S1]$$

“S2-function applied to the result of S1-function”, *cf.* how $f \circ g (x) \leftrightarrow f (g (x))$



Conditions need a notation

- Specifically, a function which goes from one boolean and two other functions, and results in one of the two functions
- Let's call it *cond*, and write

$$S_{ds} [\text{if } b \text{ then } S1 \text{ else } S2] = \text{cond} (B[b], S_{ds} [S1], S_{ds} [S2])$$

with the understanding that, for example,

$$\text{cond} (B[\text{true}], S_{ds} [x:=2], S_{ds} [\text{skip}]) s = s [x \rightarrow A[2]s]$$

and

$$\text{cond} (B[\text{false}], S_{ds} [x:=2], S_{ds} [\text{skip}]) s = \text{id } s$$



'while b do S' gets a little tricky

- What we need is a function applied to a function applied to a function... as many times as the condition is true
- Problems:
 - The program text does not always determine how many times the condition will be true
 - It is not guaranteed that it ever will be false
- The function we are looking for is specific to each program
 - We have a notation to denote “the outcome of the loop body”: $S_{ds}[S]$
 - We need one to denote “the outcome of repeating the loop body an unknown number of times”

Calculating with *functionals*

- In the manner that a variable is a named placeholder for a range of values...
- ...and a function is a named placeholder for a way to combine variables...
- ...so a *functional* F is a generalized range of functions, which can stand for any of them



Functions as unknowns

- This lets us treat a functional F as “the function which fits our constraints”
 - in the same way we can write x for “the value which fits the constraint $x^2+12 = 42$ ”, and treat x as the solution to that
- Looking at how to read 'while b do S', we can write out its halting condition in terms of *cond* (from before), and an unknown function g :

$$F g = \text{cond} (B[b], g \circ S_{\text{ds}}[S], \text{id})$$
- That is: given any function g (as “input”), the functional F represents either the effect of applying g to the outcome of the loop body, or the identity function, depending on $B[b]$.
- The resulting function can be applied to states where $B[b]$ has a value



Definition of a “fixed point”

- This is mercifully simple
- *A fixed point* is where taking an argument and doing some stuff to it results in the argument itself
- *i.e. when $f(x) = x$, then x is a fixed point of f*
- 2 is a fixed point of $f(x) = (x^2 / 2x) + 1$
- It's “fixed” since it doesn't change no matter how many times you apply the function:
$$x = f(x) = f(f(x)) = f(f(f(x))) = \dots \text{and so on}$$

Thus, we can (partly) describe the effect of 'while b do S'

- $S_{ds} [\text{while } b \text{ do } S] = \text{FIX } F$
 where $F g = \text{cond} (B[b], g \circ S_{ds}[S], \text{id})$
- That is, it's a function where it may be the case that
 $\text{cond}(B[b], S_{ds}[S], \text{id}) s = s'$
 $\text{cond}(B[b], S_{ds}[S], \text{id}) s' = s''$
 ...
 $\text{cond}(B[b], S_{ds}[S], \text{id}) s^{(n-1)} = s^{(n)}$

but eventually,

$$\text{cond}(B[b], S_{ds}[S], \text{id}) s^{(n)} = s^{(n)}$$

and the loop doesn't alter anything any more.

- That will be the case when it has ended
- When it doesn't end, we can't describe the effect, and no solution should be defined

So, what's the outcome of a loop?

(Without running it?)

- Take the factorial program we looked at for the operational case:

while $\neg(x=1)$ do ($y:=y*x; x:=x-1$)

- We're interested in functions g that satisfy

cond ($B[b], g \circ S_{ds}[S], id$) $s = s$

that is,

cond ($B[b], g \circ [x \rightarrow A[x:=x-1]] \circ [y \rightarrow A[y*x]], id$) $s = s$

- Generally, these have the form of the functional

$(F g) s = g s$ if x is different from 1 (do something to the state)

$(F g) s = s$ if $x = 1$ (that's the loop halting condition)

What kind of g fits $\text{FIX } (F g)$?

- Here's one:

```

g1 = g1 s      if x>1
g1 = s         if x=1
g1 = undef    if x<1

```



Intuitive from program,
Loop eternally into neg. x if
it starts out too small

- Here's another:

```

g2 = g2 s      if x>1
g2 = s         if x=1
g2 = s         if x<1

```



Also a function which
gives s back when $x=1$

- These are both fixed points of the functional $(F g)$

- Substitute $g1$ and $g2$ into it, you get that

$(F g1) s = g1 s$

and

$(F g2) s = g2 s$



An additional constraint

- We can create any number of g-s like this, we want to narrow them down into one which reflects what the program means
- Since we've abstracted away the implementation, we need to say something about which fixed points are admissible

When things loop forever

- If the execution of (while b do S) in state s never halts, there is an infinite number of states s_1, s_2, \dots such that
 - $B[b] s_i = \text{tt}$ (i.e. the condition is true)
 - $S_{\text{ds}}[S] s_i = s_{i+1}$ (i.e. the loop continues to churn through states)

- An immediate example is

while $\neg(x=0)$ do skip

and its matching functional

$(F g) s = g s$ if x is different from 0 in s

$(F g) s = s$ if $x = 0$ in s



Which fixed point are we after?

- The reason we have an infinity to choose from:
 - Any g where $g\ s = s$ if $x=0$ in s is a fixed point
- The intuition we aim to capture is that

$$g\ s = \text{undef} \quad \text{if } x \text{ is different from } 0$$

$$g\ s = s \quad \text{if } x=0 \text{ in } s$$
- Every other g will have to say something about s in at least some cases when x isn't 0:

$$g'\ s = \text{undef} \quad \text{if } x > 0$$

$$g'\ s = s \quad \text{if } x = 0$$

$$g'\ s = s[y \rightarrow A[y+1]s] \quad \text{if } x < 0$$
 - This also captures the effect of the program when it is defined, but adds a bunch of unrelated nonsense about y when it is not defined
 - Still a function that captures the effect of the program as much as the other one

Between the lines

- There is an *ordering* of all possible choices of g , comparing them by how much they specify
- The relationship that
$$g_0 \leq g \text{ implies } g \leq g_0 \quad (\text{but not the other way around})$$
indicates that all the effects of g_0 are also in g
- Writing this as $g_0 \leq g$,
(with a slightly bent 'smaller-or-equal' character, to signify that this is a different type of comparison than that between numbers)
we get a notion that there is a 'minimal' g

Making a unique choice

- Add the understanding that 'undef' implies anything and everything
 - Like 'false' does for the implication in boolean logic
- The least fixed point in this sense is the most concise description of a loop's effect
 - We'll take that one as the semantic function, then

Sum total

- Denotational semantics for *While*:

$$S_{ds} [x:=a] s = s [x \rightarrow A[a]s]$$

$$S_{ds} [\text{skip}] = \text{id}$$

$$S_{ds} [S1; S2] = S_{ds} [S2] \circ S_{ds} [S1]$$

$$S_{ds} [\text{if } b \text{ then } S1 \text{ else } S2] = \text{cond} (B[b], S_{ds} [S1], S_{ds} [S2])$$

$$S_{ds} [\text{while } b \text{ do } S] = \text{FIX } F$$

where $F g = \text{cond} (B[b], g \circ S_{ds}[S], \text{id})$

and $\text{FIX } F$ is the least fixed point



“Precision of an analysis”

- I alluded at one point that there is a notion of more and less *precise* semantic analyses
 - and mentioned that it carries a particular meaning of “precise”
- The part about finding the desired fixed point is it.
 - “Most precise” is not the fixed point with the most information in
 - It is the one which most accurately represents what we know about the program



But seriously, *why the...?*

- Once again, we have taken an idea that plays a part in the curriculum and stretched it, to see how it works out when applied to a whole (but small) language
- The result is an algebra of semantic functions
 - and a notion that our handle on halting is a fixed point of a semantic function
 - and an idea that such a function may have multiple fixed points
 - and that these relate to each other in an order determined by how much information they specify
 - ...which I will say just a tiny bit more about next time

No seriously, *why the...?*

- Ok. The next (and last) part of theory is a framework for deciding on how control flow affects what we can say about the state of a program.
- Its function maps statements to sets of variables, values, *etc.* to reason about the program environment
- It halts on a fixed point of the function which produces those sets of things
- It relates that fixed point to other fixed points in a ranking of how precise their information is, using an unorthodox choice of operators
- It's pretty much a variant of what we just looked at, except it is restricted to capturing state information which enables optimizations

So, that's what comes next?

- Yes.
- It'll be a little easier to anchor the state information in aspects of the source code, but we'll still deal with some properties that aren't embodied in the compiler program
- Hopefully, this overview may contribute a way to look at dataflow analysis which makes it easier to see a system among its details
- If it doesn't, you can figure things out anyway
 - Don't lose any sleep over denotational semantics if you can follow DF analysis without seeing the correspondence, it's meant as an alternate perspective

