#### GLOBAL VALUE NUMBERING IN FACTOR

### A Thesis

Presented to the

Faculty of

California State Polytechnic University, Pomona

 $\label{eq:continuous} \mbox{In Partial Fulfillment}$  Of the Requirements for the Degree  $\mbox{Master of Science}$ 

In

Computer Science

By Alex Vondrak 2011

## SIGNATURE PAGE

| THESIS:  | GLOBAL VALUE NUMBERING IN FACTOR |
|--|----------------------------------|
| AUTHOR:  | Alex Vondrak                     |
| DATE SUBMITTED:  | Summer 2011                      |
|  | Computer Science                 |
| Dr. Craig Rich<br>Thesis Committee Chair<br>Computer Science |                                  |
| Dr. Daisy Sang<br>Computer Science                           |                                  |
| Dr. Amar Raheja<br>Computer Science                          |                                  |

# Acknowledgments

To Lindsay—he is my rock

## Abstract

TODO

## Table of Contents

| Si           | gnat                        | ure Page                     | ii            |
|--------------|-----------------------------|------------------------------|---------------|
| $\mathbf{A}$ | ckno                        | wledgments                   | iii           |
| A            | bstra                       | $\operatorname{\mathbf{ct}}$ | iv            |
| Li           | st of                       | Figures                      | $\mathbf{vi}$ |
| 1            | Intr                        | roduction                    | 1             |
| 2            | Lan                         | guage Primer                 | 3             |
|              | 2.1                         | Stack-Based Languages        | 3             |
|              | 2.2                         | Stack Effects                | 6             |
|              | 2.3                         | Definitions                  | 8             |
|              | 2.4                         | Object Orientation           | 10            |
|              | 2.5                         | Combinators                  | 15            |
| 3            | $\operatorname{Th}\epsilon$ | Factor Compiler              | <b>25</b>     |
|              | 3.1                         | Organization                 | 25            |
|              | 3.2                         | High-level Optimizations     | 27            |
|              | 3.3                         | Low-level Optimizations      | 37            |
| 4            | Val                         | ue Numbering                 | <b>52</b>     |
|              | 4.1                         | Local Value Numbering        | 53            |
|              | 4.2                         | Global Value Numbering       | 69            |
|              | 4.3                         | Redundancy Elimination       | 86            |
|              | 4.4                         | Results                      | 98            |
|              | 4.5                         | Future Work                  | 104           |
| $\mathbf{R}$ | efere                       | nces                         | 111           |

# List of Figures

| 1  | Visualizing stack-based calculation          | 3  |
|----|--|----|
| 2  | Data structure literals in Factor            | 5  |
| 3  | Quotations                                   | 5  |
| 4  | Stack shuffler words and their effects       | 7  |
| 5  | Hello World in Factor                        | 8  |
| 6  | The Euclidean norm, $\sqrt{x^2 + y^2}$       | 8  |
| 7  | norm example                                 | 9  |
| 8  | norm refactored                              | 9  |
| 9  | Basic tuple definition syntax                | 10 |
| 10 | Simple tuple examples                        | 11 |
| 11 | Special slot specifiers                      | 12 |
| 12 | Set instances                                | 13 |
| 13 | Set cardinality using Factor's object system | 14 |
| 14 | Conditional evaluation in Factor             | 15 |
| 15 | if's stack effect varies                     | 16 |
| 16 | Loops in Factor                              | 17 |
| 17 | Higher-order functions in Factor             | 19 |
| 18 | Preserving combinators                       | 20 |
| 19 | Cleave combinators                           | 22 |
| 20 | Spread combinators                           | 23 |
| 21 | Apply combinators                            | 24 |
| 22 | High-level IR nodes                          | 28 |
| 23 | [ 1 + ] build-tree                           | 29 |
| 24 | [ swap ] build-tree                          | 30 |
| 25 | [ { fixnum } declare ] build-tree            | 31 |
| 26 | [ "Error!" throw ] build-tree                | 31 |
| 27 | [ [ 1 ] [ 2 ] <b>if</b> ] build-tree         | 33 |
| 28 | Optimization passes on the high-level IR     | 34 |

| 29 | Escaping vs. non-escaping tuple allocations                       | 36 |
|----|---|----|
| 30 | Optimization passes on the low-level IR                           | 40 |
| 31 | tail-call before and after optimize-tail-calls                    | 4  |
| 32 | [ ] [ ] if before and after delete-useless-conditionals           | 42 |
| 33 | [ 1 ] [ 2 ] if dup before and after split-branches                | 4  |
| 34 | 0 100 [ 1 fixnum+fast ] times before and after join-blocks        | 4! |
| 35 | 0 100 [ 1 fixnum+fast ] times after normalize-height              | 40 |
| 36 | 0 100 [ 1 fixnum+fast ] times after construct-ssa                 | 4  |
| 37 | 0 100 [ 1 fixnum+fast ] times after value-numbering               | 49 |
| 38 | 0 100 [ 1 fixnum+fast ] times after copy-propagation              | 50 |
| 39 | 0 100 [ 1 fixnum+fast ] times after eliminate-dead-code           | 5  |
| 40 | 0 100 [ 1 fixnum+fast ] times after finalize-cfg                  | 5  |
| 41 | The compiler.cfg.value-numbering.graph vocabulary                 | 5  |
| 42 | Main words from compiler.cfg.value-numbering                      | 5  |
| 43 | The workhorse of compiler.cfg.value-numbering                     | 58 |
| 44 | 0 100 [ 1 fixnum+fast ] times before and after value-numbering    | 62 |
| 45 | The final representation for 0 100 [ 1 fixnum+fast ] times        | 68 |
| 46 | The compiler.cfg.gvn.graph vocabulary                             | 72 |
| 47 | Main logic in compiler.cfg.gvn                                    | 7  |
| 48 | Iterated rewriting in compiler.cfg.gvn                            | 7  |
| 49 | Assigning value numbers in compiler.cfg.gvn                       | 7! |
| 50 | $\phi$ expressions in compiler.cfg.gvn.expressions                | 76 |
| 51 | 0 100 [ 1 fixnum+fast ] times before the new value numbering pass | 78 |
| 52 | 10 is not available in block 4                                    | 87 |
| 53 | 10 is available in block 4  | 88 |
| 54 | The compiler.cfg.gvn.avail vocabulary                             | 89 |
| 55 | Branch folding before and after                                   | 9  |
| 56 | Rewriting words that are their own inverses                       | 95 |
| 57 | Global common subexpression elimination in compiler.cfg.gvn       | 9; |
| 58 | New global value-numbering word in compiler.cfg.gvn               | 9! |

| 59 | 0 100 [ 1 fixnum+fast ] times before the new value-numbering | 96  |
|----|--|-----|
| 60 | 0 100 [ 1 fixnum+fast ] times after the new value-numbering  | 97  |
| 61 | 0 100 [ 1 fixnum+fast ] times after copy-propagation         | 98  |
| 62 | 0 100 [ 1 fixnum+fast ] times after eliminate-dead-code      | 99  |
| 63 | 0 100 [ 1 fixnum+fast ] times after finalize-cfg             | 100 |
| 64 | Abstract interpretation over signs                           | 107 |

#### 1 Introduction

Compilers translate programs written in a source language (e.g., Java) into semantically equivalent programs in some target language (e.g., assembly code). They let us make our source language arbitrarily abstract so we can write programs in ways that humans understand while letting the computer execute programs in ways that machines understand. In a perfect world, such translation would be straightforward. Reality, however, is unforgiving. Straightforward compilation results in clunky target code that performs a lot of redundant computations. To produce efficient code, we must rely on less-than-straightforward methods. Typical compilers go through a stage of optimization, whereby a number of semantics-preserving transformations are applied to an intermediate representation of the source code. These then (hopefully) produce a more efficient version of said representation. Optimizers tend to work in phases, applying specific transformations during any given phase.

Global value numbering (GVN) is such an analysis performed by many highly-optimizing compilers. Its roots run deep through both the theoretical and the practical. Using the results of this analysis, the compiler can identify expressions in the source code that produce the same value—not just by lexical comparison (i.e., variables having the same name), but by proving equivalences between what's actually computed at runtime. These expressions can then be simplified by further algorithms for redundancy elimination. This is the very essence of most compiler optimizations: avoid redundant computation, giving us code that runs as quickly as possible while still following what the programmer originally wrote.

High-level, dynamic languages tend to suffer from efficiency issues: they're often interpreted rather than compiled, and perform no heavy optimization of the source code. However, the Factor language (http://factorcode.org) fills an intriguing design niche, as it's very high-level yet still fully compiled. It's still young, though, so its compiler craves all the improvements it can get. In particular, while Factor currently has a *local* value numbering analysis, it is inferior to GVN in several significant ways.

In this thesis, we explore the implementation and use of GVN in improving the strength of optimizations in Factor. Because Factor is a young and relatively unknown language, Chapter 2 provides a short tutorial, laying a foundation for understanding the changes. Chapter 3 describes the overall architecture of the Factor compiler, highlighting where the exact contributions of this thesis fit in. Finally, Chapter 4 goes into detail about the existing and new value numbering passes, closing with a look at the results achieved and directions for future work.

All the code for the GVN phase was written atop Factor version 0.94, and a copy of it can be found in the appendix. In the unlikely event that you want to cite this thesis, you may use the following BIRTEY entry:

title = {Global Value Numbering in Factor},

month = sep,

year

**=** {2011},

school = {California Polytechnic State University, Pomona},

```
may use the following BIBTEX entry:

Cmastersthesis{vondrak:11,

author = {Alex Vondrak},

make sure

it's single-

page
```

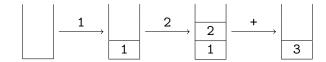


Figure 1: Visualizing stack-based calculation

### 2 Language Primer

#### citations for this history are fragmented across the internet

Factor is a rather young language created by Slava Pestov in September of 2003. Its first incarnation targeted the Java Virtual Machine (JVM) as an embedded scripting language for a game. As such, its feature set was minimal. Factor has since evolved into a general-purpose programming language, gaining new features and redesigning old ones as necessary for larger programs. Today's implementation sports an extensive standard library and has moved away from the JVM in favor of native code generation. In this chapter, we cover the basic syntax and semantics of Factor for those unfamiliar with the language. This should be just enough to understand the later material in this thesis. More thorough documentation can be found via Factor's website, http://factorcode.org.

## 2.1 Stack-Based Languages

Like Reverse Polish Notation (RPN) calculators, Factor's evaluation model uses a global stack upon which operands are pushed before operators are called. This naturally facilitates postfix notation, in which operators are written after their operands. For example, instead of 1 + 2, we write 1 2 +. Figure 1 shows how 1 2 + works conceptually:

- 1 is pushed onto the stack
- 2 is pushed onto the stack
- + is called, so two values are popped from the stack, added, and the result (3) is pushed back onto the stack

Other stack-based programming languages include Forth [American National Standards Institute and Computer and Business Equipment Manufacturers Association 1994], Cat [Diggins 2007], and PostScript [Adobe Systems Incorporated 1999].

The strength of this model is its simplicity. Evaluation essentially goes left-to-right: literals (like 1 and 2) are pushed onto the stack, and operators (like +) perform some computation using values currently on the stack. This "flatness" makes parsing easier, since we don't need complex grammars with subtle ambiguities and precedence issues. Rather, we basically just scan left-to-right for tokens separated by whitespace. In the Forth tradition, functions are called *words* since they're made up of any contiguous non-whitespace characters. This also lends to the term *vocabulary* instead of "module" or "library". In Factor, the parser works as follows.

- If the current character is a double-quote ("), try to parse ahead for a string literal.
- Otherwise, scan ahead for a single token.
  - If the token is the name of a parsing word, that word is invoked with the parser's current state.
  - If the token is the name of an ordinary (i.e., non-parsing) word, that word is added to the parse tree.
  - Otherwise, try to parse the token as a numeric literal.

Parsing words serve as hooks into the parser, letting Factor users extend the syntax dynamically. For instance, instead of having special knowledge of comments built into the parser, the parsing word! scans forward for a newline and discards any characters read (adding nothing to the parse tree).

Similarly, there are parsing words for what might otherwise be hard-coded syntax for data structure literals. Many act as sided delimeters: the parsing word for the left-delimiter will parse ahead until it reaches the right-delimiter, using whatever was read in between to add objects to the data structure. For example, { 1 2 3 } denotes an array of three numbers. Note the deliberate spaces in between the tokens, so that the delimeters are

themselves distinct words. In  $\{ _{\sqcup}1_{\sqcup}2_{\sqcup}3_{\sqcup} \}$  (with spaces as marked), the parsing word  $\{$  parses objects until it reaches  $\}$ , collecting the results into an array. The  $\{$  word would not be called if not for that space, whereas  $\{1_{\sqcup}2_{\sqcup}3\}$  parses as the word  $\{1,$  the number 2, and the word  $3\}$ —not an array. Further, since the left-delimeter words parse recursively, such literals can be nested, contain comments, etc. Other literals include the following.

Figure 2: Data structure literals in Factor

A particularly important set of parsing words in Factor are the square brackets, [ and ]. Any code in between such brackets is collected up into a special sequence called a quotation. Essentially, it's a snippet of code whose execution is suppressed. The code inside a quotation can then be run with the call word. Quotations are like anonymous functions in other languages, but the stack model makes them conceptually simpler, since we don't have to worry about variable binding and the like. Consider a small example like 1 2 [ + ] call. You can think of call working by "erasing" the brackets around a quotation, so this example behaves just like 1 2 +. Figure 3 shows its evaluation: instead of adding the numbers immediately, + is placed in a quotation, which is pushed to the stack. The quotation is then invoked by call, so + pops and adds the two numbers and pushes the result onto the stack. We'll show how quotations are used in Section 2.5.



Figure 3: Quotations

#### 2.2 Stack Effects

Everything else about Factor follows from the stack-based structure outlined in Section 2.1. Consecutive words transform the stack in discrete steps, thereby shaping a result. In a way, words are functions from stacks to stacks—from "before" to "after"—and whitespace is effectively function composition. Even literals (numbers, strings, arrays, quotations, etc.) can be thought of as functions that take in a stack and return that stack with an extra element pushed onto it.

With this in mind, Factor requires that the number of elements on the stack (the *stack height*) is known at each point of the program in order to ensure consistency. To this end, every word is associated with a *stack effect* declaration using a notation implemented by parsing words. In general, a stack effect declaration has the form

```
( input1 input2 ... -- output1 output2 ... )
```

where the parsing word ( scans forward for the special token -- to separate the two sides of the declaration, and then for the ) token to end the declaration. The names of the intermediate tokens don't technically matter—only how many of them there are. However, names should be meaningful for clarity's sake. The number of tokens on the left side of the declaration (before the --) indicates the minimum stack height expected before executing the word. Given exactly this number of inputs, the number of tokens on the right side is the stack height after executing the word.

For instance, the stack effect of the + word is (  $\times$  y -- z ), as it pops two numbers off the stack and pushes one number (their sum) onto the stack. This could be written any number of ways, though. (  $\times$  x -- x ), ( number1 number2 -- sum ), and (  $\times$  n -- m+n ) are all equally valid. Further, while the stack effect (  $\times$  y --  $\times$  y  $\times$  has the same relative height change, this declaration would be wrong, since + might legitimately be called on only two inputs.

For the purposes of documentation, of course, the names in stack effects do matter. They correspond to elements of the stack from bottom-to-top. So, the rightmost value



Figure 4: Stack shuffler words and their effects

on either side of the declaration names the top element of the stack. We can see this in Figure 4, which shows the effects of standard stack shuffler words. These words are used for basic data flow in Factor programs. For example, to discard the top element of the stack, we use the **drop** word, whose effect is simply (x --). To discard the element just below the top of the stack, we use **nip**, whose effect is (x y -- y). This stack effect indicates that there are at least two elements on the stack before **nip** is called: the top element is y, and the next element is x. After calling the word, x is removed, leaving the original y still on top of the stack. Other shuffler words that remove data from the stack are **2drop** with the effect (x y -- y), and **2nip** with the effect (x y -- y).

The next stack shufflers duplicate data. **dup** copies the top element of the stack, as indicated by its effect (x -- x x). **over** has the effect (x y -- x y x), which tells us that it expects at least two inputs: the top of the stack is y, and the next object is x. x is copied and pushed on top of the two original elements, sandwiching y between two xs. Other shuffler words that duplicate data on the stack are **2dup** with the effect (x y -- x y x y), **3dup** with the effect (x y z -- x y z x y z), **2over** with the effect (x y z -- x y z x y z), and **pick** with the effect (x y z -- x y z x z).

True to the name swap, the final shuffler in Figure 4 permutes the top two elements of the stack, reversing their order. The stack effect ( x y -- y x ) indicates as much. The

left side denotes that two inputs are on the stack (the top is y, the next is x), and the right side shows the outputs are swapped (the top element is x and the next is y). Factor has other words that permute elements deeper into the stack. However, their use is discouraged because it's harder for the programmer to mentally keep track of more than a couple items on the stack. We'll see how more complex data flow patterns are handled in Figure 17.

#### 2.3 Definitions

```
: hello-world ( -- )
"Hello, world!" print;
```

Figure 5: Hello World in Factor

```
: norm ( x y -- norm )
dup * swap dup * + sqrt ;
```

Figure 6: The Euclidean norm,  $\sqrt{x^2 + y^2}$ 

Using the basic syntax of stack effect declarations described in Section 2.2, we can now understand how to define words. Most words are defined with the parsing word:, which scans for a name, a stack effect, and then any words up until the; token, which together become the body of the definition. Thus, the classic example in Figure 5 defines a word named hello-world which expects no inputs and pushes no outputs onto the stack. When called, this word will display the canonical greeting on standard output using the print word.

A slightly more interesting example is the norm word in Figure 6. This squares each of the top two numbers on the stack, adds them, then takes the square root of the sum. Figure 7 on the next page shows this in action. By defining a word to perform these steps, we can replace virtually any instance of dup \* swap dup \* + sqrt in a program simply with norm. This is a deceptively important point. Data flow is made explicit via stack manipulation rather than being hidden in variable assignments, so repetitive patterns

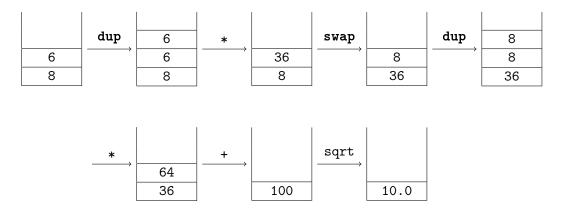


Figure 7: norm example

become painfully evident. This makes identifying, extracting, and replacing redundant code easy. Often, you can just copy a repetitive sequence of words into its own definition verbatim. This emphasis on "factoring" your code is what gives Factor its name.

```
: ^2 ( n -- n^2 )
dup *;
: norm ( x y -- norm )
    ^2 swap ^2 + sqrt;
```

Figure 8: norm refactored

As a simple case in point, we see the subexpression **dup** \* appears twice in the definition of **norm** in Figure 6 on the preceding page. We can easily factor that out into a new word and substitute it for the old expressions, as in Figure 8. By contrast, programs in more traditional languages are laden with variables and syntactic noise that require more work to refactor: identifying free variables, pulling out the right functions without causing finicky syntax errors, calling a new function with the right variables, etc. Though Factor's stack-based paradigm is atypical, it is part of a design philosophy that aims to facilitate readable code focusing on short, reusable definitions.

## 2.4 Object Orientation

You may have noticed that the examples in Section 2.3 did not use type declarations. While Factor is dynamically typed for the sake of simplicity, it does not do away with types altogether. In fact, Factor is object-oriented. However, its object system doesn't rely on classes possessing particular methods, as is common. Instead, it uses *generic words* with methods implemented for particular classes. To start, though, we must see how classes are defined.

#### **Tuples**

```
TUPLE: class
   slot-spec1 slot-spec2 slot-spec3 ...;

TUPLE: subclass < superclass
   slot-spec1 slot-spec2 slot-spec3 ...;</pre>
```

Figure 9: Basic tuple definition syntax

The central data type of Factor's object system is called a *tuple*, which is a class composed of named *slots*—like instance variables in other languages. Tuples are defined with the TUPLE: parsing word as shown in Figure 9. A class name is specified first; if it is followed by the < token and a superclass name, the tuple inherits the slots of the superclass. If no superclass is specified, the default is the **tuple** class.

Slots can be specified in several ways. The simplest is to just provide a single token, which is the name of the slot. This slot can then hold any type of object. Using the syntax { name class }, a slot can be limited to hold only instances of a particular class, like integer or string. There are other forms of slot specifiers, which we will cover after some examples.

Consider the two tuples defined in Figure 10 on the next page. The first, color, has no slots. With every tuple, a class predicate is defined with the stack effect (object --?) whose name is the class suffixed by a question mark. Here, the word color? is defined,

```
TUPLE: color ;

: <color> ( -- color )
  color new;

TUPLE: rgb < color red green blue ;

: <rgb> ( r g b -- rgb )
  rgb boa ;
```

Figure 10: Simple tuple examples

which pushes a boolean (in Factor, either **t** or **f**) indicating whether the top element of the stack is an instance of the color class. The second tuple, **rgb**, inherits from the color class. While this doesn't give **rgb** any different slots, it does mean that an instance of **rgb** will return **t** for color? due to the "is-a" relationship between subclass and superclass. The word **rgb**? is similarly defined.

Notice that the rgb tuple declares three slots named red, green, and blue. Since the slots' classes aren't declared, any sort of object can be stored in them. A set of methods are defined to manipulate an rgb instance's slots. Three reader words are defined (one for each slot), analogous to "getter" methods in other languages. Following the template for naming reader words, this example defines red>>, green>>, and blue>>. Each word has the stack effect ( object -- value ), and extracts the value corresponding to the eponymous slot. Similarly, the writer words red<<, green<<, and blue<< each have the stack effect ( value object -- ), and store values in the corresponding rgb slots destructively. To leave the modified rgb instance on the stack while setting slots, the setter words >>red, >>green, and >>blue are also defined, each with the stack effect ( object value -- object' ). These words are defined in terms of writers. For instance, >>red is the same as over red<<, since over copies a reference to the tuple (i.e., it doesn't make a "deep" copy).

To construct an instance of a tuple, we can use either **new** or **boa**. **new** will not initialize any of the slots to a particular input value—all slots will default to Factor's canonical false

value, **f**. **new** is used in Figure 10 on the preceding page to define **<color>** (by convention, the constructor for **foo** is named **<foo>**). First, we push the class **color** onto the stack (this word is also automatically defined by TUPLE:), then just call **new**, leaving a new instance on the stack. Since this particular tuple has no slots, using **new** makes sense. We might also use it to initialize a class, then use setter words to only assign a particular subset of slots' values.

However, we often want to initialize a tuple with values for each of its slots. For this, we have **boa**, which works similarly to **new**. This is used in the definition of <rgb> in Figure 10 on the previous page. The difference here is the additional inputs on the stack—one for each slot, in the order they're declared. That is, we're constructing the tuple **by order** of arguments, giving us the fun pun "**boa** constructor". So, 1 2 3 <rgb> will construct an rgb instance with the red slot set to 1, the green slot set to 2, and the blue slot set to 3.

```
TUPLE: email
    { from string }
    { to array }
    { cc array }
    { bcc array }
    { subject string }
    { content-type string initial: "text/plain" }
    { encoding word initial: utf8 }
    { body string };
```

Figure 11: Special slot specifiers

Now that we've seen the various words defined for tuples, we can explore more complex slot specifiers. Using the array-like syntax from before, slot specifiers may be marked with certain attributes—both with the class declared (like { name class attributes... }) and without the class declared (as in { name attributes... }). In particular, Factor recognizes two different attributes. If a slot marked read-only, the writer (and thus setter) for the slot will not be defined, so the slot cannot be altered. A slot may also provide an initial value using the syntax initial: some-literal. This will be the slot's value when instantiated with new.

For example, Figure 11 on the preceding page shows a tuple definition from Factor's smtp vocabulary that defines an email object. The from address, subject, and body must be instances of string, while to, cc, and bcc are arrays of destination addresses. The content-type slot must also be a string, but if unspecified, it defaults to "text/plain". The encoding must be a word (in Factor, even words are first-class objects), which by default is utf8, a word from the io.encodings.utf8 vocabulary for a Unicode format.

#### Generics and Methods

Unlike more common object systems, we do not define individual methods that "belong" to particular tuples. In Factor, you define a method that specializes on a class for a particular generic word. That way, when the generic word is called, it dispatches on the class of the object, invoking the most specific method for the object.

Generic words are declared with the syntax GENERIC: word-name ( stack -- effect ). Words defined this way will then dispatch on the class of the top element of the stack (necessarily the rightmost input in the stack effect). To define a new method with which to control this dispatch, we use the syntax M: class word-name definition...;

```
USING: bit-sets hash-sets sequences;
IN: sets

MIXIN: set
INSTANCE: sequence set
INSTANCE: hash-set set
INSTANCE: bit-set set
```

Figure 12: Set instances

An accessible example of a generic word is in Factor's sets vocabulary. set is a mixin class—a union of other classes whose members may be extended by the user. We can see the standard definition in Figure 12. Note that the USING: form specifies vocabularies being used (like Java's import), and IN: specifies the vocabulary in which the definitions appear (like Java's package). We can see here that instances of the sequence, hash-set,

and bit-set classes are all instances of set, so will respond t to the predicate set?. Similarly, sequence is a mixin class with many more members, including array, vector, and string.

```
IN: sets
GENERIC: cardinality ( set -- n )

USING: accessors bit-sets math.bitwise sets;
M: bit-set cardinality table>> bit-count;

USING: kernel sets;
M: f cardinality drop 0;

USING: accessors assocs hash-sets sets;
M: hash-set cardinality table>> assoc-size;

USING: sequences sets;
M: sequence cardinality length;

USING: sequences sets;
M: set cardinality members length;
```

Figure 13: Set cardinality using Factor's object system

Figure 13 shows the cardinality generic from Factor's sets vocabulary, along with its methods. This generic word takes a set instance from the top of the stack and pushes the number of elements it contains. For instance, if the top element is a bit-set, we extract its table slot and invoke another word, bit-count, on that. But if the top element is f (the canonical false/empty value), we know the cardinality is 0. For any sequence, we may offshore the work to a different generic, length, defined in the sequences vocabulary. The final method gives a default behavior for any other set instance, which simply uses members to obtain an equivalent sequence of set members, then calls length.

By viewing a class as a set of all objects that respond positively to the class predicate, we may partially order classes with the subset relationship. Method dispatch will use this ordering when cardinality is called to select the most specific method for the object being dispatched upon. For instance, while no explicit method for array is defined, any instance of array is also an instance of sequence. In turn, every instance of sequence is also

an instance of **set**. We have methods that dispatch on both **set** and **sequence**, but the latter is more specific, so that is the method invoked. If we define our own class, **foo**, and declare it as an instance of **set** but not as an instance of **sequence**, then the **set** method of **cardinality** will be invoked. Sometimes resolving the precedence gets more complicated, but these edge-cases are beyond the scope of our discussion.

#### 2.5 Combinators

Quotations, introduced in Section 2.1, form the basis of both control flow and data flow in Factor. Not only are they the equivalent of anonymous functions, but the stack model also makes them syntactically lightweight enough to serve as blocks akin to the code between curly braces in C or Java. Higher-order words that make use of quotations on the stack are called *combinators*. It's simple to express familiar conditional logic and loops using combinators, as we'll show in Section 2.5. In the presence of explicit data flow via stack operations, even more patterns arise that can be abstracted away. Figure 17 explores how we can use combinators to express otherwise convoluted stack-shuffling logic more succinctly.

#### Control Flow

```
5 even? [ "even" print ] [ "odd" print ] if
{ } empty? [ "empty" print ] [ "full" print ] if
100 [ "isn't f" print ] [ "is f" print ] if
```

Figure 14: Conditional evaluation in Factor

The most primitive form of control flow in typical programming languages is, of course, the **if** statement, and the same holds true for Factor. The only difference is that Factor's **if** isn't syntactically significant—it's just another word, albeit implemented as a primitive. For the moment, it will do to think of **if** as having the stack effect (? true false -- ). The

third element from the top of the stack is a condition, and it's followed by two quotations. The first quotation (second element from the top of the stack) is called if the condition is true, and the second quotation (the top of the stack) is called if the condition is false. Specifically, **f** is a special object in Factor for falsity. It is a singleton object—the sole instance of the **f** class—and is the only false value in the entire language. Any other object is necessarily boolean true. For a canonical boolean, there is the **t** object, but its truth value exists only because it is not **f**. Basic **if** use is shown in Figure 14. The first example will print "odd", the second "empty", and the third "isn't f". All of them leave nothing on the stack.

```
: example1 ( x -- 0/x-1 )
  dup even? [ drop 0 ] [ 1 - ] if ;

: example2 ( x y -- x+y/x-y )
  2dup mod 0 = [ + ] [ - ] if ;

: example3 ( x y -- x+y/x )
  dup odd? [ + ] [ drop ] if ;
```

Figure 15: **if**'s stack effect varies

However, the simplified stack effect for if is quite restrictive. (? true false --) intuitively means that both the true and false quotations can't take any inputs or produce any outputs—that their effects are ( -- ). We'd like to loosen this restriction, but per Section 2.2, Factor must know the stack height after the if call. We could give if the effect ( x ? true false -- y ), so that the two quotations could each have the stack effect ( x -- y ). This would work for the example 1 word in Figure 15, yet it's just as restrictive. For instance, the example 2 word would need if to have the effect ( x y ? true false -- z ), since each branch has the effect ( x y -- z ). Furthermore, the quotations might even have different effects, but still leave the overall stack height balanced. Only one item is left on the stack after a call to example 3 regardless, even though the two quotations have different stack effects: + has the effect ( x y -- z ), while drop has the effect ( x -- ).

In reality, there are infinitely many correct stack effects for **if**. Factor has a special notation for such *row-polymorphic* stack effects. If a token in a stack effect begins with two dots, like ..a or ..b, it is a *row variable*. If either side of a stack effect begins with a row variable, it represents any number inputs/outputs. Thus, we could give **if** the stack effect

```
( ..a ? true false -- ..b )
```

any number of outputs will be present after the call to if. Note that these numbers aren't necessarily equal, which is why we use distinct row variables in this case. However, this still isn't quite enough to capture the stack height requirements. It doesn't communicate that true and false must affect the stack in the same ways. For this, we can use the notation quot: ( stack -- effect ), giving quotations a nested stack effect. Using the same names for row variables in both the "inner" and "outer" stack effects will refer to the same number of inputs or outputs. Thus, our final (correct) stack effect for if is

```
( ..a ? true: ( ..a -- ..b ) false: ( ..a -- ..b ) -- ..b )
```

This tells us that the true quotation and the false quotation will each create the same relative change in stack height as if does overall.

```
{ "Lorem" "ipsum" "dolor" } [ print ] each
0 { 1 2 3 } [ + ] each
10 iota [ number>string print ] each
3 [ "Ho!" print ] times
[ t ] [ "Infinite loop!" print ] while
[ f ] [ "Executed once!" print ] do while
```

Figure 16: Loops in Factor

Though **if** is necessarily a language primitive, other control flow constructs are defined in Factor itself. It's simple to write combinators for iteration and looping as tail-recursive

words that invoke quotations. Figure 16 on the preceding page showcases some common looping patterns. The most basic yet versatile word is **each**. Its stack effect is

Each element x of the sequence seq will be passed to quot, which may use any of the underlying stack elements. Here, unlike if, we enforce that the input stack height is exactly the same as the output (since we use the same row variable). Otherwise, depending on the number of elements in seq, we might dig arbitrarily deep into the stack or flood it with a varying number of values. The first use of each in Figure 16 on the previous page is balanced, as the quotation has the effect (str --) and no additional items were on the stack to begin with. Essentially, it's equivalent to "Lorem" print "ipsum" print "dolor" print. On the other hand, the quotation in the second example has the stack effect (total n -- total+n). This is still balanced, since there is one additional item below the sequence on the stack (namely 0), and one element is left by the end (the sum of the sequence elements). So, this example is the same as 0 1 + 2 + 3 +.

Any instance of the extensive **sequence** mixin will work with **each**, making it very flexible. The third example in Figure 16 on the preceding page shows **iota**, which is used here to create a *virtual* sequence of integers from 0 to 9 (inclusive). No actual sequence is allocated, merely an object that behaves like a sequence. In Factor, it's common practice to use **iota** and **each** in favor of repetitive C-like **for** loops.

Of course, we sometimes don't need the induction variable in loops. That is, we just want to execute a body of code a certain number of times. For these cases, there's the times combinator, with the stack effect

This is similar to **each**, except that n is a number (so we needn't use **iota**) and the quotation doesn't expect an extra argument (i.e., a sequence element). Therefore, the example in Figure 16 on the previous page is equivalent to "Ho!" print "Ho!" print "Ho!" print.

Naturally, Factor also has the while combinator, whose stack effect is

```
( ..a pred: ( ..a -- ..b ? ) body: ( ..b -- ..a ) -- ..b )
```

The row variables are a bit messy, but it works as you'd expected: the pred quotation is invoked on each iteration to determine whether body should be called. The do word is a handy modifier for while that simply executes the body of the loop once before leaving while to test the precondition as per usual. Thus, the last example in Figure 16 on page 17 executes the body once, despite the condition being immediately false.

```
{ 1 2 3 } [ 1 + ] map
{ 1 2 3 4 5 } [ even? ] filter
{ 1 2 3 } 0 [ + ] reduce
```

Figure 17: Higher-order functions in Factor

In the preceding combinators, quotations were used like blocks of code. But really, they're the same as anonymous functions from other languages. As such, Factor borrows classic tools from functional languages, like map and filter, as shown in Figure 17. map is like each, except that the quotation should produce a single output. Each such output is collected up into a new sequence of the same class as the input sequence. Here, the example produces { 2 3 4 }. filter selects only those elements from the sequence for which the quotation returns a true value. Thus, the filter in Figure 17 outputs { 2 4 }. Even reduce is in Factor, also known as a left fold. An initial element is iteratively updated by pushing a value from the sequence and invoking the quotation. In fact, reduce is defined as swapd each, where swapd is a shuffler word with the stack effect ( x y z -- y x z ). Thus, the example in Figure 17 is the same as 0 { 1 2 3 } [ + ] each, as in Figure 16 on page 17.

These are just some of the control flow combinators defined in Factor. Several variants exist that meld stack shuffling with control flow, or can be used to shorten common patterns like empty false branches. An entire list is beyond the scope of our discussion, but the ones

we've studied should give a solid view of what standard conditional execution, iteration, and looping looks like in a stack-based language.

#### **Data Flow**

While avoiding variables and additional syntax makes it easier to refactor code, keeping mental track of the stack can be taxing. If we need to manipulate more than the top few elements of the stack, code gets harder to read and write. Since the flow of data is made explicit via stack shufflers, we actually wind up with redundant patterns of data flow that we otherwise couldn't identify. In Factor, there are several combinators that clean up common stack-shuffling logic, making code easier to understand.

```
: without-dip1 ( x y -- x+1 y )
 swap 1 + swap ;
: with-dip1 ( x y -- x+1 y )
 [1 + ] dip;
: without-dip2 ( x y z -- x-y z )
 2over - swapd nip swapd nip swap;
: with-dip2 ( x y z -- x-y z )
 [ - ] dip;
: without-keep1 ( x -- x+1 x )
 dup 1 + swap ;
: with-keep1 ( x -- x+1 x )
 [1+] keep;
: without-keep2 ( x y -- x-y y )
 swap over - swap;
: with-keep2 ( x y -- x-y y )
  [ - ] keep ;
```

Figure 18: Preserving combinators

The first combinators we'll look at are **dip** and **keep**. These are used to preserve elements of the stack. When working with several values, sometimes we don't want to use

all of them at quite the same time. Using **drop** and the like wouldn't help, as we'd lose the data altogether. Rather, we want to retain certain stack elements, do a computation, then restore them. For an uncompelling but illustrative example, suppose we have two values on the stack, but we want to increment the second element from the top. without-dip1 in Figure 18 on the previous page shows one strategy, where we shuffle the top element away with swap, perform the computation, then swap the top back to its original place. A cleaner way is to call **dip** on a quotation, which will execute that quotation just under the top of the stack, as in with-dip1. While the stack shuffling in without-dip1 isn't terribly complicated, it doesn't convey our meaning very well. Shuffling the top element out of the way becomes increasingly difficult with more complex computations. In without-dip2, we want to call - on the two elements below the top. For lack of a more robust stack shuffler, we use 20ver to isolate the two values so we can call -. The rest of the word consists of shuffling to get rid of excess values on the stack. It's also worth noting that swapd is a deprecated word in Factor, since its use starts making code harder to reason about. Alternatively, we could dream up a more complex stack shuffler with exactly the stack effect we wanted in this situation. But this solution doesn't scale: what if we had to calculate something that required more inputs or produced more outputs? Clearly, dip provides a cleaner alternative in with-dip2.

keep provides a way to hold onto the top element of the stack, but still use it to perform a computation. In general, [ ... ] keep is equivalent to dup [ ... ] dip. Thus, the current top of the stack remains on top after the use of keep, but the quotation is still invoked with that value. In with-keep1 in Figure 18 on the preceding page, we want to increment the top, but stash the result below. Again, this logic isn't terribly complicated, though with-keep1 does away with the shuffling. without-keep2 shows a messier example where a simple dup will not save us, as we're using more than just the top element in the call to -. Rather, three of the four words in the definition are dedicated to rearranging the stack in just the right way, obscuring the call to - that we really want to focus on. On the other hand, with-keep2 places the subtraction word front-and-center in its own quotation, while keep does the work of retaining the top of the stack.

```
TUPLE: coord x y ;

: without-bi ( coord -- norm )
    [ x>> sq ] keep y>> sq + sqrt ;

: with-bi ( coord -- norm )
    [ x>> sq ] [ y>> sq ] bi + sqrt ;

: without-tri ( x -- x+1 x+2 x+3 )
    [ 1 + ] keep [ 2 + ] keep 3 + ;

: with-tri ( x -- x+1 x+2 x+3 )
    [ 1 + ] [ 2 + ] [ 3 + ] tri ;
```

Figure 19: Cleave combinators

The next set of combinators apply multiple quotations to a single value. The most general form of these so-called *cleave* combinators is the word <code>cleave</code>, which takes an array of quotations as input, and calls each one in turn on the top element of the stack. Of course, for only a couple of quotations, wrapping them in an array literal becomes cumbersome. The word <code>bi</code> exists for the two-quotation case, and <code>tri</code> for the three quotations. Cleave combinators are often used to extract multiple slots from a tuple. Figure 19 shows such a case in the <code>with-bi</code> word, which improves upon using just <code>keep</code> in the <code>without-bi</code> word. In general, a series of <code>keeps</code> like <code>[a]keep[b]keep</code> c is the same as <code>{[a][b][c]}keep</code> c is the same as <code>{[a][b]}keep</code> c is the same as <code>{[a][</code>

To apply multiple quotations to multiple values, Factor has *spread* combinators. Whereas cleave combinators abstract away repeated instances of **keep**, spread combinators replace nested calls to **dip**. The archetypical combinator, **spread**, takes an array of quotations, like **cleave**. However, instead of applying each one to the top element of the stack, each one corresponds to a separate element of the stack. Thus, { [ a ] [ b ] }

```
: without-bi* ( str1 str2 -- str1' str2' )
  [ >upper ] dip >lower ;

: with-bi* ( str1 str2 -- str1' str2' )
  [ >upper ] [ >lower ] bi* ;

: without-tri* ( x y z -- x+1 y+2 z+3 )
  [ [ 1 + ] dip 2 + ] dip 3 + ;

: with-tri* ( x y z -- x+1 y+2 z+3 )
  [ 1 + ] [ 2 + ] [ 3 + ] tri* ;
```

Figure 20: Spread combinators

spread invokes b on the top element, and a on the element beneath the top. Much like cleave, there are shorthand words for the two- and three-quotation cases. These are suffixed with asterisks to indicate the spread variants, so we have bi\* and tri\*. In Figure 20, the without-bi\* word shows the simple dip pattern that bi\* encapsulates. Here, we're converting the string str1 (the second element from the top) into uppercase and str2 (the top element) to lowercase. In with-bi\*, the >upper and >lower words are seen first, uninterrupted by an extra word, making the code easier to read. More compelling is the way that tri\* replaces the dips that can be seen in without-tri\*. In comparison, with-tri\* is less nested and easier to comprehend at first glance. While there are 2bi\* and 2tri\* variants that spread quotations to two values apiece on the stack, they are uncommon in practice.

Finally, apply combinators invoke a single quotation on multiple stack entries in turn. While there is a generalized word, it's more common to use the corresponding shorthands. Here, they are suffixed with at-signs, so **bi@** applies a quotation to each of the top two stack values, and **tri@** to each of the top three. This way, rather than duplicate code for each time we want to call a word, we need only specify it once. This is demonstrated clearly in Figure 21 on the next page. In without-bi@, we see that the quotation [ sq ] (for squaring numbers) appears twice for the call to bi\*. In general, we can replace spread combinators whose quotations are all the same with a single quotation and an apply combinator. Thus,

```
: without-bi@ ( x y -- norm )
  [ sq ] [ sq ] bi* + sqrt;

: with-bi@ ( x y -- norm )
  [ sq ] bi@ + sqrt;

: without-tri@ ( x y z -- x+1 y+1 z+1 )
  [ 1 + ] [ 1 + ] [ 1 + ] tri*;

: with-tri* ( x y z -- x+1 y+1 z+1 )
  [ 1 + ] tri@;
```

Figure 21: Apply combinators

with-bi@ cuts down on the duplicated [ sq ] in without-bi@. Similarly, we can replace the three repeated quotations passed to tri\* in without-tri@ with a single instance passed to tri@ in with-tri@. Like other data flow combinators, we have the numbered variants.

2bi@ has the stack effect ( w x y z quot -- ), where quot expects two inputs, and is thus applied to w and x first, then to y and z. Similarly, 2tri@ applies the quotation to the top six objects of the stack in groups of two. Like their spread counterparts, they are not used very much.

Some wrap-up that isn't completely lame.

## 3 The Factor Compiler

If we could sort programming languages by the fuzzy notions we tend to have about how "high-level" they are, toward the high end we'd find dynamically-typed languages like Python, Ruby, and PHP—all of which are generally more interpreted than compiled (though there has been compelling work on this front [e.g., Biggar 2009]). Despite being as high-level as these popular languages, Factor's implementation is driven by performance. Factor source is always compiled to native machine code using either its simple, non-optimizing compiler or (more typically) the optimizing compiler that performs several sorts of data and control flow analyses. In this chapter, we look at the general architecture of Factor's implementation, after which we place a particular emphasis on the transformations performed by the optimizing compiler.

## 3.1 Organization

At the lowest level, Factor is written atop a C++ virtual machine (VM) that is responsible for basic runtime services. This is where the non-optimizing base compiler is implemented. It's the base compiler's job to compile the simplest primitives: operations that push literals onto the data stack, call, if, dip, words that access tuple slots as laid out in memory, stack shufflers, math operators, functions to allocate/deallocate call stack frames, etc. The aim of the base compiler is to generate native machine code as fast as possible. To this end, these primitives correspond to their own stubs of assembly code. Different stubs are generated by Factor depending on the instruction set supported by the particular machine in use. Thus, the base compiler need only make a single pass over the source code, emitting these assembly instructions as it goes.

This compiled code is saved in an *image file*, which contains a complete snapshot of the current state of the Factor instance, similar to many Smalltalk and Lisp systems [Pestov, Ehrenberg, and Groff 2010]. As code is parsed and compiled, the image is updated, serving as a cache for compiled code. This modified image can be saved so that future Factor instances needn't recompile vocabularies that are already contained in the image.

The VM also handles method dispatch and memory management. Method dispatch incorporates a *polymorphic inline cache* to speed up generic words. Each generic word's call site is associated with a state:

- In the *cold* state, the call site's instruction computes the right method for the class being dispatched upon, which is the operation we're trying to avoid. As it does this, a polymorphic inline cache stub is generated, thus transitioning it to the next state.
- In the *inline cache* state, a stub has been generated that caches the locations of methods for classes that have already been seen. This way, if a generic word at a particular call site is invoked often upon only a small number of classes (as is often in the case in loops, for example), we don't need to waste as much time doing method lookup. By default, if more than three different classes are dispatched upon, we transition to the next state.
- In the *megamorphic* state, the call instruction points to a larger cache that is allocated for the specific generic word (i.e., it is shared by all call sites). While not as efficient as an inline cache, this can still improve the performance of method dispatch.

To manage memory, the Factor VM uses a generational garbage collector (GC), which carves out sections of space on the heap for objects of different ages. Garbage in the oldest generation is collected with a mark-sweep-compact algorithm, while younger generations rely on a copying collector [Wilson 1992]. This way, the GC is specialized for large numbers of short-lived objects that will stay in the younger generations without being promoted to the older generation. In the oldest space, even compiled code can be compacted. This is to avoid heap fragmentation in applications that must call the compiler at runtime, such as Factor's interactive development environment.

Values are referenced by tagged pointers, which use the three least significant bits of the pointer's address to store type information. This is possible because Factor aligns objects on an eight-byte boundary, so the three least significant bits of an address are always 0. These bits give us eight unique tags, but since Factor has more than eight data types, two

tags are reserved to indicate that the type information is stored elsewhere. One is for VM types without their own tag, and the other is for user-defined tuples, each of which has its own type. Sufficiently small integers (e.g., 29-bit integers on a 32-bit machine, since the other 3 bits are used for the type tag) are stored directly in the pointer, so they needn't be heap-allocated. Larger integers and floating point numbers are boxed, but the optimizing compiler may unbox them to store floats in registers.

The VM is meant to be minimal, as Factor is mostly self-hosting. That is, the real workhorses of the language are written in Factor itself, including the standard libraries, parser, object system, and the optimizing compiler. It's possible for the compiler to be written in Factor because of the bootstrapping process that creates a new image from scratch. First, a minimal boot image is created from an existing host Factor instance. When the VM runs the boot image, it initiates the bootstrapping process. Using the host's parser, the base compiler will compile the core vocabularies necessary to load the optimizing compiler. Once the optimizing compiler can itself be compiled, it is used to recompile (and thus optimize) all of the words defined so far. With the basic vocabularies recompiled, any additional vocabularies can be loaded using the optimized compiler and saved into a new, working image.

Thus, while the Factor VM is important, it is a small part of the code base. Since the bootstrapping process allows the optimizing compiler (hereafter just "the compiler") to be written in the same high-level language it's compiling, we can avoid the fiddly low-level details of the C++ backend. This is more conducive to writing advanced compiler optimizations, which are often complicated enough without having a concise, dynamically-typed, garbage-collected language like Factor to help us.

## 3.2 High-level Optimizations

To manipulate source code abstractly, we must have at least one intermediate representation (IR)—a data structure representing the instructions. It's common to convert between several IRs during compilation, as each form offers different properties that facili-

tate particular analyses. The Factor compiler optimizes code in passes across two different IRs: first at a high-level using the compiler.tree vocabulary, then at a low-level with the compiler.cfg vocabulary.

```
TUPLE: node < identity-tuple;
TUPLE: #introduce < node out-d ;
TUPLE: #return < node in-d info ;
TUPLE: #push < node literal out-d;
TUPLE: #call < node word in-d out-d body method class info ;
TUPLE: #renaming < node ;
TUPLE: #copy < #renaming in-d out-d;
TUPLE: #shuffle < #renaming mapping in-d out-d in-r out-r;
TUPLE: #declare < node declaration ;
TUPLE: #terminate < node in-d in-r;
TUPLE: #branch < node in-d children live-branches;
TUPLE: #if < #branch;
TUPLE: #dispatch < #branch;
TUPLE: #phi < node phi-in-d phi-info-d out-d terminated;
TUPLE: #recursive < node in-d word label loop? child;
TUPLE: #enter-recursive < node in-d out-d label info;
TUPLE: #call-recursive < node label in-d out-d info;
TUPLE: #return-recursive < #renaming in-d out-d label info;
TUPLE: #alien-node < node params;
TUPLE: #alien-invoke < #alien-node in-d out-d;
TUPLE: #alien-indirect < #alien-node in-d out-d;
TUPLE: #alien-assembly < #alien-node in-d out-d;
TUPLE: #alien-callback < node params child ;
```

Figure 22: High-level IR nodes

The high-level IR arranges code into a vector of node objects, which may themselves have children consisting of vectors of node—a tree structure that lends to the name compiler.tree. This ordered sequence of nodes represents control flow in a way that's effectively simple, annotated stack code. Figure 22 shows the definitions of the tuples that

represent the "instruction set" of this stack code. Each object inherits (directly or indirectly) from the node class, which itself inherits from identity-tuple. This is a tuple whose equal? method is defined to always return f so that no two instances are equivalent unless they are the same instance.

Notice that most nodes define some sort of in-d and out-d slots, which mark each of them with the input and output data stacks. This represents the flow of data through the program. Here, stack values are denoted simply by integers, giving each value a unique identifier. An #introduce instance is inserted wherever the next node requires stack values that have not yet been named. Thus, while #introduce has no in-d, its out-d introduces the necessary stack values. Similarly, #return is inserted at the end of the sequence to indicate the final state of the data stack with its in-d slot.

The most basic operations of a stack language are, of course, pushing literals and calling functions. The #push node thus has a literal slot and an out-d slot, giving a name to the single element it pushes to the data stack. #call, of course, is used for normal word invocations. The in-d and out-d slots effectively serve as the stack effect declaration. In later analyses, data about the word's definition may be stored across the body, method, class, and info slots.

Figure 23: [ 1 + ] build-tree

The word build-tree takes a Factor quotation and constructs the equivalent high-level IR form. In Figure 23, we see the output of the simple example [1 + ] build-tree. Note that T{ class { slot1 value1 } { slot2 value2 } ... } is the syntax for tu-

ple literals. The first node is a **#push** for the 1 literal. Since **+** needs two input values, an **#introduce** pushes a new "phantom" value. **+** gets turned into a **#call** instance. Notice the **in-d** slot refers to the values in the order that they're passed to the word, not necessarily the order they've been introduced in the IR. The sum is pushed to the data stack, so the **out-d** slot is a singleton that names this value. Finally, **#return** indicates the end of the routine, its **in-d** containing the value left on the stack (the sum pushed by **#call**).

```
V{
    T{ #introduce { out-d { 6256132 6256133 } } }
    T{ #shuffle
        { mapping { 6256134 6256133 } { 6256135 6256132 } } }
        { in-d V{ 6256132 6256133 } }
        { out-d V{ 6256134 6256135 } }
    }
    T{ #return { in-d V{ 6256134 6256135 } } }
}
```

Figure 24: [ swap ] build-tree

The next tuples in Figure 22 on page 28 reassign existing values on the stack to fresh identifiers. The #renaming superclass has the two subclasses #copy and #shuffle. The former represents the bijection from elements of in-d to elements of out-d in the same position; corresponding values are copies of each other. The latter represents a more general mapping. Stack shufflers are translated to #shuffle nodes with mapping slots that dictate how the fresh values in out-d correspond to the input values in in-d. For instance, Figure 24 shows how swap takes in the values 6256132 and 6256133 and outputs 6256134 and 6256135, where the former is mapped to the second element (6256133) and the latter to the first (6256132). Thus, out-d swaps the two elements of in-d, mapping them to fresh identifiers. The in-r and out-r slots of #shuffle correspond to the retain stack, which is an implementation detail beyond the scope of this discussion.

#declare is a miscellaneous node used for the declare primitive. It simply annotates type information to stack values, as in Figure 25 on the following page. #terminate is another one-off node, but a much more interesting one. While Factor normally requires a balanced stack, sometimes we purposefully want to throw an error. #terminate is in-

```
V{
    T{ #introduce { out-d { 6256069 } } }
    T{ #declare { declaration { { 6256069 fixnum } } } }
    T{ #return { in-d V{ 6256069 } }
}
```

Figure 25: [ { fixnum } declare ] build-tree

```
V{
    T{ #push { literal "Error!" } { out-d { 6256051 } } }
    T{ #call
        { word throw }
        { in-d V{ 6256051 } }
        { out-d { } }
}
    T{ #terminate { in-d V{ } } { in-r V{ } } }
}
```

Figure 26: [ "Error!" throw ] build-tree

troduced where the program halts prematurely. When checking the stack height, it gets to be treated specially so that *terminated* stack effects unify with any other effect. That way, branches will still be balanced even if one of them unconditionally throws an error. Figure 26 shows #terminate being introduced by the throw word.

Next, Figure 22 on page 28 defines nodes for branching based off the superclass #branch. The children slot contains vectors of nodes representing different branches. live-branches is filled in during later analyses to indicate which branches are alive so that dead ones may be removed. For instance, #if will have two elements in its children slot representing the true and false branches. On the other hand, #dispatch has an arbitrary number of children. It corresponds to the dispatch primitive, which is an implementation detail of the generic word system used to speed up method dispatch.

You may have noted the emphasis on introducing new values, instead of reassigning old ones. Even #shuffles output fresh identifiers, letting their values be determined by the mapping. The reason for this is that compiler.tree uses static single assignment

(SSA) form, wherein every variable is defined by exactly one statement. This simplifies the properties of variables, which helps optimizations perform faster and with better results [Cytron et al. 1991]. By giving unique names to the targets of each assignment, the SSA property is guaranteed. However, #branches introduce ambiguity: after, say, an #if, what will the out-d be? It depends on which branch is taken. To remedy this problem, after any #branch node, Factor will place a #phi node—the classical SSA "phony function",  $\phi$ . While it doesn't perform any literal computation, conceptually  $\phi$  selects between its inputs, choosing the "correct" argument depending on control flow. This can then be assigned to a unique value, preserving the SSA property. In Factor, this is represented by a phi-in-d slot, which is a sequence of sequences. Each element corresponds to the out-d of the child at the same position in the children of the preceding #branch node. The #phi's out-d gives unique names to the output values.

For example, the **#phi** in Figure 27 on the next page will select between the 6256248 return value of the first child or the 6256249 output of the second. Either way, we can refer to the result as 6256250 afterwards. The **terminated** slot of the **#phi** tells us if there was a **#terminate** in any of the branches.

The #recursive node encapsulates inline recursive words. In Factor, words may be annotated with simple compiler declarations, which guide optimizations. If we follow a standard colon definition with the inline word, we're saying that its definition can be spliced into the call-site, rather than generating code to jump to a subroutine. Inline words that call themselves must additionally be declared recursive. For example, we could write: foo ( -- ) foo; inline recursive. The nodes #enter-recursive, #call-recursive, and #return-recursive denote different stages of the recursion—the beginning, recursive call, and end, respectively. They carry around a lot of metadata about the nature of the recursion, but it doesn't serve our purposes to get into the details. Similarly, we gloss over the final nodes of Figure 22 on page 28 correspond to Factor's foreign function interface (FFI) vocabulary, called alien. At a high level, #alien-node, #alien-indirect, #alien-assembly, and #alien-callback are used to make calls to C libraries from within Factor.

```
٧{
    T{ #introduce { out-d { 6256247 } } }
    T{ #if
        { in-d { 6256247 } }
        { children
            {
                ٧{
                     T{ #push
                         { literal 1 }
                         { out-d { 6256248 } }
                     }
                }
                ٧{
                    T{ #push
                         { literal 2 }
                         { out-d { 6256249 } }
                     }
                }
            }
        }
    }
    T{ #phi
        { phi-in-d { { 6256248 } { 6256249 } } }
        { out-d { 6256250 } }
        { terminated V{ f f } }
    }
    T{ #return { in-d V{ 6256250 } } }
}
```

Figure 27: [ [ 1 ] [ 2 ] **if** ] build-tree

### Shouldn't bold "cleanup" in Figure 28

Now that we're familiar with the structure of the high-level IR, we can turn our attention to optimization. Figure 28 on the next page shows the passes performed on a sequence of nodes by the word optimize-tree. Before optimization can begin, we must gather some information and clean up some oddities in the output of build-tree. analyze-recursive is called first to identify and mark loops in the tree. Effectively, this means we detect tail-recursion introduced by #recursive nodes. Future passes can then use this information for data flow analysis. Then, normalize makes the tree more consistent by doing two things:

```
: optimize-tree ( nodes -- nodes' )
     analyze-recursive
     normalize
     propagate
     cleanup
     dup run-escape-analysis? [
          escape-analysis
          unbox-tuples
     ] when
     apply-identities
     compute-def-use
     remove-dead-code
     ?check
      compute-def-use
     optimize-modular-arithmetic
     finalize
 ] with-scope;
```

Figure 28: Optimization passes on the high-level IR

- All #introduce nodes are removed and replaced by a single #introduce at the beginning of the whole program. This way, further passes needn't handle #introduce nodes.
- As constructed, the in-d of a #call-recursive will be the entire stack at the time of the call. This assumption happens because we don't know how many inputs it needs until the #return-recursive is processed, because of row polymorphism. So, here we figure out exactly what stack entries are needed, and trim the in-d and out-d of each #call-recursive accordingly.

Once these passes have cleaned up the tree, propagate performs probably the most extensive analysis of all the phases. In short, it performs an extended version of sparse conditional constant propagation (SCCP) [Wegman and Zadeck 1991]. The traditional data flow analysis combines global copy propagation, constant propagation, and constant folding in a *flow-sensitive* way. That is, it will propagate information from branches that it knows are definitely taken (e.g., because #if is always given a true input). Instead of

using the typical single-level (numeric) constant value lattice, Factor uses a lattice augmented by information about classes, numeric value ranges, array lengths, and tuple slots' classes. Classes can be used in the lattice with the partial-order protocol described briefly in Section 2.4. Additionally, the transfer functions are allowed to inline certain calls if enough information is present. This occurs in the transfer function since generic words' inline expansions into particular methods provide more information, thus giving us more opportunities for propagation. This is particularly useful for arithmetic words. In Factor, words like + and \* are generics that work across all sorts of numeric representations, be they fixnums, floats, bignums, etc. If the operation overflows, the values are automatically cast up to larger representations. But iterated refinement of the inputs' classes can let the compiler select more specific, efficient methods (e.g., if both arguments are fixnums).

Interval propagation also helps propagate class information. By refining the range of possible values a particular item can have, we might discover that, say, it's small enough to fit in a **fixnum** rather than a **bignum**. There are plenty more things that interval propagation can tell us, too. For example, it may give us enough information to remove overflow checks performed by numeric words. And if the interval has zero length, we may replace the value with a constant. This then continues getting propagated, contributing to constant folding and so forth.

propagate iterates through the nodes collecting all of this data until reaching a stable point where inferences can no longer be drawn. Technically, this information doesn't alter the tree at all; we merely store it so that speculative decisions may be realized later. The next word in Figure 28 on the preceding page, cleanup, does just this by inlining words, folding constants, removing overflow checks, deleting unreachable branches, and flattening inline-recursive words that don't actually wind up calling themselves (e.g., because the calls got constant-folded).

The next major pass is escape-analysis, whose information is used for the actual transformation unbox-tuples. This discovers tuples that *escape* by getting passed outside of a word. For instance, the inputs to #return obviously escape, as they are passed to the world outside of the word in question. Similarly, inputs to the #call of another word escape.

```
TUPLE: data-struct
  { a read-only }
  { b read-only };

: escaping-via-#return ( -- data-struct )
  1 2 data-struct boa;

: escaping-via-#call ( -- )
  1 2 data-struct boa pprint;

: non-escaping ( -- )
  1 2 data-struct [ a>> ] [ b>> ] bi +;
```

Figure 29: Escaping vs. non-escaping tuple allocations

So, though the tuples in escaping-via-#return and escaping-via-#call in Figure 29 both escape, we can see the one in non-escaping does not. In fact, the last allocation is unnecessary. By identifying this, unbox-tuples can then rewrite the code to avoid allocating a data-struct altogether, instead manipulating the slots' values directly. Note that this only happens for immutable tuples, all of whose slots are read-only. Otherwise, we would need to perform more advanced pointer analyses to discover aliases.

apply-identities follows to simplify words with known identity elements. If, say, an argument to + is 0, we can simply return the other argument. This converts the #call to + into a simple #shuffle. These identities are defined for most arithmetic words.

Another simple few passes come next in Figure 28 on page 34. True to its name, compute-def-use computes where SSA values are defined and used. Values that are never used are eliminated by remove-dead-code. ?check conditionally performs some consistency checks on the tree, mostly to make sure that no errors were introduced in the stack flow. If a global variable isn't toggled on, this part is skipped. We run compute-def-use again to update the information after altering the tree with dead code elimination.

Finally, optimize-modular-arithmetic performs a form of strength-reduction on artihmetic words that only use the low-order bits of their inputs/results, which may also remove more unnecessary overflow checks. finalize cleans up a few random miscellaneous

bits of the tree (removing empty shufflers, deleting #copy nodes, etc.) in preparation for lower-level optimizations.

Double-check zealous syntax-highlighting

## 3.3 Low-level Optimizations

The low-level IR in compiler.cfg takes the more conventional form of a control flow graph (CFG). A CFG (not to be confused with "context-free grammar") is an arrangement of instructions into basic blocks: maximal sequences of "straight-line" code, where control does not transfer out of or into the middle of the block. Directed edges are added between blocks to represent control flow—either from a branching instruction to its target, or from the end of a basic block to the start of the next one [Aho et al. 2007]. Construction of the low-level IR proceeds by analyzing the control flow of the high-level IR and converting the nodes of Section 3.2 into lower-level, more conventional instructions modeled after typical assembly code. There are over a hundred of these instructions, but many are simply different versions of the same operation. For instance, while instructions are generally called on virtual registers (represented in Factor simply by integers), there are immediate versions of instructions. The ##add instruction, as an example, represents the sum of the contents of two registers, but ##add-imm sums the contents of one register and an integer literal. Other instructions are inserted to make stack reads and writes explicit, as well as to balance the height. Below is a categorized list of all the instruction objects (each one is a subclass of the insn tuple).

#### Is the complete list really necessary?

- Loading constants: ##load-integer, ##load-reference
- Optimized loading of constants, inserted by representation selection:
   ##load-tagged, ##load-float, ##load-double, ##load-vector
- Stack operations: ##peek, ##replace, ##replace-imm, ##inc-d, ##inc-r

- Subroutine calls: ##call, ##jump, ##prologue, ##epilogue, ##return
- Inhibiting tail-call optimization (TCO): ##no-tco
- Jump tables: ##dispatch
- Slot access: ##slot, ##slot-imm, ##set-slot, ##set-slot-imm
- Register transfers: ##copy, ##tagged>integer
- Integer arithmetic: ##add, ##add-imm, ##sub, ##sub-imm, ##mul, ##mul-imm,

  ##and, ##and-imm, ##or, ##or-imm, ##xor, ##xor-imm, ##shl, ##shl-imm, ##shr,

  ##shr-imm, ##sar, ##sar-imm, ##min, ##max, ##not, ##neg, ##log2, ##bit-count
- Float arithmetic: ##add-float, ##sub-float, ##mul-float, ##div-float, ##min-float, ##max-float, ##sqrt
- Single/double float conversion: ##single>double-float, ##double>single-float
- Float/integer conversion: ##float>integer, ##integer>float
- SIMD operations: ##zero-vector, ##fill-vector, ##gather-vector-2,

  ##gather-int-vector-2, ##gather-vector-4, ##gather-int-vector-4,

  ##select-vector, ##shuffle-vector, ##shuffle-vector-halves-imm,

  ##shuffle-vector-imm, ##tail>head-vector, ##merge-vector-head,

  ##merge-vector-tail, ##float-pack-vector, ##signed-pack-vector,

  ##unsigned-pack-vector, ##unpack-vector-head, ##unpack-vector-tail,

  ##integer>float-vector, ##float>integer-vector, ##compare-vector,

  ##saturated-add-vector, ##add-sub-vector, ##sub-vector,

  ##saturated-add-vector, ##add-sub-vector, ##sub-vector,

  ##mul-horizontal-add-vector, ##saturated-mul-vector, ##div-vector,

  ##min-vector, ##max-vector, ##avg-vector, ##dot-vector, ##sad-vector,

  ##horizontal-add-vector, ##horizontal-sh-vector-imm, ##abs-vector,

##sqrt-vector, ##and-vector, ##andn-vector, ##or-vector, ##xor-vector,
##not-vector, ##shl-vector-imm, ##shr-vector-imm, ##shl-vector,
##shr-vector

- Scalar/vector conversion: ##scalar>integer, ##integer>scalar, ##vector>scalar, ##scalar>vector
- Boxing and unboxing aliens: ##box-alien, ##box-displaced-alien,
   ##unbox-any-c-ptr, ##unbox-alien
- Zero-extending and sign-extending integers: ##convert-integer
- Raw memory access: ##load-memory, ##load-memory-imm, ##store-memory, ##store-memory-imm
- Memory allocation: ##allot, ##write-barrier, ##write-barrier-imm,
   ##alien-global, ##vm-field, ##set-vm-field
- The FFI: ##unbox, ##unbox-long-long, ##local-allot, ##box, ##box-long-long, ##alien-invoke, ##alien-indirect, ##alien-assembly, ##callback-inputs, ##callback-outputs
- Control flow: ##phi, ##branch
- Tagged conditionals: ##compare-branch, ##compare-imm-branch, ##compare, ##compare-imm
- Integer conditionals: ##compare-integer-branch,
  ##compare-integer-imm-branch, ##test-branch, ##test-imm-branch,
  ##compare-integer, ##compare-integer-imm, ##test, ##test-imm
- Float conditionals: ##compare-float-ordered-branch,
   ##compare-float-unordered-branch, ##compare-float-ordered,
   ##compare-float-unordered
- Overflowing arithmetic: ##fixnum-add, ##fixnum-sub, ##fixnum-mul

- GC checks: ##save-context, ##check-nursery-branch, ##call-gc
- Spills and reloads, inserted by the register allocator: ##spill, ##reload

```
: optimize-cfg ( cfg -- cfg' )
    optimize-tail-calls
    delete-useless-conditionals
    split-branches
    join-blocks
    normalize-height
    construct-ssa
    alias-analysis
    value-numbering
    copy-propagation
    eliminate-dead-code ;
```

Figure 30: Optimization passes on the low-level IR

By translating the high-level IR into instructions that manipulate registers directly, we reveal further redundancies that can be optimized away. The optimize-cfg word in Figure 30 shows the passes performed in doing this. The first word, optimize-tail-calls, performs tail call elimination on the CFG. Tail calls are those that occur within a procedure and whose results are immediately returned by that procedure. Instead of allocating a new call stack frame, we may convert tail calls into simple jumps, since afterwards the current procedure's call frame isn't really needed. In the case of recursive tail calls, we can convert special cases of recursion into loops in the CFG, so that we won't trigger call stack overflows. For instance, consider Figure 31 on the following page, which shows the effect of optimize-tail-calls on the following definition:

```
: tail-call ( -- ) tail-call ;
```

Note the recursive call (trivially) occurs at the end of the definition, just before the return point. When translated to a CFG, this is a ##call instruction, as seen in block 4 to the left of Figure 31 on the next page. This is also just before the final ##epilogue and ##return instructions in block 8, as blocks 5–7 are effectively empty (these excessive ##branches will be eliminated in a later pass). Because of this, rather than make a whole new subroutine

used in Section 3.2, not defined

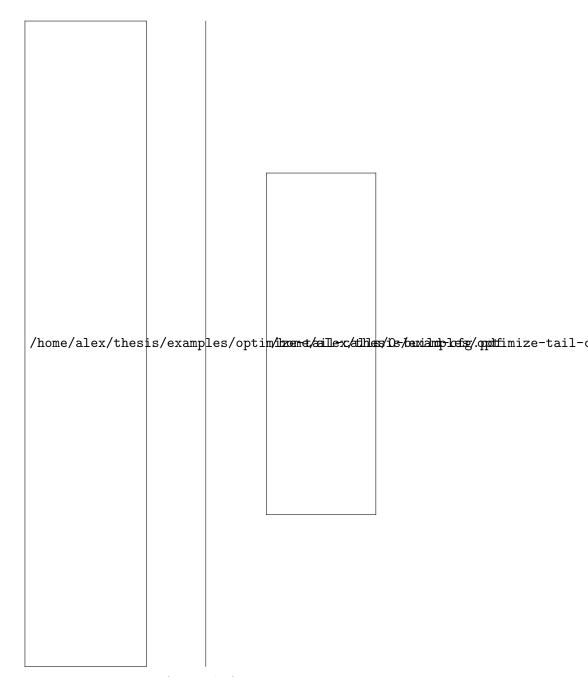


Figure 31: tail-call before and after  ${\tt optimize-tail-calls}$ 

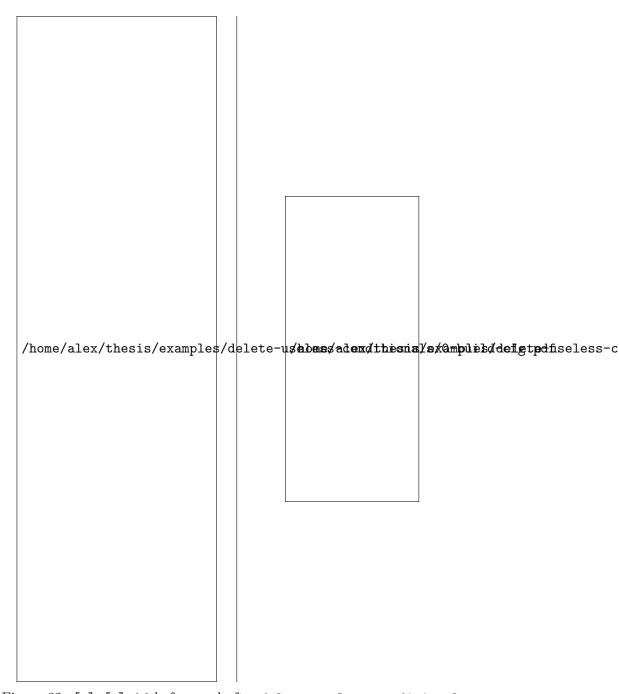


Figure 32: [ ] if before and after delete-useless-conditionals

call, we can convert it into a ##branch back to the beginning of the word, as in the CFG to the right.

The next pass in Figure 30 on page 40 is delete-useless-conditionals, which removes branches that go to the same basic block. This situation might occur as a result of optimizations performed in the high-level IR. To see it in action, Figure 32 on the previous

page shows the transformation on a purposefully useless conditional, [ ] [ ] if. Before removing the useless conditional, the CFG ##peeks at the top of the data stack (D 0), storing the result in the virtual register 1. This value is popped, so we decrement the stack height (##inc-d -1). Then, ##compare-imm-branch in block 2 compares the value in the virtual register 2 (which is a copy of 1, the top of the stack) to the immediate value f to see if it's not equal (signified by cc/=). However, both branches jump through several empty blocks and merge at the same destination. Thus, we can remove both branches and replace ##compare-imm-branch with an unconditional ##branch to the eventual destination. We see this on the right of Figure 32 on the preceding page.

In order to expose more opportunities for optimization, split-branches will actually duplicate code. We use the fact that code immediately following a conditional will be executed along either branch. If it's sufficiently short, we copy it up into the branches individually. That is, we change [A][B] if C into [AC][BC] if, as long as C is small enough. Later analyses may then, for example, more readily eliminate one of the branches if it's never taken. Figure 33 on the next page shows what such a transformation looks like on a CFG. The example [1][2] if dup is essentially changed into [1 dup] [2 dup] if, thus splitting the block with two predecessors (block 9) on the left.

The next pass, join-blocks, compacts the CFG by joining together blocks involved in only a single control flow edge. Mostly, this is to clean up the myriad of empty or short blocks introduced during construction, like sequences of a bunch of ##branches. Figure 34 on page 45 shows this pass on the CFG of 0 100 [ 1 fixnum+fast ] times. fixnum+fast is a specialized version of + that suppresses overflow and type checks. We use it here to keep the CFG simple. We'll be using this particular code to illustrate all but one of the remaining optimization passes in Figure 30 on page 40, as it's a motivating example for the work in this thesis. The passes before join-blocks don't change the CFG seen on the left in Figure 34 on page 45, but we get rid of the useless ##branch blocks in the CFG on the right.

Figure 35 on page 46 shows the result of applying normalize-height to the result of join-blocks. This phase combines and canonicalizes the instructions that track the

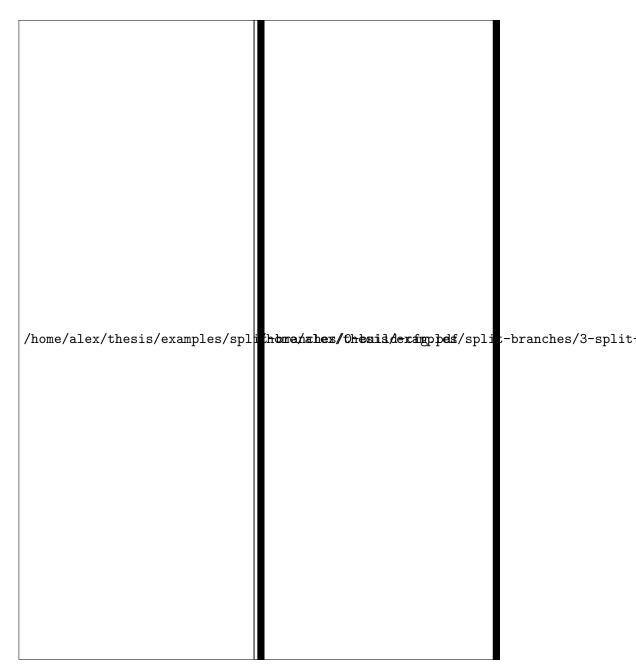


Figure 33: [ 1 ] [ 2 ] if  $\tt dup$  before and after split-branches

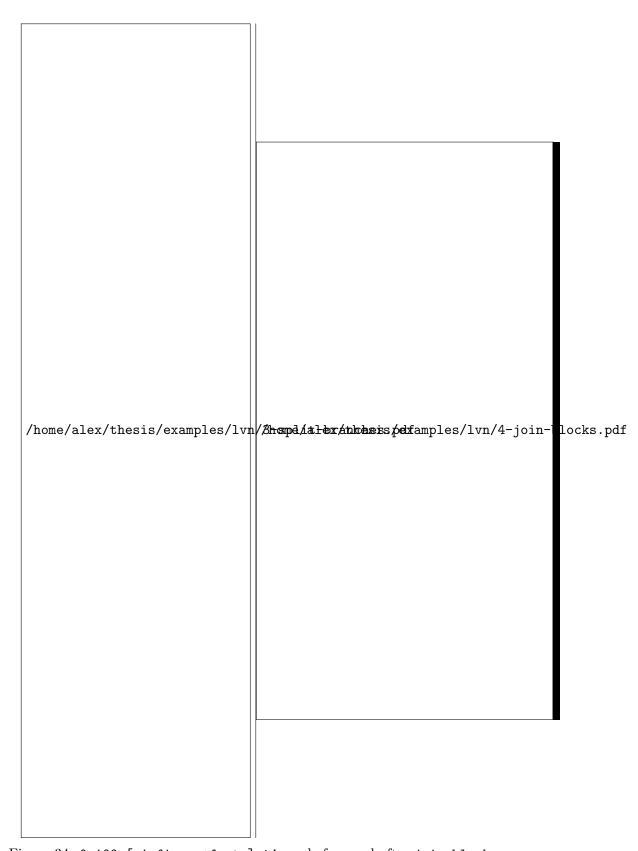


Figure 34: 0 100 [ 1 fixnum+fast ] times before and after join-blocks

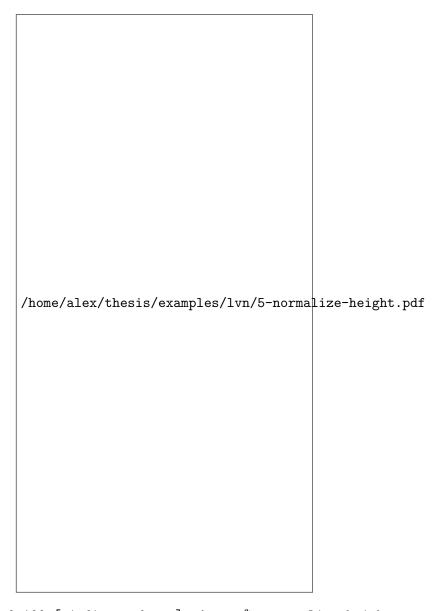


Figure 35: 0 100 [ 1 fixnum+fast ] times  $\operatorname{after}$  normalize-height

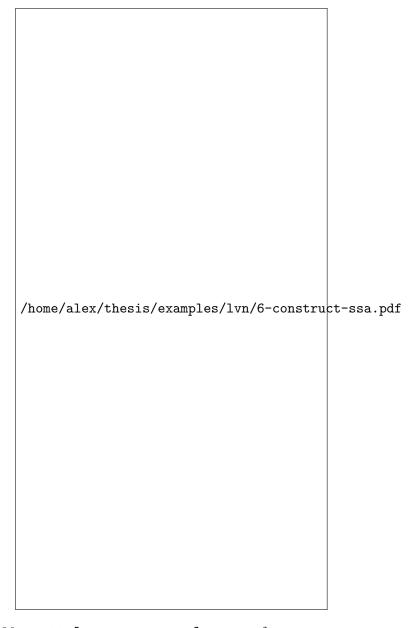


Figure 36: 0 100 [ 1 fixnum+fast ] times after construct-ssa

stack height, like ##inc-d. While the shuffling in this example isn't complex enough to be interesting, neither is this phase. It amounts to more cleanup: multiple height changes are combined into single ones at the beginnings of the basic blocks. In Figure 35 on the preceding page, this means that ##inc-d is moved to the top of block 1, as compared to the right of Figure 34 on page 45.

In converting the high-level IR to the low-level, we actually lose the SSA form of compiler.tree. Not only does the construction do this, but split-branches also copies basic blocks verbatim, so any value defined will have a duplicate definition site, violating the SSA property. construct-ssa recomputes a so-called *pruned* SSA form, wherein  $\phi$  functions are inserted only if the variables are live after the insertion point. This cuts down on useless  $\phi$  functions [Briggs et al. 1998; Das and Ramakrishna 2005]. Figure 36 on the preceding page shows the reconstructed SSA form of the CFG from Figure 35 on page 46.

The next pass, alias-analysis, doesn't change the CFG of 0 100 [ 1 fixnum+fast ] times, so we won't have an accompanying figure. At a high level, alias-analysis is easy to understand: it eliminates redundant memory loads and stores by rewriting certain patterns of memory access. If the same location is loaded after being stored, we convert the latter load into a ##copy of the value we stored. Two reads of the same location with no intermittent write gets the second read turned into a ##copy. Similarly, if we see two writes without a read in the middle, the first write can be removed.

value-numbering is the key focus of this thesis. It will be detailed in Chapter 4 on page 52. For now, it does to think of it as a combination of common subexpression elimination and constant folding. In Figure 37 on the next page, we see several changes:

- ##load-integer 23 0 in block 1 of Figure 36 on the preceding page (which assigns the value 0 to the virtual register 23) is redundant, so is replaced by ##copy 23 21.
- In block 2, the last instruction ##compare-imm-branch 32 f cc/= is the same as ##compare-integer-branch 30 26 cc<. The source register (32) of the original is a ##copy of 31, which itself is computed by ##compare-integer 31 30 26 cc< 9. So, the ##compare-imm-branch is equivalent to a simple ##compare-integer-branch, which doesn't use the temporary virtual register 9 and doesn't waste time comparing against the f object.
- The second operands in both ##adds of block 3 are just constants stored by ##load-integers. So, these are turned into ##add-imms.

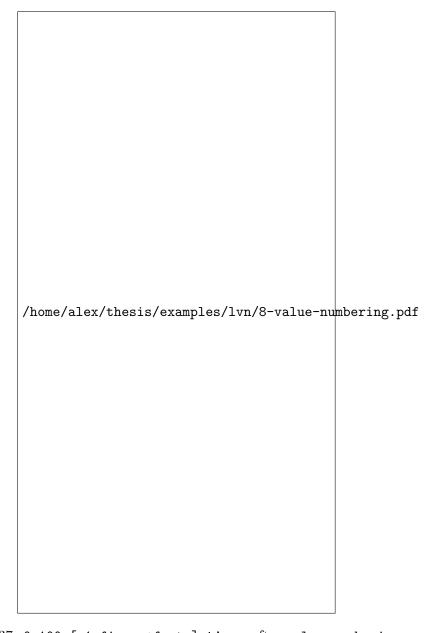


Figure 37: 0 100 [ 1 fixnum+fast ] times after value-numbering

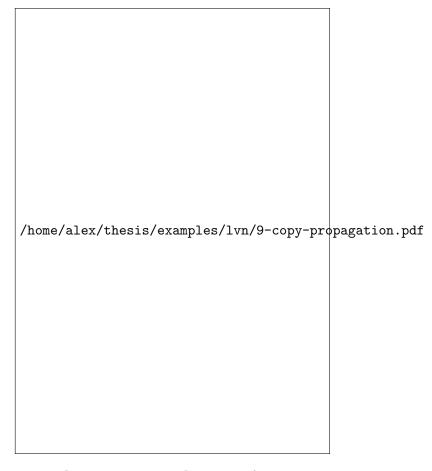


Figure 38: 0 100 [ 1 fixnum+fast ] times after copy-propagation

• Also, the second ##load-integer in block 3 just loads 1 like the first instruction.

Therefore, it's replaced by a ##copy.

In Chapter 4, we'll see how and why this pass fails to identify other equivalences.

Following value-numbering, copy-propagation performs a global pass that eliminates ##copy instructions. Uses of the copies are replaced by the originals. So, in Figure 38, we can see that all of the ##copy instructions have been removed and, for instance, the use of the virtual register 25 in block 2 has been replaced by 21, since 25 was a copy of it.

Next, dead code is removed by eliminate-dead-code. Figure 39 on the following page shows that the ##compare-integer in block 2 and the ##load-integer in block 3 were removed, since they defined values that were never used.

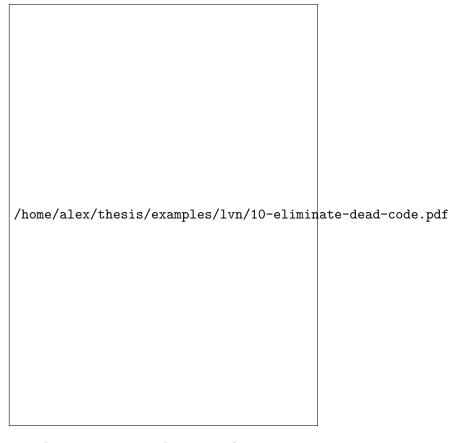


Figure 39: 0 100 [ 1 fixnum+fast ] times after eliminate-dead-code

The final pass in Figure 30 on page 40, finalize-cfg, itself consists of several more passes. We will not get into many details here, but at a high level, the most important passes figure out how virtual registers should map to machine registers. We first figure out when certain values can be unboxed. Then, instructions are reordered in order to reduce register pressure. That is, we try to schedule instructions around each other so that we don't need to store more values than we have machine registers. That way, we avoid spilling registers onto the heap, which wastes time. After leaving SSA form, we perform a linear scan register allocation, which replaces virtual registers with machine registers and inserts ##spill and ##reload instructions for the cases we can't avoid. Figure 40 on the following page shows an example on an Intel x86 machine, which has enough registers that we needn't spill anything.

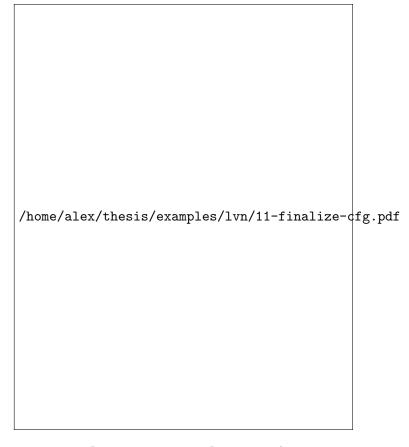


Figure 40: 0 100 [ 1 fixnum+fast ] times after finalize-cfg

# 4 Value Numbering

At a very basic level, most optimization techniques revolve around avoiding redundant or unnecessary computation. Thus, it's vital that we discover which values in a program are equal. That way, we can simplify the code that wastes machine cycles repeatedly calculating the same values. Classic optimization phases like constant/copy propagation, common subexpression elimination, loop-invariant code motion, induction variable elimination, and others discussed in the de facto treatise, "The Dragon Book" [Aho et al. 2007], perform this sort of redundancy elimination based on information about the equality of expressions.

In general, the problem of determining whether two expressions in a program are equivalent is undecidable. Therefore, we seek a *conservative* solution that doesn't necessarily identify all equivalences, but is nevertheless correct about any equivalences it does identify. Solving this equivalence problem is the work of *value numbering* algorithms. These assign

every value in the program a number such that two values have the same value number if and only if the compiler can prove they will be equal at runtime.

Value numbering has a long history in literature and practice, spanning many techniques. In Section 3.3 we saw the value-numbering word, which is actually based on some of the earliest—and least effective—methods of value numbering. Section 4.1 describes the way Factor's current algorithm works, and highlights its shortcomings to motivate the main work of this thesis, which is covered in Sections 4.2 and 4.3. We finish the chapter by analyzing the results of these changes and reviewing the literature for further enhancements that can be made to this optimization pass.

## 4.1 Local Value Numbering

Tracing the exact origins of value numbering is difficult. It's thought to have originally been invented in the 1960s by Balke [Simpson 1996]. The earliest tangible reference to a value numbering (at least, the earliest point where discussions in the literature seem to start) appears in an oft-cited but unpublished work of Cocke and Schwartz [1970]. The technique is relatively simple, but not as powerful as other methods for reasons described hereafter.

The algorithm considers a single basic block. For each instruction (from top to bottom) in the block, we essentially let the value number of the assignment target be a hash of the operator and the value numbers of the operands. That is, we hash the *expression* being computed by an instruction. Thus, assuming a proper hash function, two expressions are *congruent* if

- they have the same operators and
- their operands are congruent.

This is our approximation of runtime equivalence. The first property is fulfilled by basing the hash, in part, on the operator. The second property holds because the hash is based on the value numbers of the statement's operands—not just the operands as they appear in code (i.e., *lexical* equivalence). Any information about congruence is propagated through the value numbers. We'll have discovered any such equivalences among the operands before computing the value number of the assignment target because every value in a basic block is either defined before it's used, or else defined at some point in a predecessor of the block, which we don't care about when only considering one basic block.

This is the first shortcoming of the algorithm. It is local, focusing on only one basic block at a time. Any definitions outside the boundaries of the basic block won't be reused, even if they reach the block. This severely limits the scope of the redundancies we can discover. We could improve upon this by considering the algorithm across an entire loop-free CFG in any  $topological\ order$ . In such an ordering, a basic block B comes before any other block B' to which it has an edge. Thus, any "outside" variables that instructions in B' rely on must have come from B or earlier, which will have already been computed in a traversal of such an ordering. However, CFGs usually contain cycles or loops (at least interesting ones do), which make such an ordering impossible. We could still pick a topological order that ignores back-edges, but we may encounter operands whose values flow along those back-edges, so haven't been processed yet. We'll address this issue later.

In Factor, expressions are basically instructions (the insn objects discussed in Section 3.3) that have had their destination registers stripped. Instructions can be converted to expressions with the <code>>expr</code> word defined in the <code>compiler.cfg.value-numbering.expressions</code> vocabulary. For instance, an <code>##add</code> instruction with the destination register 1 and source registers 2 and 3 will be converted into an array of three elements:

- The ##add class word, indicating the expression is derived from an ##add instruction.
- The value number of the virtual register 2.
- The value number of the virtual register 3.

Some instructions are not referentially transparent, meaning they can't be replaced with the value they compute without changing the program's behavior. For example, ##call and

##branch cannot reasonably be converted into expressions. In these cases, >expr merely returns a unique value.

```
! Copyright (C) 2008, 2010 Slava Pestov.
! See http://factorcode.org/license.txt for BSD license.
USING: accessors kernel math namespaces assocs;
IN: compiler.cfg.value-numbering.graph
SYMBOL: input-expr-counter
! assoc mapping vregs to value numbers
! this is the identity on canonical representatives
SYMBOL: vregs>vns
! assoc mapping expressions to value numbers
SYMBOL: exprs>vns
! assoc mapping value numbers to instructions
SYMBOL: vns>insns
: vn>insn ( vn -- insn ) vns>insns get at ;
: vreg>vn ( vreg -- vn ) vregs>vns get [ ] cache ;
: set-vn ( vn vreg -- ) vregs>vns get set-at ;
: vreg>insn ( vreg -- insn ) vreg>vn vn>insn ;
: init-value-graph ( -- )
   0 input-expr-counter set
   H{ } clone vregs>vns set
   H{ } clone exprs>vns set
   H{ } clone vns>insns set ;
```

Figure 41: The compiler.cfg.value-numbering.graph vocabulary

The hashing of expressions takes place in the so-called *expression graph* implemented in the vocabulary shown in Figure 41. This consists of three global hash tables that relate virtual registers, value numbers, instructions, and expressions. Since virtual registers are just integers, we actually use them as value numbers, too. **vregs>vns** maps virtual registers to their value numbers. If a virtual register is mapped to itself in this table, its definition is the canonical instruction that we use to compute the value. This instruction is stored

in the vns>insns table. Finally, the most important mapping is exprs>vns. True to its name, it uses expressions as keys, which of course are implicitly hashed. Thus, we can use this table to determine equivalence of expressions.

Other definitions in Figure 41 on the preceding page manipulate expressions and the graph. The global variable input-expr-counter is used in the generation of unique expressions discussed earlier. init-value-graph initializes this and all the tables. set-vn establishes a mapping from a virtual register to a value number in vregs>vns. vn>insn gives terse access to the vns>insns table. vreg>insn uses vregs>vns and vns>insns to get the canonical instruction that defines a given virtual register. Finally, vreg>vn looks up the value of a key in the vregs>vns table. Importantly, if the key is not yet present in the table, it is automatically mapped to itself—it's assumed that the virtual register does not correspond to a redundant instruction.

This is the second shortcoming of the algorithm. It must make a *pessimistic* assumption about congruences. That is, it starts by assuming that every expression has a unique value number, then tries to prove that there are some values which are actually congruent. This fails to discover congruences for values that flow along back-edges, whether we consider a single basic block or an entire topological ordering.

One the other hand, an advantage of this local value numbering algorithm is its simplicity. It makes a single pass over all the instructions, identifying and replacing redundancies online (i.e., rewriting as it goes). It's straightforward to write, and even to extend. In particular, there's nothing stopping the online replacements from being more complex than ##copy instructions. At every step, the currently known value numbers will be sound, and we can use this information for copy/constant propagation, constant folding, and common subexpression elimination.

To see how Factor accomplishes these extensions, we'll take a look at the compiler.cfg.value-numbering vocabulary. Figure 42 on the next page shows the main words that start the optimization pass. The value-numbering-step word is called on the sequence of instructions that comprise each basic block. It starts the expression graph from a blank slate with init-value-graph, then maps the word process-instruction on each

```
: value-numbering-step ( insns -- insns' )
    init-value-graph
    [ process-instruction ] map flatten ;

: value-numbering ( cfg -- cfg )
    dup [ value-numbering-step ] simple-optimization
    cfg-changed predecessors-changed ;
```

Figure 42: Main words from compiler.cfg.value-numbering

of them. This is a generic word that we'll study momentarily; it returns either a single insn object or a sequence of them (in the case that an instruction is replaced by several others). Then, the work of value-numbering is to just call value-numbering-step on each basic block, which is done with a combinator called simple-optimization. The words cfg-changed and predecessors-changed alter some internal state of the CFG that has been potentially invalidated by some transformations performed by process-instruction.

The methods of process-instruction are shown in Figure 43 on the following page. The default behavior for dispatching on an insn is to invoke yet another generic word, rewrite. This word will return either a replacement insn (or sequence thereof) or f, indicating that no change has taken place. Thus, by recursively calling process-instruction, we can do more specialized processing on this rewritten replacement (e.g., dispatching on insn again, which applies rewrite once more). If the instruction can't be simplified further, we simply return it. (Note that [X] [Y]?if is the same as dup [nip X] [drop Y] if.)

For instances of foldable-insn (i.e., insns that can be converted to useful expressions with >expr), we similarly invoke rewrite recursively until no more rewriting occurs. When that happens, rather than just return the instruction, we invoke check-redundancy—though only if the instruction defines exactly 1 virtual register, which will be stored in a slot named dst. check-redundancy checks if the expression being computed by the instruction is already a key of the exprs>vns table. If it is, the instruction is redundant, and we call redundant-instruction; otherwise, we call useful-instruction. The for-

```
GENERIC: process-instruction ( insn -- insn')
: redundant-instruction ( insn vn -- insn')
    [ dst>> ] dip [ swap set-vn ] [ <copy> ] 2bi ;
:: useful-instruction ( insn expr -- insn')
    insn dst>> :> vn
   vn vn vregs>vns get set-at
   vn expr exprs>vns get set-at
    insn vn vns>insns get set-at
    insn ;
: check-redundancy (insn -- insn')
    dup >expr dup exprs>vns get at
    [ redundant-instruction ] [ useful-instruction ] ?if ;
M: insn process-instruction
    dup rewrite [ process-instruction ] [ ] ?if ;
M: foldable-insn process-instruction
    dup rewrite
    [ process-instruction ]
    [ dup defs-vregs length 1 = [ check-redundancy ] when ] ?if ;
M: ##copy process-instruction
   dup [ src>> vreg>vn ] [ dst>> ] bi set-vn ;
M: array process-instruction
    [ process-instruction ] map ;
```

Figure 43: The workhorse of compiler.cfg.value-numbering

mer uses set-vn to map the instruction's dst virtual register to the same value number as the expression that was a key of exprs>vns. Since value numbers are actually virtual registers, we may also use these two integers the source and destination registers in a new ##copy instruction, which is then returned. On the other hand, useful-instruction saves the instruction's information in the expression graph by setting the appropriate values in vregs>vns, exprs>vns, and vns>insns. Note that in definitions using the syntax:: word-name ( stack -- effect ) . . . ;, the input values in the stack effect are actually named lexical variables, like in most programming languages. Furthermore, the first line

move this to primer?

insn dst>> :> vn assigns the input instruction's destination register to the variable vn, which is used later in the definition of useful-instruction.

The ##copy method of process-instruction cannot do anything to simplify the instruction, but will set the value number of the destination register to that of the source. By calling vreg>vn on the source register, we make sure to call set-vn between the destination and the canonical value number of the source.

Finally, the array method is used for the purposes of recursion, in the case that rewrite returns a sequence of replacement instructions. The correct action is, of course, to descend into this new sequence of instructions with process-instruction.

Underlying all of the redundancy elimination is the rewrite generic word. It has too many methods to look at the source code in-depth here, but it's instructive to give an overview of the transformations. These methods actually make up the bulk of the compiler.cfg.value-numbering code. They're spread across various sub-vocabularies. compiler.cfg.value-numbering.rewrite defines the generic itself, along with a handful of utilities. The method for the most general instruction class, insn, is defined to unconditionally return f, meaning no rewriting is performed by default. That way, we need only define rewrite methods for more specific instruction classes to get specialized behavior.

compiler.cfg.value-numbering.alien contains methods that simplify nodes related to Factor's FFI. Most involve fusing together the results of intermediate arithmetic. The instructions that access raw memory (namely ##load-memory, ##load-memory-imm, ##store-memory, and ##store-memory-imm) tend to have inputs to perform address arithmetic. Each has slots for a base register containing an address and a literal offset from it. But if base is defined by an ##add-imm instruction, we can just update the offset, incrementing it by the literal operand of the ##add-imm. Then, base will just be changed to the register operand of the ##add-imm. This removes the memory instruction's need for the ##add-imm, increasing the chances that the latter will become dead code to be removed later. Unlike the -imm variants, ##load-memory and ##store-memory also take a displacement register, which works like a non-immediate offset. Therefore, ##adds can be similarly fused into ##load-memory-imm and ##store-memory-imm by transforming

them into ##load-memory and ##store-memory instructions with the ##add's operand as the displacement. A few other similar transformations are also done, including rewrites for ##box-displaced-aliens and ##unbox-any-c-ptrs.

compiler.cfg.value-numbering.comparisons defines methods for the various branching and comparison instructions (which simply store booleans in registers, rather than branching upon them). The major optimizations performed are as follows:

- If possible, instructions are converted to more specific forms. For example, non-immediate instructions (e.g., ##compare) may be turned into their -imm counterparts (e.g., ##compare-imm) if one of their source registers corresponds to a literal value. ##compare-integer-imm is also converted to ##test if the architecture supports it. This corresponds to a special instruction in x86 that performs a bitwise AND for its side effects on particular flags, discarding the actual result. This can be more efficient when using the AND result as a boolean.
- If both inputs to a comparison or branch are literals, we may constant-fold the instruction. In the case of comparisons, this means converting it into a ##load-reference of the proper boolean. In branches, this modifies the CFG so that the path which isn't taken is removed completely.
- Like a novice programmer writing if (some\_boolean != false) { ... } in Java, the compiler may generate redundant boolean comparisons that need cleaning up. That is, the intermediate boolean values are eliminated when the result of a comparison is used by another comparison, collapsing the whole thing into a single instruction.

compiler.cfg.value-numbering.folding defines some auxiliary words for constant-folding arithmetic words. Mainly, unary-constant-fold and binary-constant-fold perform the actual operation on the one or two constant inputs provided. These words are used in compiler.cfg.value-numbering.math, which predictably simplifies math via standard rules. Arithmetic identities are rewritten—conceptually, x + 0 becomes just x, for instance. If self-inverting instructions (namely ##neg for numerical negation and ##not for boolean

negation) are called on registers that themselves correspond to the same instruction, we can safely rewrite them into ##copy instructions. Non-immediate instructions are converted to their -imm forms, if possible, and if both operands are constant, the expression is folded. The most interesting math optimizations use the associative and distributive laws. Reassociation conceptually converts  $(x \otimes y) \otimes z$  into  $x \otimes (y \otimes z)$  when both y and z are constants and  $\otimes$  is associative. So, for example,

##add-imm 1 X Y

##add-imm 2 1 Z

is converted into just

where X is a virtual register, and Y and Z are constants. Distribution converts  $(x \oplus y) \otimes z$  into  $(x \otimes z) \oplus (y \otimes z)$ , where y and z are constants,  $\oplus$  corresponds to addition or subtraction, and  $\otimes$  to multiplication or left bitwise shifts. Therefore,

##add-imm 1 X Y

##mul-imm 2 1 Z

is converted into

##mul-imm 3 X Y

##add-imm 2 3 (Y\*Z)

Notice that a new intermediate virtual register, 3, had to be created. However, if the product of Y and Z can be computed at compile-time and fits in an immediate operand, then we save cycles by using ##mul-imm on a smaller number.

The last few methods of rewrite provide some obvious simplifications. compiler.cfg.value-numbering.simd performs some limited constant-folding for vector operations. compiler.cfg.value-numbering.slots propagates ##add-imm address calculation to ##slot, ##set-slot, and ##write-barrier instructions in a manner similar to



Figure 44: 0 100 [ 1 fixnum+fast ] times before and after value-numbering

compiler.cfg.value-numbering.alien. Finally, compiler.cfg.value-numbering.misc provides a single method to rewrite ##replace into ##replace-imm if possible.

### make sure side-by-side figures aren't too crammed in final draft

To finish the discussion of local value numbering and Factor's particular implementation, we'll examine the example from Figure 37 on page 49 in depth. For convenience, the before/after snapshot of the CFG is reproduced in Figure 44.

value-numbering-step begins at block 1, where process-instruction is mapped across the instructions. ##inc-d 3 does not have a rewrite method, so remains untouched; it is also not a foldable-insn, so it is simply returned. While ##load-integer 21 0

doesn't have a rewrite method, it is a foldable-insn, so process-instruction calls check-redundancy. At this point, the expression graph is empty. Calling >expr converts this instruction into an integer-expr object representing 0. useful-instruction leaves the tables as follows:

```
! vregs>vns
H{ { 21 21 } }

! exprs>vns
H{ { T{ integer-expr { value 0 } } 21 } }

! vns>insns
H{
      { 21 T{ ##load-integer { dst 21 } { val 0 } { insn# 1 } } }
}
```

The next instruction in block 1, ##load-integer 22 100, behaves similarly, leaving:

```
! vregs>vns
H{ { 21 21 } { 22 22 } }

! exprs>vns
H{
     { T{ integer-expr { value 0 } } 21 }
     { Tf integer-expr { value 100 } } 22 }
}
! vns>insns
H{
     { 21 T{ ##load-integer { dst 21 } { val 0 } { insn# 1 } } }
```

The following instruction is ##load-integer 23 0. In calling check-redundancy, we discover that the integer expression for 0 is already in exprs>vns, so this is turned into a ##copy, and the value number is noted. The remaining instructions in block 1 (aside from ##branch) are all instances of ##copy. process-instruction thus only sets their value numbers in the vregs>vns table, leaving them with the following at the end of block 1:

```
! vregs>vns
H{
    { 21 21 }
    { 22 22 }
    { 23 21 }
    { 24 22 }
    { 25 21 }
    { 26 22 }
    { 27 21 }
}
! exprs>vns
H{
    { T{ integer-expr { value 0 } } 21 }
    { T{ integer-expr { value 100 } } 22 }
}
! vns>insns
```

```
H{
    { 21 T{ ##load-integer { dst 21 } { val 0 } { insn# 1 } } }
    {
        22
        T{ ##load-integer { dst 22 } { val 100 } { insn# 2 } }
}
```

Next, block 2 in Figure 44 on page 62 is processed. The tables are all reset, so even though block 1 happens to dominate block 2, none of its definitions are known to value-numbering. The ##phis are ignored, as no important methods dispatch upon them. In trying to rewrite the ##compare-integer, we call vreg>vn on the operands. Since they aren't in the vregs>vns table yet, they are assumed to be unique values. This assumption is pessimistic—we'd rather the values be the same, so we can remove redundancy. It happens to be correct here, though, as 26 corresponds to the integer 100, while 30 is an induction variable of the loop. However, ##compare-integer cannot be rewritten into an immediate form, since our focus is local to the basic block, so we don't know that 26 has the value 100. The ##copy instructions are processed as usual, and ##compare-imm-branch 32 f cc/= is rewritten into a ##compare-integer-branch, as the virtual register 32 has the same value (through the copies) as the ##compare-integer result. This is a case of simplifying the if (some\_boolean != false) { ... } pattern, and the definition of the register 31 becomes dead code after rewrite finishes with this last instruction. The expression graph is populated thus by the end:

```
! vregs>vns
H{
     { 32 31 }
     { 33 26 }
     { 34 31 }
     { 26 26 }
```

```
{ 30 30 }
    { 31 31 }
}
! exprs>vns
H{ { { ##compare-integer 30 26 cc< } 31 } }
! vns>insns
H{
    {
        31
        T{ ##compare-integer
            { dst 31 }
            { src1 30 }
            { src2 22 }
            { cc cc< }
            { temp 9 }
            { insn# 2 }
        }
    }
}
```

Once again, the tables are reset and we proceed to block 3. The first instruction, ##load-integer 35 1, is entered into the expression graph. Since 35 is an operand of ##add 36 29 35, rewrite changes this instruction into an ##add-imm, as we know the constant value of the operand. The next ##load-integer gets turned into a ##copy, like in block 1, and the next ##add is similarly changed to ##add-imm. The copies do little but set more value numbers. As process-instruction calls vreg>vn on their sources, we'll insert entries into vregs>vns for those defined outside of the block, like 26. This leaves us

with the following tables:

```
! vregs>vns
H{
    { 35 35 }
    { 36 36 }
    { 37 35 }
    { 38 38 }
    { 39 30 }
    { 40 26 }
    { 41 36 }
    { 26 26 }
    { 42 38 }
    { 29 29 }
    { 30 30 }
}
! exprs>vns
H{
    { { ##add-imm 30 1 } 38 }
    { { ##add-imm 29 1 } 36 }
    { T{ integer-expr { value 1 } } 35 }
}
! vns>insns
Н{
    { 36 T{ ##add-imm { dst 36 } { src1 29 } { src2 1 } } }
    { 38 T{ ##add-imm { dst 38 } { src1 30 } { src2 1 } } }
    { 35 T{ ##load-integer { dst 35 } { val 1 } { insn# 0 } } }
}
```

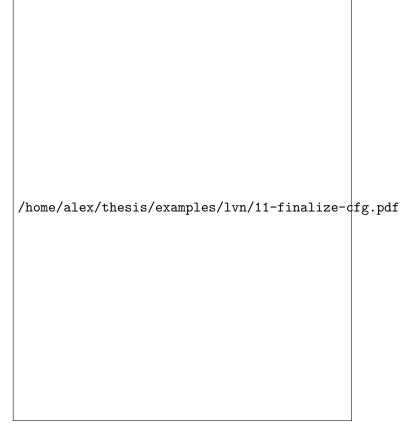


Figure 45: The final representation for 0 100 [ 1 fixnum+fast ] times

The fourth invocation of value-numbering-step does not do anything interesting, as the ##replace cannot be changed into a ##replace-imm.

In summary, we managed to replace redundancies within basic blocks online by maintaining some simple hash tables. After copy propagation and dead code elimination, the CFG gets finalized to the one shown in Figure 45. Because the value numbering algorithm was local, the ##compare-integer-branch in block 2 could not be simplified to a ##compare-integer-imm-branch, and we instead have to waste a register on the integer 100. But it's important to note that even considering a topological ordering of the CFG wouldn't have worked, as we'd have to ignore back-edges. The ##phis that used to be in block 2 had inputs that flowed along the back-edge, and our pessimistic assumption would have to classify these values as distinct. One is for the counter introduced by times, and the other is from the top value of the stack being incremented by fixnum+fast. In this case, however, these induction variables are actually equal: both start at 0 and are incremented

by 1 on each loop. In terms of the CFG in Figure 45 on the previous page, the EAX and EDX registers are equivalent. Yet the combination of the pessimism and locality of the algorithm keep us from discovering this.

## 4.2 Global Value Numbering

Answering the challenges of Cocke and Schwartz, Alpern, Wegman, and Zadeck [1988] described what would be the de facto value numbering algorithm for several years, and rightly so. It was a properly *global* value numbering algorithm, working across an entire CFG instead of on single basic blocks. Their paper was important in another very relevant way: it is the first published reference to SSA form [VanDrunen 2004], including an algorithm for its construction.

Though we could try to extend the scope of Factor's local value numbering, it is still inherently pessimistic. The algorithm of Alpern, Wegman, and Zadeck, which is commonly referred to simply as AWZ, uses a modification of a minimization algorithm for finite state automata [Hopcroft 1971]. It works on an *optimistic* assumption by first assuming every value has the same value number, then trying to prove that values are actually different. It does this by treating value numbers as *congruence classes* that partition the set of virtual registers. If two values are in the same class, then they are congruent, where congruence is defined as in Section 4.1.

Such a partition is not unique, in general. For instance, a trivial one places each value in its own congruence class. So, we look for the maximal fixed point—the solution that has the most congruent values and therefore the fewest congruence classes. We must start with a congruence class for each operation so that, say, all values computed by ##adds are grouped together, those computed by ##muls are in the same class, etc. We must then iteratively look at our collection of classes, separating them when we discover incongruent values. For an SSA variable in class P, we look at its defining expression. If an operand at position i belongs to class Q, then the i<sup>th</sup> operand of every other value in P should also be in Q. Otherwise, P must be split by removing those variables whose i<sup>th</sup> operands are not

in class Q and placing them in a new congruence class. We keep splitting classes until the partitioning stabilizes.

The optimistic assumption may seem dangerous. Is it possible that we're "overoptimistic"? That two values assumed to be congruent and not proven incongruent might actually be inequivalent when the program is run? The AWZ paper dedicates a section to proving that two congruent variables are equivalent at a point p in the program if their definitions dominate p. The proof is a bit quirky, but reasonable. They develop a dynamic notion of dominance in a running program which implies static dominance in the code, then show that congruence implies runtime equality (though equivalence does not imply congruence).

AWZ made the need for GVN algorithms apparent. However, finite state automata minimization makes for a more complicated algorithm than hash-based value numbering. A naïve implementation can be quadratic, although careful data structure and procedure design can make it  $O(n \log n)$ . Furthermore, it's resistant to the same improvements we easily added to the local value numbering. To even consider the commutativity of operations requires changes in operand position tracking and splitting—the heart of the algorithm. It is generally limited by what the programmer writes down: deeper congruences due to, say, algebraic identities can't be discovered.

In fact, by performing an optimization that uses the GVN information, more GVN congruences may arise. If we can somehow perform the two analyses simultaneously, they'll produce better results. This generalizes to interdependent compiler optimizations at large, as elucidated in Click's dissertation [1995], which describes a method for formalizing and combining separate optimizations that make optimistic assumptions (whatever they happen to be for each particular analysis). He uses this to merge GVN with conditional constant propagation, which itself is a combination of constant propagation and unreachable code elimination (pretty much like the **propagate** pass from Section 3.2). Furthermore, GVN is extended to handle algebraic identities, propagate constants, and fold redundant  $\phi$ s. Unfortunately, the straightforward algorithm for this is  $O(n^2)$ , while the  $O(n \log n)$  version presented is not just complicated, but can also miss some congruences between  $\phi$ -functions

[Click 1995; Simpson 1996].

Hot on the heels of this work, Simpson's [1996] dissertation provides probably the most exhaustive treatment of GVN algorithms. He presents several extensions, such as incorporating hash-based local value numbering into SSA construction, handling commutativity in AWZ, and performing redundant store elimination. He builds off of the two classical algorithms independently, which underlines their inherent differences and limitations. In general, hash-based value numbering is easy to extend without greatly impacting the runtime complexity, as is the case in Factor's implementation.

Drawing from this experience, Simpson's hallmark algorithm combines the best of both worlds by taking the hash-based algorithm which is easy to understand, implement, and extend, and making it global, so it identifies more congruences. Dubbed the "reverse postorder (RPO) algorithm", it simply applies hash-based value numbering iteratively over the CFG until we reach the same fixed point computed by AWZ. (The fact that it computes the exact same fixed point is proven fairly straightforwardly in the dissertation.) It could technically traverse the CFG in any topological order, but Simpson defaults to reverse postorder.

Because it is based off the hashing algorithm, we get the benefits essentially for free. The same simplifications can be performed, but with the added knowledge of global congruences. Since the majority of Factor's value numbering code is dedicated to the rewrite generic, it makes sense to reuse as much of that code as possible. Therefore, to convert Factor's local algorithm to a global one, I modified the existing code to use the RPO algorithm.

The most fundamental change is to the expression graph. Referring to Figure 46 on the following page, we see most of the same code as in Figure 41 on page 55, with changes indicated by arrows ( $\longrightarrow$ ). Two more global variables have been added, namely changed? and final-iteration? The former is what we use to guide the fixed-point iteration. As long as value numbers are changing, we keep iterating. An important side effect of this is that we can no longer perform rewrite online, since the transformations we make aren't guaranteed to be sound on any iteration except the final one. This makes the RPO algorithm work offline, first discovering redundancies, then eliminating them in a separate

```
! Copyright (C) 2008, 2010 Slava Pestov, 2011 Alex Vondrak.
! See http://factorcode.org/license.txt for BSD license.
USING: accessors kernel math namespaces assocs;
IN: compiler.cfg.gvn.graph
SYMBOL: input-expr-counter
! assoc mapping vregs to value numbers
! this is the identity on canonical representatives
SYMBOL: vregs>vns
! assoc mapping expressions to value numbers
SYMBOL: exprs>vns
! assoc mapping value numbers to instructions
SYMBOL: vns>insns
! boolean to track whether vregs>vns changes
SYMBOL: changed?
! boolean to track when it's safe to alter the CFG in a rewrite
! method (i.e., after vreqs>vns stops changing)
SYMBOL: final-iteration?
: vn>insn ( vn -- insn ) vns>insns get at ;
: vreg>vn ( vreg -- vn ) vregs>vns get at ;
: set-vn ( vn vreg -- )
   vregs>vns get maybe-set-at [ changed? on ] when ;
: vreg>insn ( vreg -- insn ) vreg>vn vn>insn ;
: clear-exprs ( -- )
   exprs>vns get clear-assoc
   vns>insns get clear-assoc ;
: init-value-graph ( -- )
   0 input-expr-counter set
   H{ } clone vregs>vns set
   H{ } clone exprs>vns set
   H{ } clone vns>insns set ;
```

Figure 46: The compiler.cfg.gvn.graph vocabulary

pass. When this elimination pass starts, we'll set final-iteration? to t.

A key change is in the vreg>vn word, which now makes an optimistic assumption about previously unseen values. Given a new virtual register that wasn't in the vregs>vns table, the old version would map the register to itself, making the value its own canonical representative. However, if this version tries to look up a key that does not exist in the hash table, it will simply return **f** (which Factor will do by default with the **at** word). Therefore, every value in the CFG starts off with the same value "number", **f**. By the end of the GVN pass, there should be no value left that hasn't been put in the vregs>vns table, as we'll have processed every definition.

To keep track of whether vregs>vns changes, we simply need to alter set-vn. Here, we use maybe-set-at, a utility from the assocs vocabulary. This works like set-at, establishing a mapping in the hash table. In addition, it returns a boolean indicating change: if a new key has been added to the table, we return t. Otherwise, we return t only in the case where an old key is mapped to a new value. If an old key is mapped to the same value that's already in the table, maybe-set-at returns f. Therefore, when vregs>vns does change, we set changed? to t (which is what the on word does).

Finally, we define a new utility word, clear-exprs, which resets the exprs>vns and vns>insns tables. Unlike the local value numbering phase, we don't reset the entire expression graph. Instead, we make a pass over the whole CFG at a time. The only reason optimism works is that we keep trying to disprove our foolhardy assumptions. Really, vregs>vns establishes congruence classes of value numbers. At first, every value belongs in one class, f. We make a pass over the CFG to disprove whatever we can about this. If we've introduced new congruence classes (new values in the vregs>vns hash), we do another iteration. But each time, we use the congruence classes discovered from the previous iteration. At the start of each new pass, the expressions and instructions in exprs>vns and vns>insns are invalidated—their results are based on old information. So, these are erased on each iteration. Much like AWZ, we keep splitting classes until they can't be split anymore.

This logic is captured in Figure 47 on the following page. Rather than reset the ta-

```
: value-numbering-step ( insns -- )
    [ simplify value-number ] each ;

: value-numbering-iteration ( cfg -- )
    clear-exprs [ value-numbering-step ] simple-analysis ;

: determine-value-numbers ( cfg -- )
    final-iteration? off
    init-value-graph
    '[
        changed? off
        _ value-numbering-iteration
        changed? get
    ] loop ;
```

Figure 47: Main logic in compiler.cfg.gvn

bles when we start processing each basic block in value-numbering-step like before, we call clear-exprs on each iteration over the CFG in value-numbering-iteration. Note that value-numbering-step no longer returns the changed instructions, as we aren't replacing them online. value-numbering-iteration uses simple-analysis instead of simple-optimization, which only expects global state to change—no instructions are updated in the block. Much to our advantage, simple-analysis already traverses the CFG in reverse postorder, so we needn't worry about traversal order. The top-level word determine-value-numbers ties this all together by calling value-numbering-iteration until we can get through it with changed? remaining false.

```
GENERIC: simplify ( insn -- insn' )

M: insn simplify dup rewrite [ simplify ] [ ] ?if ;

M: array simplify [ simplify ] map ;

M: ##copy simplify ;
```

Figure 48: Iterated rewriting in compiler.cfg.gvn

Note that the work of value-numbering-step is further divided into two words, simplify and value-number. These combine to do much the same work as process-instruction in Figure 43. simplify makes the repeated calls to rewrite until

```
GENERIC: value-number ( insn -- )
M: array value-number [ value-number ] each ;
: record-defs ( insn -- ) defs-vregs [ dup set-vn ] each ;
M: alien-call-insn value-number record-defs;
M: ##callback-inputs value-number record-defs;
M: ##copy value-number [ src>> vreg>vn ] [ dst>> ] bi set-vn ;
: redundant-instruction ( insn vn -- )
    swap dst>> set-vn ;
:: useful-instruction ( insn expr -- )
   insn dst>> :> vn
   vn vn set-vn
   vn expr exprs>vns get set-at
    insn vn vns>insns get set-at ;
: check-redundancy ( insn -- )
    dup >expr dup exprs>vns get at
    [ redundant-instruction ] [ useful-instruction ] ?if ;
M: ##phi value-number
   dup inputs>> values [ vreg>vn ] map sift
   dup all-equal? [
        [ drop ] [ first redundant-instruction ] if-empty
   [ drop check-redundancy ] if ;
M: insn value-number
    dup defs-vregs length 1 = [ check-redundancy ] [ drop ] if ;
```

Figure 49: Assigning value numbers in compiler.cfg.gvn

the instruction cannot be simplified further. Its definition is in Figure 48 on page 74. We then pass the simplified instruction to value-number, which is defined in Figure 49 on the preceding page. This also has a similar structure to process-instruction. The main difference is that instructions are no longer returned (again, they aren't altered in place). So, the array method uses each instead of map to recurse into the results of rewrite.

A subtle change is necessary with the alien-call-insn and ##callback-inputs methods. Whereas process-instruction merely skipped over certain instructions that could not be rewritten, here we don't have that luxury. We need to be careful to set-vn every virtual register that gets defined by any instruction. While making a pessimistic assumption, it didn't matter if we did this: any unseen value would be presumed important by vreg>vn. However, with the optimistic assumption, vreg>vn will give the impression that unseen values are all the same by returning f. Therefore, we simply record the virtual registers defined in instructions that may define one or more of them. Specifically, alien-call-insn and ##callback-inputs are classes that correspond to FFI instructions.

The ##copy method uses set-vn the same way as before. redundant-instruction, useful-instruction, and check-redundancy are also largely the same. These have just been tweaked to not return instructions.

```
M: ##phi >expr
  inputs>> values [ vreg>vn ] map
  basic-block get number>> prefix
  \ ##phi prefix ;
```

Figure 50:  $\phi$  expressions in compiler.cfg.gvn.expressions

The ##phi method in Figure 49 on the previous page represents a major change. Before, ##phis were left uninterpreted. Congruences between induction variables that flowed along back-edges would not be identifiable. But now, by checking for redundant ##phis, we may reduce them to copies. Each ##phi object has an inputs slot, which is a hash table from basic block to the virtual register that flows from that block. Thus, there is one input for each predecessor. The values of the hash will be the virtual registers that might be selected for the dst value. We look up the value numbers of these, removing all instances of f with

the **sift** word. If all of the inputs are congruent, we can call redundant-instruction, setting the value number of the ##phi's dst to the value number of its first input (without loss of generality). The all-equal? word will return t if the sequence is empty (as it's vacuously true), so we must make sure not to call first on the sequence, since this will be a runtime error. If the sequence is empty, we needn't note the redundancy, as the ##phi's dst will already have the optimistic value number f anyway. Otherwise, we call check-redundancy. The purpose of this is to identify ##phis that are equal to each other. Even if its inputs are incongruent, a ##phi might still represent a copy of another induction variable. So that check-redundancy works, we also define a >expr method in compiler.cfg.gvn.expressions, as seen in Figure 50 on the preceding page. Here, the expression is an array consisting of the ##phi class word, the current basic block's number, and the inputs' value numbers. We include the basic block number because only ##phis within the same block can be considered equivalent to each other.

The final method in Figure 49 on page 75 defines the default behavior for value-number, which calls check-redundancy on the simplified instruction if it defines a single virtual register. Note that we separate the alien-call-insn and ##callback-inputs logic from this, since they happen to define a variable number of registers. If particular instances define only one register, we still don't want to call check-redundancy on them, since they don't have a dst slot. To avoid calling dst>> and triggering an error in useful-instruction, we needed separate methods for the FFI classes.

With these changes, we can globally identify value numbers, including equivalences that arise from simplifying instructions (even though no replacements are actually done yet). To illustrate this, consider again the example 0 100 [ 1 fixnum+fast ] times, reproduced in Figure 51 on the following page. As the expression graph changes frequently in this new algorithm, instead of showing the literal hash tables we'll use a shorthand notation. Virtual registers will be integers, and to avoid confusion value numbers will be written in brackets, like  $\langle n \rangle$ . Then, we'll show vreg>vn mappings with the notation  $n \to \langle n \rangle$ , where n is the register and  $\langle n \rangle$  is the value number. If there is a corresponding expression in exprs>vns, it will be denoted after the mapping, like  $n \to \langle n \rangle$  (expression). With the expressions,

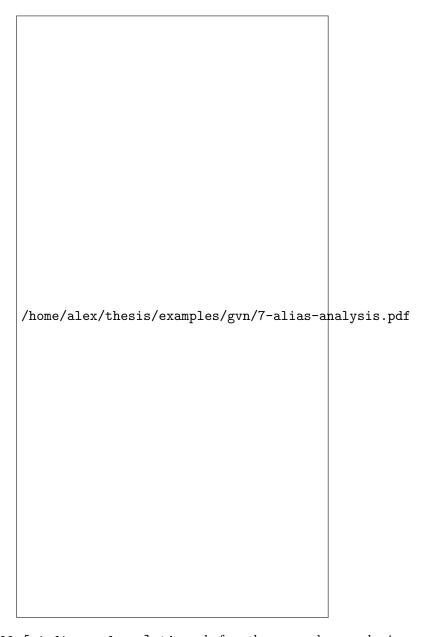


Figure 51: 0 100 [ 1 fixnum+fast ] times before the new value numbering pass

the instructions in vns>insns are a bit redundant for understanding the value numbering process, so they will be elided. Any mappings to **f** will be elided, as they're understood to be implicit when a key is absent.

## Might make separate figures of each block, for easier reference

determine-value-numbers starts the first iteration, which of course starts at basic block 1. ##inc-d is a no-op, but the first two ##load-integers are established as useful instructions. ##load-integer 23 0 is recognized as redundant, since at this point we know that 21 has the value 0. The ##copy instructions all pile on value number mappings, leaving us with the following:

$$21 \rightarrow \langle 21 \rangle$$
 (0)

$$22 \rightarrow \langle 22 \rangle$$
 (100)

$$23 \rightarrow \langle 21 \rangle$$

$$24 \rightarrow \langle 22 \rangle$$

$$25 \rightarrow \langle 21 \rangle$$

$$26 \rightarrow \langle 22 \rangle$$

$$27 \rightarrow \langle 21 \rangle$$

At iteration 1, basic block 2, the first ##phi has inputs 25 (from block 1) and 41 (from block 3). The former has the value number  $\langle 21 \rangle$ , while the latter is still at **f**. We treat this value number much like a  $\top$  element, unifying it with the other input to give us the assumption that 29 will be a copy of 25. Thus, it gets the same value number. A similar choice happens for the second ##phi. The instruction ##compare-integer 31 30 26 cc< 9 is an interesting case. Due to our optimistic assumptions thus far, we believe 30 is carrying the value 0, and that 26 is set to 100. Thus, this instruction gets constant-folded by simplify into ##load-reference 31 t. The CFG isn't changed, but the expression graph reflects this belief. Later, this assumption will be invalidated. The following copies are processed as usual, with the distinct difference here that ##copy 33 26 any-rep has the global knowledge of the value number of 26. Because the ##compare-integer was constant-folded, so

is the ##compare-imm-branch—and to the same value, no less. This leaves us with:

$$21 \rightarrow \langle 21 \rangle \quad (0)$$

$$22 \rightarrow \langle 22 \rangle$$
 (100)

$$23 \rightarrow \langle 21 \rangle$$

$$24 \rightarrow \langle 22 \rangle$$

$$25 \rightarrow \langle 21 \rangle$$

$$26 \rightarrow \langle 22 \rangle$$

$$27 \rightarrow \langle 21 \rangle$$

$$29 \rightarrow \langle 21 \rangle$$

$$30 \rightarrow \langle 21 \rangle$$

$$31 \rightarrow \langle 31 \rangle$$
 (t)

$$32 \rightarrow \langle 31 \rangle$$

$$33 \rightarrow \langle 22 \rangle$$

$$34 \rightarrow \langle 31 \rangle$$

Block 3 of iteration 1 gives the ##load-integers' destinations the same value number, corresponding to the integer 1. Because optimism makes the algorithm think that 29 and 30 correspond to the integer 0, the ##adds are constant-folded. This leaves us with:

$$21 \rightarrow \langle 21 \rangle$$
 (0)

$$22 \rightarrow \langle 22 \rangle$$
 (100)

$$23 \rightarrow \langle 21 \rangle$$

$$24 \rightarrow \langle 22 \rangle$$

$$25 o \langle 21 \rangle$$

$$26 \rightarrow \langle 22 \rangle$$

$$27 \rightarrow \langle 21 \rangle$$

$$29 \rightarrow \langle 21 \rangle$$

$$30 \rightarrow \langle 21 \rangle$$

- $31 \rightarrow \langle 31 \rangle$  (t)
- $32 \to \langle 31 \rangle$
- $33 \rightarrow \langle 22 \rangle$
- $34 \rightarrow \langle 31 \rangle$
- $35 \rightarrow \langle 35 \rangle$  (1)
- $36 \rightarrow \langle 35 \rangle$
- $37 \to \langle 35 \rangle$
- $38 \rightarrow \langle 35 \rangle$
- $39 \rightarrow \langle 21 \rangle$
- $40 \to \langle 22 \rangle$
- $41 \rightarrow \langle 35 \rangle$
- $42 \rightarrow \langle 35 \rangle$

While block 4 is visited in each iteration, it doesn't define any registers, so doesn't affect the state of value numbering. Therefore, the above is the state left at the end of iteration 1.

Since vregs>vns clearly changed, iteration 2 commences by clearing the expressions, though the value numbers remain. Block 1 doesn't change from iteration 1, giving us:

- $21 \rightarrow \langle 21 \rangle$  (0)
- $22 \rightarrow \langle 22 \rangle$  (100)
- $23 \rightarrow \langle 21 \rangle$
- $24 \rightarrow \langle 22 \rangle$
- $25 o \langle 21 \rangle$
- $26 \rightarrow \langle 22 \rangle$
- $27 \to \langle 21 \rangle$
- $29 \to \langle 21 \rangle$
- $30 \to \langle 21 \rangle$

$$31 \rightarrow \langle 31 \rangle$$

$$32 \rightarrow \langle 31 \rangle$$

$$33 \rightarrow \langle 22 \rangle$$

$$34 \rightarrow \langle 31 \rangle$$

$$35 \rightarrow \langle 35 \rangle$$

$$36 \rightarrow \langle 35 \rangle$$

$$37 \to \langle 35 \rangle$$

$$38 \rightarrow \langle 35 \rangle$$

$$39 \rightarrow \langle 21 \rangle$$

$$40 \rightarrow \langle 22 \rangle$$

$$41 \rightarrow \langle 35 \rangle$$

$$42 \rightarrow \langle 35 \rangle$$

Now that we're in iteration 2, the inputs to the ##phis of block 2 have been processed once before. For instance, we still believe that 25 corresponds to the integer 0 (which is incidentally correct), but now that 41 has the value number  $\langle 35 \rangle$ , we think it corresponds to the integer 1. While this is incorrect, it does break the congruence between the inputs, making the first ##phi a useful instruction. The second ##phi, however, still looks like a copy of the first. Even so, this is sufficiently different that the following ##compare-integer cannot be constant-folded like before. However, it can still be converted to a ##compare-integer-imm, as one of its operands corresponds to an integer. The redundant ##compare-imm-branch gets rewritten to the same expression as the ##compare-integer, so winds up getting the same value number. This gives us:

$$21 \rightarrow \langle 21 \rangle$$
 (0)

$$22 \rightarrow \langle 22 \rangle$$
 (100)

$$23 \rightarrow \langle 21 \rangle$$

$$24 \rightarrow \langle 22 \rangle$$

$$25 \rightarrow \langle 21 \rangle$$

$$26 \rightarrow \langle 22 \rangle$$

$$27 \rightarrow \langle 21 \rangle$$

$$29 \rightarrow \langle 29 \rangle \quad (\#\#\text{phi 2 21 35})$$

$$30 \rightarrow \langle 29 \rangle$$

$$31 \rightarrow \langle 31 \rangle \quad (\#\#\text{compare-integer-imm 29 100 cc})$$

$$32 \rightarrow \langle 31 \rangle$$

$$33 \rightarrow \langle 22 \rangle$$

$$34 \rightarrow \langle 31 \rangle$$

$$35 \rightarrow \langle 35 \rangle$$

$$36 \rightarrow \langle 35 \rangle$$

$$37 \rightarrow \langle 35 \rangle$$

$$38 \rightarrow \langle 35 \rangle$$

$$39 \rightarrow \langle 21 \rangle$$

$$40 \rightarrow \langle 22 \rangle$$

$$41 \rightarrow \langle 35 \rangle$$

$$42 \rightarrow \langle 35 \rangle$$

Block 3 of iteration 2 also changes, since the ##adds can't be constant-folded like before due to our new discovery about the ##phis. However, the first one can still be converted to an ##add-imm, and the second is marked the same as the first. This leaves the following value numbers:

$$21 \rightarrow \langle 21 \rangle \quad (0)$$

$$22 \rightarrow \langle 22 \rangle \quad (100)$$

$$23 \rightarrow \langle 21 \rangle$$

$$24 \rightarrow \langle 22 \rangle$$

$$25 \rightarrow \langle 21 \rangle$$

$$26 \rightarrow \langle 22 \rangle$$

```
27 \rightarrow \langle 21 \rangle
29 \rightarrow \langle 29 \rangle
                           (##phi 2 21 35)
30 \rightarrow \langle 29 \rangle
31 \rightarrow \langle 31 \rangle
                            (##compare-integer-imm 29 100 cc<)
32 \rightarrow \langle 31 \rangle
33 \rightarrow \langle 22 \rangle
34 \rightarrow \langle 31 \rangle
35 \rightarrow \langle 35 \rangle (1)
36 \rightarrow \langle 36 \rangle (##add-imm 29 1)
37 \rightarrow \langle 35 \rangle
38 \rightarrow \langle 36 \rangle
39 \rightarrow \langle 29 \rangle
40 \rightarrow \langle 22 \rangle
41 \rightarrow \langle 36 \rangle
42 \rightarrow \langle 36 \rangle
```

Since the value numbers changed, we start iteration 3. The expressions are cleared, and block 1 once again does not change anything. The first ##phi in block 2 still gets classified as useful, so no value numbers change. The major difference, though, is that the previous iteration's value numbers for registers in block 3 update the expression we have for the ##phi. Whereas before we thought it was choosing between  $\langle 21 \rangle$  (the integer 0) and  $\langle 35 \rangle$  (the integer 1), the ##add wasn't constant-folded in the previous iteration. Therefore, the virtual register 41 now corresponds to the result of the ##add with the value number  $\langle 36 \rangle$ . We still can't disprove that the second ##phi is different (because it, in fact, isn't). So, we're left with the following after iteration 3 finishes with block 2:

$$21 \rightarrow \langle 21 \rangle \quad (0)$$

$$22 \rightarrow \langle 22 \rangle$$
 (100)

$$23 \rightarrow \langle 21 \rangle$$

$$24 \rightarrow \langle 22 \rangle$$

$$25 \rightarrow \langle 21 \rangle$$

$$26 \rightarrow \langle 22 \rangle$$

$$27 \rightarrow \langle 21 \rangle$$

$$29 \rightarrow \langle 29 \rangle \quad (\#\#phi \ 2 \ 21 \ 36)$$

$$30 \rightarrow \langle 29 \rangle$$

$$31 \rightarrow \langle 31 \rangle \quad (\#\#compare-integer-imm \ 29 \ 100 \ cc <)$$

$$32 \rightarrow \langle 31 \rangle$$

$$33 \rightarrow \langle 22 \rangle$$

$$34 \rightarrow \langle 31 \rangle$$

$$35 \rightarrow \langle 35 \rangle$$

$$36 \rightarrow \langle 36 \rangle$$

$$37 \rightarrow \langle 35 \rangle$$

$$38 \rightarrow \langle 36 \rangle$$

$$39 \rightarrow \langle 29 \rangle$$

$$40 \rightarrow \langle 22 \rangle$$

$$41 \rightarrow \langle 36 \rangle$$

$$42 \rightarrow \langle 36 \rangle$$

Blocks 3 and 4 do not produce any more changes, so GVN has stabilized after 3 iterations, with our final congruence classes being:

$$\langle 21 \rangle = \{21, 23, 25, 27\}$$

$$\langle 22 \rangle = \{22, 24, 26, 33, 40\}$$

$$\langle 29 \rangle = \{29, 30, 39\}$$

$$\langle 31 \rangle = \{31, 32, 34\}$$

$$\langle 35 \rangle = \{35, 37\}$$

$$\langle 36 \rangle = \{36, 38, 41, 42\}$$

teletype the numbers in the align\*s, I guess

## 4.3 Redundancy Elimination

Now that we've identified congruences across the entire CFG, we must eliminate any redundancies found. Since value numbering is now offline, this entails another pass. However, replacing instructions is more subtle with global value numbers than it is with local ones. Because values come from all over the CFG, we must consider if a definition is *available* at the point where we want to use it.

Figures 52 and 53 on pages 87–88 show the difference. In the former, we can see the CFG before value numbering for the code [ 10 ] [ 20 ] if 10 20 30. The two extra integers being pushed at the end are there to avoid branch splitting (see Section 3.3 on page 37). In block 4, there's a ##load-integer 27 10, which loads the value 10. In globally numbering values, we associate the ##load-integer 22 10 in block 2 with the value 10 first, making it the canonical representative. However, we can't replace the instruction in block 4 with ##copy 27 22, because control flow doesn't necessarily go through block 2, so the virtual register 22 might not even be defined. However, in Figure 53 on page 88, we see the CFG for the code 10 swap [ 10 ] [ 20 ] if 10 20 30. In this case, the first definition of the value 10 comes from block 1, which dominates block 4. So, the definition is available, and we can replace the ##load-integer in block 4 with a ##copy.

There are several ways to decide if we can use a definition at a certain point. For instance, we could use dominator information, so that if a definition in a basic block B can be used by any basic block dominated by B [Simpson 1996]. However, here we'll use a data flow analysis called *available expression analysis*, since it was readily implemented. Mercifully, Factor has a vocabulary that automatically defines data flow analyses with little more than a single line of code.

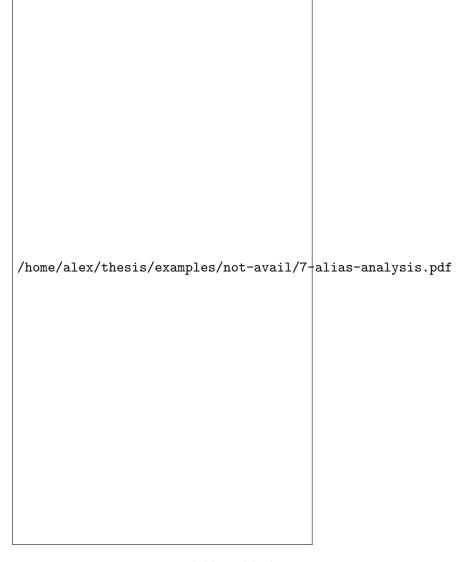


Figure 52: 10 is not available in block 4

Figure 54 on page 89 shows the vocabulary that defines the available expression analysis. It is a forward analysis based on the flow equations below:

$$\texttt{avail-in}_i = \begin{cases} \varnothing & \text{if } i = 0 \\ \\ \bigcap_{j \in \mathrm{pred}(i)} \texttt{avail-out}_j & \text{if } i > 0 \end{cases}$$
 
$$\texttt{avail-out}_i = \texttt{avail-in}_i \cup \texttt{defined}_i$$

Here, the subscripts indicate the basic block number.  $defined_i$  denotes the result of the defined word from Figure 54 on page 89. This returns the set of virtual registers defined in

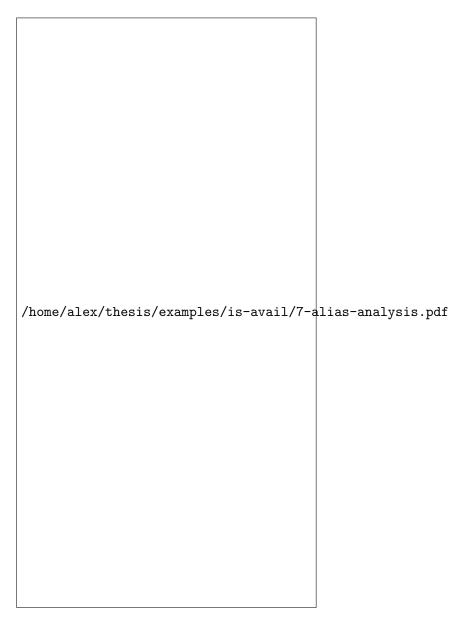


Figure 53: 10 is available in block  $4\,$ 

```
! Copyright (C) 2011 Alex Vondrak.
! See http://factorcode.org/license.txt for BSD license.
USING: accessors assocs hashtables kernel namespaces sequences
sets
compiler.cfg
compiler.cfg.dataflow-analysis
compiler.cfg.def-use
compiler.cfg.gvn.graph
compiler.cfg.predecessors
compiler.cfg.rpo ;
FROM: namespaces => set ;
IN: compiler.cfg.gvn.avail
: defined ( bb -- vregs )
    instructions>> [ defs-vregs ] map concat unique ;
FORWARD-ANALYSIS: avail
M: avail-analysis transfer-set drop defined assoc-union;
: available? ( vn -- ? )
   final-iteration? get [
       basic-block get avail-in key?
   ] [ drop t ] if ;
: available-uses? ( insn -- ? )
   uses-vregs [ available? ] all?;
: with-available-uses? ( quot -- ? )
   keep swap [ available-uses? ] [ drop f ] if ; inline
: make-available ( vreg -- )
   basic-block get avail-ins get [ dupd clone ?set-at ] change-at ;
```

Figure 54: The compiler.cfg.gvn.avail vocabulary

a basic block. Since we use virtual registers as value numbers, this is the same as giving us all the value numbers produced by a basic block. "Killed" definitions are impossible by the SSA property, so we needn't track redefinitions of any virtual register. Using set intersection as the confluence operator means that the avail-in set will contain those values which are available on all paths from the start of the CFG to that block.

Using Factor's compiler.cfg.dataflow-analysis vocabulary, the implementation takes all of two lines of code. The FORWARD-ANALYSIS: avail line automatically defines several objects, variables, words, and methods that don't warrant full detail here. One we're immediately concerned with is the transfer-set generic, which dispatches upon the particular type of analysis being performed and is invoked on the proper in-set and basic block. There is no default implementation, as it is the chief difference between analyses. So, the next line uses defined and assoc-union to calculate the result of the data flow equation. Other pieces we'll see used are the top-level compute-avail-sets word that actually performs the analysis, the avail-ins hash table that maps basic blocks to their in-sets, and the avail-in word that is shorthand for looking up a basic block's in-set.

We want to use the results of this analysis in the rewrite methods so that they won't overstep their boundaries, and only make meaningful rewrites. However, we also want to use rewrite in the determine-value-numbers pass, where we don't care about availability. In fact, we want to ignore availability altogether, so that we can discover as many congruences as possible. In order to separate these concerns, we need to have two modes for checking availability. Figure 54 on the previous page defines the available? word to do just this. It will only check the actual availability if final-iteration? is true, otherwise defaulting to t. Therefore, during the value numbering phase, everything is considered available. We further define the utilities available-uses? and with-available-uses?. The former checks if all an instruction's uses are available, and the latter does this only if another quotation first returns true. That way, we can guard instruction predicates with a test for available uses, like [ ##add-imm? ] with-available-uses?.

Finding all the instances where rewrite needed to be altered was subtle. Since the old value-numbering was an online optimization, it didn't need to worry about modifying an

```
! Before
: fold-branch ( ? -- insn )
    0 1 ?
    basic-block get [ nth 1vector ] change-successors drop
    \ ##branch new-insn ;

! After
: fold-branch ( ? -- insn )
    final-iteration? get [
         0 1 ?
        basic-block get [ nth 1vector ] change-successors drop
    ] [ drop ] if
    \ ##branch new-insn ;
```

Figure 55: Branch folding before and after

instruction in memory. But by doing the fixed-point iteration, we cannot permit rewrite to destructively modify any object instance until the final iteration. An obvious instance was in compiler.cfg.value-numbering.comparisons with the word fold-branch, responsible for modifying the CFG to remove an untaken branch. We definitely would not want the branch removed while doing the fixed-point iteration, because the transformation is not necessarily sound. So, we can protect it with a check for final-iteration?.

More typical were words like self-inverse from compiler.cfg.value-numbering.math (refer to Figure 56 on the following page). The idea is to change

```
##neg 1 2
##neg 3 1
into

##neg 1 2
##copy 3 2 any-rep
```

since ##neg undoes itself. But rewrite only has knowledge of one instruction at a time, so it looks up the redundant ##neg's source register in the vregs>insns table to see if it's computed by another ##neg instruction. For straight-line code this is alright, but the source of the originating ##neg (in the example, the virtual register 2) isn't necessarily available.

```
: self-inverse ( insn -- insn')
    [ dst>> ] [ src>> vreg>insn src>> ] bi <copy> ;
! Before
M: ##neg rewrite
    {
        { [ dup src>> vreg>insn ##neg? ] [ self-inverse ] }
        { [ dup unary-constant-fold? ] [ unary-constant-fold ] }
        [drop f]
    } cond;
! After
: self-inverse? ( insn quot -- ? )
    [ src>> vreg>insn ] dip with-available-uses?; inline
M: ##neg rewrite
        { [ dup [ ##neg? ] self-inverse? ] [ self-inverse ] }
        { [ dup unary-constant-fold? ] [ unary-constant-fold ] }
        [drop f]
    } cond;
```

Figure 56: Rewriting words that are their own inverses

So, we have to use with-available-uses? to make sure the virtual registers used by the result of a vreg>insn can themselves be used before we rewrite anything.

An even subtler issue that led to infinite loops occured in simplifications like the arithmetic distribution in compiler.cfg.value-numbering.math. The problem is that the rewrite method would generate instructions that assigned to entirely brand new registers. These, of course, would invariably get value numbered, triggering a change in the vregs>vns table. A new iteration would begin, and (since it gets called on the same instructions as the previous iteration) rewrite would generate new virtual registers all over again. Therefore, the vregs>vns table would never stop changing. As a stop-gap, distribution had to be disabled altogether until the final iteration.

make it so

Armed with the correct rewrite rules, availability information, and global value numbers, we can perform global common subexpression elimination (GCSE). The logic in the gcse generic in Figure 57 on the next page is similar to process-instruction from Figure 43

```
GENERIC: gcse ( insn -- insn' )
M: array gcse [ gcse ] map;
: defs-available ( insn -- insn )
    dup defs-vregs [ make-available ] each ;
M: alien-call-insn gcse defs-available;
M: ##callback-inputs gcse defs-available;
M: ##copy gcse defs-available;
: ?eliminate ( insn vn -- insn' )
   dup available? [
        [ dst>> dup make-available ] dip <copy>
   ] [ drop defs-available ] if;
: eliminate-redundancy ( insn -- insn')
   dup >expr exprs>vns get at
    [ ?eliminate ] [ defs-available ] if*;
M: ##phi gcse
    dup inputs>> values [ vreg>vn ] map sift
   dup all-equal? [
        [ first ?eliminate ] unless-empty
   ] [ drop eliminate-redundancy ] if ;
M: insn gcse
   dup defs-vregs length 1 = [ eliminate-redundancy ] when ;
: gcse-step ( insns -- insns' )
    [ simplify gcse ] map flatten;
: eliminate-common-subexpressions ( cfg -- )
   final-iteration? on
    dup compute-avail-sets
    [ gcse-step ] simple-optimization ;
```

Figure 57: Global common subexpression elimination in compiler.cfg.gvn

and value-number from Figure 49 on page 75. Unlike value-number, we do return an instruction (or sequence thereof) representing the replacement. Thus, the **array** method uses **map** instead of **each**, to hold onto the resulting sequence when recursing into several instructions.

defs-available is similar to record-defs, except that value numbers have already stabilized, so we don't call set-vn. Instead, we use the make-available word, which was the last one defined in Figure 54 on page 89. As we process the instructions of a block in order, we want to make sure that local rewrites can still be performed. We have to ensure that after processing an instruction, any register it defines is available to future instructions in the same block. Thus, we add the virtual register to that block's avail-in (which acts like a set, even though it's implemented by a hash table by Factor's data flow analysis framework). alien-call-insns, ##callback-inputs instructions, and instances of ##copy don't get rewritten any further, so we simply note that their definitions are available and move on.

The ?eliminate word transforms an instruction into a ##copy of the canonical value number that computes it. If the value number isn't available, we don't do anything but post-process with defs-available. If it is, a ##copy is produced and its destination is made available. Thus, eliminate-redundancy works like check-redundancy from Figure 49 on page 75. We look up the expression computed by the instruction in the exprs>vns table. If it's there, we call ?eliminate, but otherwise we leave the instruction alone and make its definitions available.

If the inputs to a ##phi are all congruent, we'll call ?eliminate to transform it into a ##copy of its first input (without loss of generality). Otherwise, we check for equivalent ##phis with eliminate-redundancy.

Finally, the insn method will default to calling eliminate-redundancy on instructions that define only one value, much like how value-number worked.

The main loop works similarly to determine-value-numbers. final-iteration? is turned on (set to t), and we make sure to compute the avail-in sets needed to make available? work. Then, using simple-optimization, we iterate over each basic block.

```
: value-numbering ( cfg -- cfg )
   needs-predecessors
   dup determine-value-numbers
   dup eliminate-common-subexpressions

cfg-changed predecessors-changed;
```

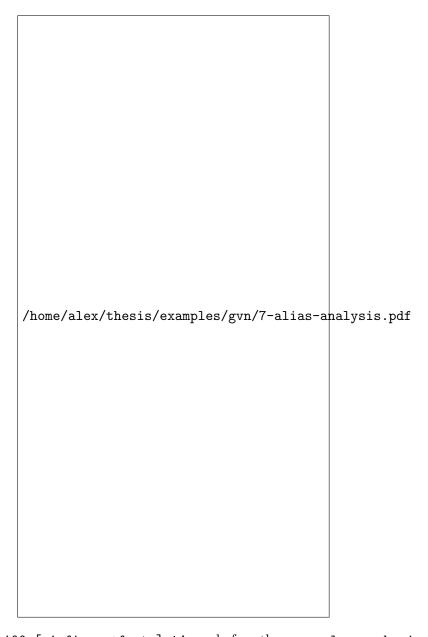
Figure 58: New global value-numbering word in compiler.cfg.gvn

For each instruction, we first use simplify (refer to Figure 48 on page 74), then call gcse on the rewritten instruction. Thus, rewrite does the work of propagating available subexpressions and simplifying instructions, then gcse cleans up redundant instructions by converting them into ##copy instructions if possible. The new value-numbering word can be seen in Figure 58.

Consider for the last time the example 0 100 [ 1 fixnum+fast ] times. Before, we had the CFG in Figure 59 on the next page. Making a final pass with eliminate-common-subexpressions gives us the CFG in Figure 60 on page 97. Compared to the CFG after the old value-numbering word was called (see Figure 37 on page 49), we have identified several more redundancies:

- The second ##phi in block 2 has been turned into a ##copy of the first.
- The ##compare-integer of block 2 has been simplified to a ##compare-integer-imm, since its operand 26 is both available and known to correspond to the integer value 100.
- Instead of a ##compare-integer-branch, we similarly have a ##compare-integer-imm-branch at the end of block 2.
- Because the ##phis have been recognized as copies (i.e., the induction variables are
  congruent), the second ##add-imm resulting from the old version of value-numbering
  is turned into a ##copy of the first.

Afterwards, the copy-propagation pass cleans up all of these newly identified copies, as seen in Figure 61 on page 98. eliminate-dead-code now gets rid of more instructions than



 $\label{eq:Figure 59:0.100 [1 fixnum+fast] times} \ before \ the \ new \ value-numbering$ 

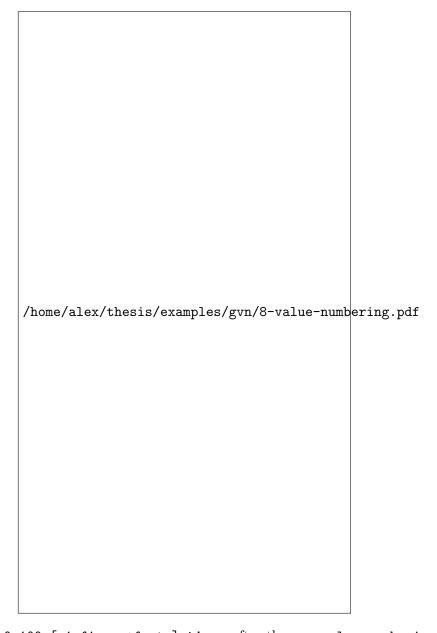


Figure 60: 0 100 [ 1 fixnum+fast ] times after the new value-numbering

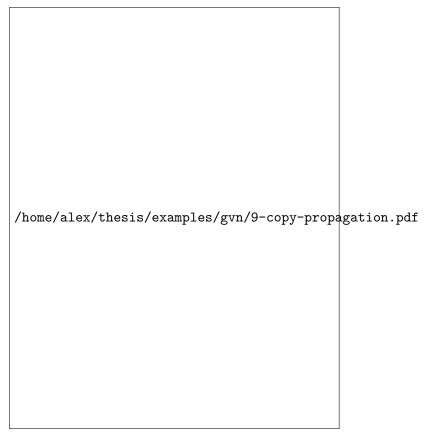


Figure 61: 0 100 [ 1 fixnum+fast ] times after copy-propagation

before, such as the second ##load-integer in block 1, since it has been propagated to the -imm instructions in block 2. See Figure 62 on the next page. At last, after finalize-cfg in Figure 63 on page 100, we see a loop that uses a single register—down from the three in Figure 40 on page 52.

## 4.4 Results

The goal of improving the optimization in Factor is, of course, to reduce the average running time of programs, and to do so without changing their semantics. Short of formal verification, the latter requirement makes it necessary to thoroughly test any code that gets compiled with the new pass enabled. To this end, we'll employ Factor's extensive unit test coverage. Because Factor is (largely) self-hosting, its standard vocabularies are written in Factor code, typically coupled with tests. While some vocabularies will have more test



Figure 62: 0 100 [ 1 fixnum+fast ] times after eliminate-dead-code

coverage than others, the total amount of tests is quite large. By compiling each vocabulary and running their tests, we're indirectly testing the compiler: if tests that used to pass no longer do, then the new pass is changing the semantics of the code somehow. Though passing all tests does not guarantee the algorithm is correct, it does let us know that no known regressions have been introduced. Happily, with the new value-numbering phase enabled, all the same tests pass as before in a call to test-all from a freshly bootstrapped image.

The efficacy of the changes, on the other hand, must be measured relative to old benchmarks. Again, Factor has its bases covered, with a suite of 80 benchmarks run by the benchmark vocabulary. Each benchmark is run 5 times, where the garbage collector is run before each iteration. The minimum time from these runs is then used as the benchmark result. The data below comes from two separate runs of the benchmarks word, which invokes all the benchmark sub-vocabularies. The "before" time used the local value numbering,

/home/alex/thesis/examples/gvn/11-finalize-cfg.pdf

Figure 63: 0 100 [ 1 fixnum+fast ] times after finalize-cfg

while "after" times had value-numbering replaced with the GVN pass. The "change" is measured by the formula

$$\frac{\text{before} - \text{after}}{\text{before}} \times 100$$

to indicate the relative running times. Negative values in this column are good, as that means the running time has decreased.

## Guess I should provide my PC's specs

| Benchmark        | Before (seconds) | After (seconds) | Change (%) |
|------------------|------------------|-----------------|------------|
| 3d-matrix-scalar | 3.705816738      | 3.046126696     | -17.80     |
| 3d-matrix-vector | 0.161298778      | 0.089539887     | -44.49     |
| backtrack        | 4.280001561      | 2.358672591     | -44.89     |
| base64           | 5.127831493      | 2.853612485     | -44.35     |
| beust1           | 7.531546384      | 4.604929188     | -38.86     |
| beust2           | 20.308680548     | 12.843534349    | -36.76     |

| Benchmark       | Before (seconds) | After (seconds) | Change (%) |
|-----------------|------------------|-----------------|------------|
| binary-search   | 3.729776895      | 2.349520427     | -37.01     |
| binary-trees    | 9.403166818      | 6.518867479     | -30.67     |
| bootstrap1      | 32.472196349     | 30.887877896    | -4.88      |
| chameneos-redux | 2.923900422      | 2.041007328     | -30.20     |
| continuations   | 0.273525202      | 0.200695972     | -26.63     |
| crc32           | 0.010623653      | 0.005282642     | -50.27     |
| dawes           | 1.588111926      | 1.027176578     | -35.32     |
| dispatch1       | 7.640720326      | 5.106558985     | -33.17     |
| dispatch2       | 5.221652668      | 3.984754032     | -23.69     |
| dispatch3       | 9.710520454      | 6.203527737     | -36.12     |
| dispatch4       | 8.224931156      | 4.098265543     | -50.17     |
| dispatch5       | 4.74357434       | 3.478219608     | -26.68     |
| e-decimals      | 3.903754723      | 2.646958072     | -32.19     |
| e-ratios        | 4.774454589      | 3.658075473     | -23.38     |
| empty-loop-0    | 0.251816164      | 0.199189271     | -20.90     |
| empty-loop-1    | 1.039242509      | 0.857588545     | -17.48     |
| empty-loop-2    | 0.472215346      | 0.387974286     | -17.84     |
| euler150        | 37.785852299     | 27.05450689     | -28.40     |
| fannkuch        | 9.627490235      | 6.8970571       | -28.36     |
| fasta           | 7.25292282       | 5.640517069     | -22.23     |
| fib1            | 0.179389215      | 0.164933805     | -8.06      |
| fib2            | 0.205853157      | 0.138174211     | -32.88     |
| fib3            | 0.785036151      | 0.539739186     | -31.25     |
| fib4            | 0.391805799      | 0.260370111     | -33.55     |
| fib5            | 1.508625224      | 1.002724851     | -33.53     |
| fib6            | 19.202504502     | 13.146010511    | -31.54     |
| gc0             | 7.360087104      | 5.508594031     | -25.16     |
| gc1             | 0.418173431      | 0.281497214     | -32.68     |
|                 |                  |                 |            |

| Benchmark                 | Before (seconds) | After (seconds) | Change (%) |
|---------------------------|------------------|-----------------|------------|
| gc2                       | 25.611210221     | 19.716168704    | -23.02     |
| gc3                       | 2.757943071      | 2.210785891     | -19.84     |
| hashtables                | 8.068216942      | 7.997106348     | -0.88      |
| heaps                     | 4.360368411      | 4.32169158      | -0.89      |
| iteration                 | 7.875561986      | 6.277891729     | -20.29     |
| javascript                | 17.881224721     | 12.74204052     | -28.74     |
| knucleotide               | 5.490420772      | 3.5704101       | -34.97     |
| mandel                    | 0.251711276      | 0.198695557     | -21.06     |
| matrix-exponential-scalar | 16.451432774     | 12.017000042    | -26.95     |
| matrix-exponential-simd   | 0.681684747      | 0.536850343     | -21.25     |
| md5                       | 10.40516678      | 9.198666403     | -11.60     |
| mt                        | 33.91981743      | 29.961085146    | -11.67     |
| nbody                     | 9.203478441      | 6.795154145     | -26.17     |
| nbody-simd                | 0.845814208      | 0.854773096     | +1.06      |
| nested-empty-loop-1       | 0.097090973      | 0.068475608     | -29.47     |
| nested-empty-loop-2       | 0.893126911      | 0.861327078     | -3.56      |
| nsieve                    | 1.086110659      | 1.137648699     | +4.75      |
| nsieve-bits               | 2.707271763      | 2.815509077     | +4.00      |
| nsieve-bytes              | 0.785041878      | 1.211421146     | +54.31     |
| partial-sums              | 3.762171661      | 4.130144177     | +9.78      |
| pidigits                  | 2.182877913      | 2.195385034     | +0.57      |
| random                    | 5.66540782       | 5.71913683      | +0.95      |
| raytracer                 | 5.047070171      | 4.39514879      | -12.92     |
| raytracer-simd            | 1.072588515      | 0.980927338     | -8.55      |
| recursive                 | 2.703509403      | 2.529087637     | -6.45      |
| regex-dna                 | 2.208584014      | 1.808859571     | -18.10     |
| reverse-complement        | 2.801163847      | 2.353254665     | -15.99     |
| ring                      | 1.822206473      | 1.62482491      | -10.83     |
|                           |                  |                 |            |

| Benchmark          | Before (seconds) | After (seconds) | Change (%) |
|--------------------|------------------|-----------------|------------|
| sfmt               | 2.675838657      | 2.463367198     | -7.94      |
| sha1               | 11.964973943     | 11.142380303    | -6.88      |
| simd-1             | 1.857778672      | 1.703206011     | -8.32      |
| sockets            | 10.636346636     | 10.516448454    | -1.13      |
| sort               | 0.695635429      | 0.581855635     | -16.36     |
| spectral-norm      | 3.433630383      | 2.960833789     | -13.77     |
| spectral-norm-simd | 2.743240011      | 3.237017655     | +18.00     |
| stack              | 1.580016742      | 2.004478602     | +26.86     |
| struct-arrays      | 2.180774222      | 2.421915609     | +11.06     |
| sum-file           | 0.883097981      | 0.957151577     | +8.39      |
| terrain-generation | 1.611800222      | 1.887047663     | +17.08     |
| tuple-arrays       | 0.262747557      | 0.329399609     | +25.37     |
| typecheck1         | 1.750223408      | 1.674592158     | -4.32      |
| typecheck2         | 1.674738245      | 1.553203741     | -7.26      |
| typecheck3         | 1.891206648      | 1.735390184     | -8.24      |
| ui-panes           | 0.305595039      | 0.29985214      | -1.88      |
| xml                | 3.013709363      | 2.722223892     | -9.67      |
| yuv-to-rgb         | 0.398174487      | 0.318891664     | -19.91     |

The results are promising: of 80 benchmarks, only 13 showed any increase in running time. And of those, even fewer showed significant increases. Duplicated below for convenience are the benchmarks that ran slower, sorted in decreasing order of the percent difference between running times. We can see the last five or six benchmarks exhibited negligible differences—not only is the relative change tiny, but the absolute difference in running times is less than 0.1 seconds. (The benchmark.tuple-arrays results also show a similar absolute change, but it is relatively much larger.)

| Benchmark          | Before (seconds) | After (seconds) | Change (%) |
|--------------------|------------------|-----------------|------------|
| nsieve-bytes       | 0.785041878      | 1.211421146     | +54.31     |
| stack              | 1.580016742      | 2.004478602     | +26.86     |
| tuple-arrays       | 0.262747557      | 0.329399609     | +25.37     |
| spectral-norm-simd | 2.743240011      | 3.237017655     | +18.00     |
| terrain-generation | 1.611800222      | 1.887047663     | +17.08     |
| struct-arrays      | 2.180774222      | 2.421915609     | +11.06     |
| partial-sums       | 3.762171661      | 4.130144177     | +9.78      |
| sum-file           | 0.883097981      | 0.957151577     | +8.39      |
| nsieve             | 1.086110659      | 1.137648699     | +4.75      |
| nsieve-bits        | 2.707271763      | 2.815509077     | +4.00      |
| nbody-simd         | 0.845814208      | 0.854773096     | +1.06      |
| random             | 5.66540782       | 5.71913683      | +0.95      |
| pidigits           | 2.182877913      | 2.195385034     | +0.57      |

Overall, even transitioning to a relatively simple GVN algorithm amounts to a positive change in Factor's compiler. More redundancies are eliminated, resulting in speedier programs. Judging by unit tests, the implementation is at least as sound as the previous local value numbering, as all the same tests have passed.

## 4.5 Future Work

The GVN code presented in this thesis can be improved in various specific ways. Furthermore, the literature on GVN is extensive, and there are more overarching algorithmic strategies that have yet to be explored in the Factor code base. In this section, we explore some of these options for possible directions that Factor's compiler can take from here.

As it stands, the new pass could be smarter. For instance, it does not consider the commutativity of certain operations. This would be straightforward to solve by making >expr sort the operands of commutative instructions' expressions, thereby placing arguments in a

canonical order. This would increase the number of congruences discovered between ##adds, ##muls, and even ##phis. Also, the copy-propagation pass is remarkably similar to the new value-numbering—in fact, it could be removed altogether. All it does is collect global information about congruences as established by ##copy instructions (by a similar fixed-point iteration), then replace the virtual registers of instructions with the original value (i.e., the one not established by a ##copy). This allows copy-propagation to remove all ##copy instructions. But the information calculated by value-numbering is a superset of this copy-equivalence data, so it should be easy to do global copy propagation in the GVN phase and save time on the redundant fixed-point iteration.

There remains an open question about the GVN implementation's use of availability, too. As it stands, it's rather strict: if the canonical value number for an expression is not directly available, rewrite gives up on reusing that value. However, the virtual registers which map to a single value number form a congruence class. We need not look just at the canonical leader (the first virtual register in the whole program to compute the particular expression). rewrite could change an instruction to reuse any member of the congruence class that was available. It remains to be seen when and if such a rewrite would be useful or desirable.

Existing literature also gives plenty of material for a better implementation. We can make the existing RPO algorithm more efficient in practice by observing that the only times we need to iterate are where there are cyclic dependencies between values in the CFG. For instance, the example from Section 4.3 only has cyclic dependencies in the induction variables: the ##phis are defined by uses of virtual registers that are themselves defined by uses of the ##phi targets in ##adds. The RPO algorithm degenerates into the hash-based local algorithm of Section 4.1 on straight-line code. Thus, a more efficient algorithm will only iterate over the cycles between definitions instead of over the whole CFG.

Conceptually, we build a value graph (also known as SSA graph [Simpson 1996]) whose nodes represent definitions and directed edges represent uses. Since it just codifies def-use information, we needn't build an actual graph data structure. Using an algorithm due to Tarjan [1972], each strongly connected component (SCC) of the value graph is iterated

upon, while single nodes are processed only once. The SCC algorithm is more efficient than the RPO algorithm in practice, but the principles are the same. This gives us a comparatively simple, easily-extended GVN algorithm with complexity O(nd), where n is the number of vertices in the value graph (i.e., the number of values we're numbering) and d is the loop connectedness (the maximum number of back edges on any acyclic path) of the value graph. Though d can theoretically be O(n), in practice it seems to be bounded by a small constant. In Simpson's experiments, the maximum value of d was 4.

A more thorough overhaul could incorporate further rewriting of the instructions. Gargi [2002] proposes a *predicated* value numbering algorithm that combines

- optimistic value numbering, thus emulating Simpson's RPO and SCC algorithms;
- constant folding, algebraic simplification, and unreachable code elimination, thus emulating Click's strongest combination [Click 1995];
- global reassociation, thus performing the work already done in Factor;
- predicate inference, which can infer the values of comparisons dominated by some related predicate (i.e., comparisons in a block that is only reached via a particular conditional);
- value inference, which can infer the values of variables dominated by some related predicate (similar to range propagation, as seen in Section 3.2); and
- $\phi$ -predication, which (if possible) associates each input of a  $\phi$  with the predicate that controls the path that leads to the selection of that argument, thus letting us find flow-sensitive congruences.

This combination is given in a *sparse* formulation, which makes it efficient enough to apply all of these optimizations. Essentially, when optimistic assumptions are invalidated (which, of course, happens as we iterate until reaching the fixed point), instead of recalculating every result (as in the RPO algorithm), we only recalculate the values that may yet change from this new information (as in the SCC algorithm).



Figure 64: Abstract interpretation over signs

Any portion of Gargi's algorithm may be selectively disabled, thus letting us tweak it for specific compile time vs. code quality trade-offs we might have. It promotes a fairly good separation of concerns in the algorithm, too, letting the pseudocode be presented piecemeal for each optimization. Gargi presents compelling examples of predicated value numbering's strength, and its addition to Factor could prove very worthwhile.

Historically, the development of GVN algorithms has forked along two concurrent bloodlines. Those we've studied thus far reflect the more "practical" line, which was largely implementation-driven and less formal than the other algorithms. But those focused on formal reasoning have recently become much more viable, and the wealth of ideas from them are worthwhile.

For those acquainted with chapter 9 of Aho et al. 2007, (The Dragon Book), this work will seem familiar, as it's rooted in the results of Kildall [1973] and Cousot and Cousot [1977], upon which the chapter is based. The former was a precursor to GVN, in that it described an algorithm for common subexpression elimination that partitioned expressions into congruence classes. However, its method was phrased in terms of *lattices*, which are algebraic structures that we can reason about formally. This is as in The Dragon Book: a lattice is a partially-ordered set for which any two elements have a unique *least upper bound* (or *join*) and *greatest lower bound* (or *meet*). By defining meet and join operators on a partially-ordered set of abstract values, we can represent many sorts of analyses on our programs.

Cousot and Cousot formalize the salient properties of such interpretation over lattices in a framework dubbed abstract interpretation. To understand it intuitively, consider some arithmetic expression like  $(-5 \times 14)$ . Our first inclination is probably to interpret it with respect to numeric values, but we can understand it in several different contexts. Let's use signs  $(+, -, \text{ and } \pm)$  as our abstract domain and consider the operators to be defined by the rules of signs. Figure 64 on the preceding page shows a lattice we can use for this. Using a version of  $\times$  cast in the context of this lattice, we can interpret  $(-5 \times 14)$  as

$$-5 \times 14 \rightarrow (-) \times (+) \rightarrow (-)$$

proving that  $(-5 \times 14)$  is negative. Using this framework, the results are correct, but only useful within the confines of what we define. For instance, we can interpret (-5 + 14) as

$$-5+14 \rightarrow (-)+(+) \rightarrow (\pm)$$

proving very little—the result is either positive or negative.

Despite the inherent limitations, we find the results useful as approximations of more complex properties. For example, we used congruence to approximate runtime equivalence. Only a year before AWZ was published, Steffen [1987] showed that Kildall's approach could be framed as abstract interpretation over *Herbrand equivalences*—that is, equivalences where operators are uninterpreted. This is actually the same notion of congruence we had from before: expressions are equivalent if their operators and operands are equivalent, irrespective of the result of applying the operator.

The primary strength of the abstract interpretation approaches are that they are *complete*; intuitively, there is no loss of information at each step of abstract interpretation. However, this "loss of information" is relative to the information encompassed by the abstract domains [Giacobazzi, Ranzato, and Scozzari 2000]. While we can find all Herbrand equivalences, we aren't guaranteed to find equivalences induced by interpreting operators, which was effectively the work done by combining optimizations (e.g., constant folding is the interpretation of certain operators upon constant operands). So, while complete, these approaches vary in *preciseness*. Most of the work in the abstract interpretation of GVN did

little to study the results of interpreting the same operators we saw before, but note it's a promising direction for future research.

The cost of this completeness has traditionally been exponential time complexities. There have been several attempts to remedy this. Rüthing, Knoop, and Steffen [1999] note AWZ is incomplete, since it treats  $\phi$  functions as uninterpreted, so fails to discover congruences between  $\phi$ s and ordinary expressions. Their attempt to improve upon it alternately applies AWZ and the normalization rules

$$\phi(a \otimes b, c \otimes d) \quad \to \quad \phi(a, c) \otimes \phi(b, d)$$
$$\phi(x, x) \quad \to \quad x$$

until the partitioning reaches a fixed point. However, this is  $O(n^2 \log n)$  in the expected case— $O(n^4 \log n)$  in the worst case—and it turned out to be incomplete not just in the presence of cycles [Rüthing, Knoop, and Steffen 1999] but also in certain acyclic code [Gulwani and Necula 2007].

Later, Gulwani and Necula [2004] furthered the quest for an efficient, complete GVN algorithm in a novel way by using randomized interpretation (which is what it sounds like). The paper even explored various interpretations—specifically of linear combinations, bitwise operators, memory loads/stores, and integer division—that could make results more precise. But it was still  $O(n^4)$  and ran a small chance of making incorrect inferences due to its randomized nature. For compilers, this isn't really acceptable, though such a scheme could be used in things like program verification tools [Nie and Cheng 2007].

From their trip back to the drawing board, Gulwani and Necula returned with a polynomial time algorithm for GVN that is complete for all Herbrand equivalences among terms of a limited size [Gulwani and Necula 2007]. Choosing a size bound equal to the size of the entire program is clearly sufficient. Note, however, that this is specifically for Herbrand equivalences; they do not show their results for any interpreted operators, but note it's an important area for exploration. Adding to this, Nie and Cheng [2007] present a similar algorithm, except based on SSA form. Both wind up using the same size restrictions to guarantee complexity. Both also use an additional special-purpose data structure to rep-

resent the set of Herbrand equivalences and to perform abstract evaluations over them, which adds a conceptual load to the algorithms and might make them more difficult to implement. However, unlike most other abstract interpretation-based algorithms, Nie and Cheng' is demonstrably practical, as the authors implemented it for the GNU Compiler Collection (GCC). In their experiments, the size restriction turned out to be unnecessary for avoiding the exponential case, showing that the main bottleneck in complete GVN algorithms is typically their poor data structure choices.

Clearly, there is much room for future exploration. Even without crossing the boundaries of GVN into the scope of other compiler optimizations, we can eliminate all sorts of redundancies. The literature has a wealth of algorithms that all warrant experimentation. With varying degrees of aggressiveness, there are several opportunities to make Factor a more efficient high-level language.

## References

- Adobe Systems Incorporated. 1999. PostScript Language Reference. Third edition. Addison-Wesley. ISBN: 0-201-37922-8. URL: http://partners.adobe.com/public/developer/en/ps/PLRM.pdf (visited on August 15, 2011).
- Aho, A. V., Lam, M. S., Sethi, R., and Ullman, J. D. 2007. *Compilers: Principles, Techniques, & Tools*. Second edition. Addison-Wesley.
- Alpern, B., Wegman, M. N., and Zadeck, F. K. 1988. "Detecting Equality of Variables in Programs". In: Proceedings of the 15th ACM SIGPLAN-SIGACT Symposium on Principles of Programming Languages. POPL '88. ACM, pages 1–11. ISBN: 0-89791-252-7. URL: http://doi.acm.org/10.1145/73560.73561.
- American National Standards Institute and Computer and Business Equipment Manufacturers Association. 1994. American National Standard for information systems: programming languages: Forth: ANSI/X3.215-1994. American National Standards Institute.
- Biggar, P. 2009. "Design and Implementation of an Ahead-of-Time Compiler for PHP". PhD thesis. Trinity College, Dublin. URL: http://www.paulbiggar.com/research/wip-thesis.pdf (visited on August 15, 2011).
- Briggs, P., Cooper, K. D., Harvey, T. J., and Simpson, L. T. 1998. "Practical Improvements to the Construction and Destruction of Static Single Assignment Form". In: Software—

  Practice & Experience 28 (8), pages 859–881. ISSN: 0038-0644. URL: http://portal.acm.org/citation.cfm?id=295545.295551.
- Click, C. N. 1995. "Combining Analyses, Combining Optimizations". PhD thesis. Houston, TX, USA: Rice University.
- Cocke, J. and Schwartz, J. T. 1970. Programming Languages and Their Compilers: Preliminary Notes. Technical report. Courant Institute of Mathematical Sciences, New York University.
- Cousot, P. and Cousot, R. 1977. "Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints". In: Proceedings of the 4th ACM SIGACT-SIGPLAN symposium on Principles of Programming

- Languages. POPL '77. ACM, pages 238-252. URL: http://doi.acm.org/10.1145/512 950.512973.
- Cytron, R., Ferrante, J., Rosen, B. K., Wegman, M. N., and Zadeck, F. K. 1991. "Efficiently Computing Static Single Assignment Form and the Control Dependence Graph". In: *ACM Transactions Programming Languages and Systems* 13 (4), pages 451–490. ISSN: 0164-0925. URL: http://www.eecs.umich.edu/~mahlke/583w03/reading/cytron\_toplas\_91.pdf (visited on August 15, 2011).
- Das, D. and Ramakrishna, U. 2005. "A Practical and Fast Iterative Algorithm for phifunction Computation using DJ Graphs". In: *ACM Transactions Programming Languages and Systems* 27 (3), pages 426–440. ISSN: 0164-0925. URL: http://doi.acm.org/10.1145/1065887.1065890.
- Diggins, C. 2007. The Cat Programming Language. URL: http://cat-language.com/ (visited on August 15, 2011).
- Gargi, K. 2002. "A Sparse Algorithm for Predicated Global Value Numbering". In: Proceedings of the ACM SIGPLAN 2002 Conference on Programming Language Design and Implementation. PLDI '02. ACM, pages 45–56. ISBN: 1-58113-463-0. URL: http://doi.acm.org/10.1145/512529.512536.
- Giacobazzi, R., Ranzato, F., and Scozzari, F. 2000. "Making Abstract Interpretations Complete". In: *Journal of the ACM* 47 (2), pages 361–416. ISSN: 0004-5411. URL: http://doi.acm.org/10.1145/333979.333989.
- Gulwani, S. and Necula, G. C. 2004. "Global Value Numbering Using Random Interpretation". In: Proceedings of the 31st ACM SIGPLAN-SIGACT Symposium on Principles of Programming Languages. POPL '04. ACM, pages 342–352. ISBN: 1-58113-729-X. URL: http://doi.acm.org/10.1145/964001.964030.
- Gulwani, S. and Necula, G. C. 2007. "A Polynomial-Time Algorithm for Global Value Numbering". In: Science of Computer Programming 64 (1), pages 97–114. ISSN: 0167-6423. URL: http://portal.acm.org/citation.cfm?id=1222241.1222599.
- Hopcroft, J. E. 1971. An n log n Algorithm for Minimizing States in a Finite Automaton.

  Technical report. Stanford, CA, USA: Stanford University.

- Kildall, G. A. 1973. "A Unified Approach to Global Program Optimization". In: Proceedings of the 1st ACM SIGACT-SIGPLAN Symposium on Principles of Programming Languages. POPL '73. ACM, pages 194–206. URL: http://doi.acm.org/10.1145/512 927.512945.
- Nie, J.-T. and Cheng, X. 2007. "An Efficient SSA-Based Algorithm for Complete Global Value Numbering". In: *Proceedings of the 5th Asian Conference on Programming Languages and Systems*. APLAS '07. Springer-Verlag, pages 319–334. ISBN: 3-540-76636-7, 978-3-540-76636-0. URL: http://portal.acm.org/citation.cfm?id=1784774.17848 06.
- Pestov, S., Ehrenberg, D., and Groff, J. 2010. "Factor: A Dynamic Stack-based Programming Language". In: *Proceedings of the 6th Symposium on Dynamic languages*. DLS '10. ACM, pages 43–58. ISBN: 978-1-4503-0405-4. URL: http://doi.acm.org/10.1145/186 9631.1869637.
- Rüthing, O., Knoop, J., and Steffen, B. 1999. "Detecting Equalities of Variables: Combining Efficiency with Precision". In: *Proceedings of the 6th International Symposium on Static Analysis*. SAS '99. Springer-Verlag, pages 232–247. ISBN: 3-540-66459-9. URL: http://portal.acm.org/citation.cfm?id=647168.718137.
- Simpson, L. T. 1996. "Value-Driven Redundancy Elimination". PhD thesis. Houston, TX, USA: Rice University.
- Steffen, B. 1987. "Optimal Run Time Optimization Proved By A New Look at Abstract Interpretations". In: *The International Joint Conference on Theory and Practice of Software Development on TAPSOFT '87.* Springer-Verlag, pages 52–68. ISBN: 0-387-17660-8. URL: http://portal.acm.org/citation.cfm?id=29580.29585.
- Tarjan, R. 1972. "Depth-First Search and Linear Graph Algorithms". In: SIAM Journal on Computing 1.2, pages 146–160.
- VanDrunen, T. J. 2004. "Partial Redundancy Elimination for Global Value Numbering".
  PhD thesis. West Lafayette, IN, USA: Purdue University. ISBN: 0-496-15310-2.
- Wegman, M. N. and Zadeck, F. K. 1991. "Constant Propagation with Conditional Branches".

  In: ACM Transactions on Programming Languages and Systems 13 (2), pages 181–210.

  ISSN: 0164-0925. URL: http://doi.acm.org/10.1145/103135.103136.

Wilson, P. R. 1992. "Uniprocessor Garbage Collection Techniques". In: Proceedings of the International Workshop on Memory Management. IWMM '92. Springer-Verlag, pages 1– 42. ISBN: 3-540-55940-X. URL: http://portal.acm.org/citation.cfm?id=645648.66 4824.