# ParaSail: A Pointer-Free Pervasively-Parallel Language for Irregular Computations

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Abstract ParaSail is a language specifically designed to simplify the construction of programs that make full, safe use of parallel hardware even while manipulating potentially irregular data structures. As parallel hardware has proliferated, there has been an urgent need for languages that ease the writing of correct parallel programs. ParaSail achieves these goals largely through simplification of the language, rather than by adding numerous rules. In particular, ParaSail eliminates global variables, parameter aliasing, and most significantly, re-assignable pointers. ParaSail has adopted a pointer-free approach to defining complex data structures. Rather than using pointers, ParaSail supports flexible data structuring using expandable (and shrinkable) objects implemented using region-based storage management, along with generalized indexing. By eliminating global variables, parameter aliasing, and pointers, ParaSail reduces the complexity for the programmer, while still allowing ParaSail to provide flexible, pervasive, safe, parallel programming for irregular computations. Perhaps the most interesting discovery in this language development effort, based over five years of use by the author and a group of ParaSail users, has been that it is possible to simultaneously simplify the language, support parallel programming with advanced data structures, and maintain flexibility and efficiency.

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## The Art, Science, and Engineering of Programming

Perspective The Art of Programming

Area of Submission Parallel and multi-core programming, Interpreters, virtual machines, and compilers



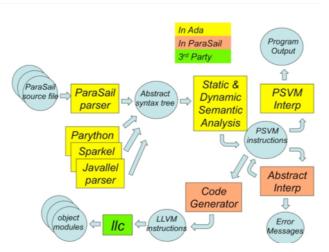
## Introduction and History

ParaSail is a language specifically designed to simplify the construction of programs that make full, safe use of parallel hardware even while manipulating potentially irregular data structures. The default evaluation semantics for expressions are parallel, and even at the statement level parallel semantics are the default in the absence of data dependences, all of which are immediately visible to the compiler using only local analysis. Safety is achieved in ParaSail largely through simplification of the language, that is, by removing features that interfere with straightforward automatic and safe parallelization. In particular, functions have no access to global variables, and aliasing of any two function parameters is not permitted if either is updatable within the function. Furthermore, parameter passing uses a hand-off semantics analogous to that of the Hermes language [25], such that when a variable is passed to one function, it may not be manipulated further by the caller nor passed to any other function if the first function is given read/write access to the parameter, or if the first function is given read-only access, then it may not be passed to any other function with read/write access. Finally, there are no user-visible re-assignable pointers in the language, further simplifying aliasing analysis. The net effect is that in ParaSail, expressions such as F(X) + G(Y) can be safely evaluated in parallel, without the compiler looking inside the bodies of the functions F or G.

The design of ParaSail began in September 2009, and was documented along the way in a web log [26]. The first interpreter-based implementation of the language began in 2011, and was largely completed by 2012. In 2014, an LLVM-based [16] code generator was written (in ParaSail itself), as well as an integrated static analysis capability designed to produce more advanced compile-time error messages, as well as identify for the compiler places where run-time checks should be inserted to ensure safe execution.

The ParaSail front end generates instructions for a virtual machine specifically designed for pervasively parallel semantics (ParaSail Virtual Machine – PSVM) – see Figure 1. These PSVM instructions can be directly executed in the ParaSail interpreter, or can be translated by the ParaSail compiler to an LLVM representation and then to machine code. The PSVM instructions may also be analysed statically, using an analyser called ParaScope, based on a variant of abstract interpretation [8, 22]. Parsers for parallel variants of other languages have been built which share the ParaSail abstract syntax tree (AST), semantic analysis phase, and all later code-generation phases. There are parsers for variants of Java (Javallel), Python (Parython), and the SPARK [6] subset of Ada (Sparkel). The remainder of this paper is organized as follows: Section 2 introduces the ParaSail language through a series of examples. Some of the examples include a fair amount of code, to illustrate how realistically-sized modules appear in ParaSail, and to show the kinds of operations that might be used to support irregular data structures such as hash tables. Section 3 describes the ParaSail pointer-free region-based storage model and its implementation. Section 4 describes the ParaSail model for safe parallel execution, and its implementation, and provides some examples of irregular computations. Section 5 describes related work. Section 6

#### ■ Figure 1 ParaSail Tool Chain



evaluates ParaSail's features relative to other parallel programming languages, and summarizes the contributions of the ParaSail design.

## The ParaSail Language

ParaSail is a relatively conventional looking object-oriented language, but with certain restrictions and features that make it particularly appropriate for automatic parallelization. ParaSail is also somewhat unusual in its heavy use of syntactic sugar [15] to integrate user-defined types into the special syntactic constructs of the language. That is, rather than providing special syntactic constructs, such as literals or indexing, to only a set of built-in types (such as the numeric types) or built-in type constructors (such as those for array types), ParaSail ties such special syntactic constructs to specific operators, which can be defined on any type. For example, uses of the indexing syntactic construct A[I] is expanded (*de-sugared*) into a call on the "indexing" operator as "indexing"(A, I), and any type with an "indexing" operator supports the A[I] syntax.

#### 2.1 ParaSail Modules

A ParaSail program is composed of a set of hierarchically named *modules*, along with one or more stand-alone *operations*. A *module* defines the data components and the operations that together encapsulate a portion of the program's logical structure. An *operation* is a callable entity, referred to as a function or a procedure in many languages. A module consists of an **interface**, which defines the externally visible data components and operations of the module, and, optionally, a **class** that implements the interface and defines any internal data components and operations. A module whose interface part is declared as **abstract** (meaning it is a pure interface and has no implementation), or a module that has no operations needing implementation, need not have a class part. A module may be declared to extend another module, in

which case it inherits both code (operations) and data (components) from that parent module. A module may also be declared to *implement* one or more other module's interfaces. Note that even if a module has its own class part, its interface may be implemented by other modules. In other words, ParaSail supports single inheritance of implementation (by extending a parent module) and multiple inheritance of interfaces (by implementing one or more other modules' interfaces).

The interface of a module declares its module parameters (types or values), defines zero or more visible data components, and declares zero or more visible operations. Each component is declared as either a **const** or a **var** component, determining whether the component must be defined once upon object creation or may be updated multiple times during the life of an enclosing object. The class part of a module defines (in an internal part) zero or more additional components, and zero or more additional (internal) operations. The internal part is followed by the word **exports** and then by the implementation (body) of each of the visible operations declared in the interface.

#### 2.2 ParaSail Types and Objects

A ParaSail *type* is defined by instantiating a ParaSail module, which consists of specifying the name of the module and then an actual type or value for each formal parameter of the module. For example, Set<Integer> defines a set-of-integers type given a Set module with one type formal parameter, presuming Integer is itself a type. A named type may be declared by specifying the type name and the type definition; for example: **type** Int\_Set **is** Set<Integer>. A ParaSail *object* is an instance of a type, and is declared as either a **var** (*variable*) or **const** (*constant*) object. For example:

```
var X: Set<Integer> := []
const Y: Set<Integer> := [35, 42]
var Z := Y
```

Note that the type need not be specified if the type of the initial value can be resolved unambiguously. An initial value need not be provided for a var object, but then a type specification is clearly required. When specifying the type for an object, the keyword optional may be specified. Each ParaSail type includes one additional value called null, but only objects (or components) specified as optional are permitted to be assigned a null value.

An object (or component) with a null value takes up minimal space. The space for the object grows automatically when the object is assigned a non-null value, and shrinks again when assigned back to a null value. See below for a further discussion of the ParaSail region-based storage model.

## 2.3 ParaSail Map Module Example

Here is an example of the interface for a Map module which provides a mapping from keys to values. Hashable is itself another (abstract) interface, which the Key\_Type must implement. As described above, an interface begins with a list of formal parameters, in this case Key\_Type and Value\_Type, followed by definitions of any visible data components (none in this case) and visible operations (such as "[]", "indexing", and

Is\_Empty). In this case we also see the definition of a local type Pair, which is used in the definition of various operations that follow. Pair is defined as an instantiation of the module Key\_Value, which also has two parameters. The full declaration of the interface to module Key\_Value is given in section 2.3.4. As illustrated below, operations can either be declared with **op** (*operator*) to indicate they are invoked using special syntax (*syntactic sugar*), or with **func** (*function*) to indicate they are invoked using normal name(params) syntax.

```
interface PSL::Containers::Map
     <Key_Type is Hashable<>; Value_Type is Assignable<>> is
 3
       // A hashed—map module
       type Pair is Key_Value<Key_Type, Value_Type>
 4
           // Supports "[Key => Value]" notation
 5
       op "[]"() -> Map
 6
           // Return an empty map
 7
 8
       op "|="(var Left: Map; Right: Pair)
           // Add Key=>Value to Map
 9
       op "|"(Left: Map; Right: Pair) -> Map
           // Return Map with Key=>Value added
11
12
       op "+="(var Left: Map; Right: Pair) is "|="
13
           // A synonym
       op "in"(Key: Key_Type; M: Map) -> Boolean
14
           // True if Key is in map
15
       op "—="(var M: Map; Key: Key_Type)
16
           // Remove mapping for Key, if any
17
18
       op "index_set"(M: Map) -> Set<Key_Type>
19
           // Return set of keys with mappings
       op "indexing"(ref M: Map; Key: Key_Type) {Key in M} -> ref Value_Type
20
           // Used for references to M[Key]; {} is precondition.
21
22
       func Remove_Any(var M: Map) —> optional Pair
23
           // Remove mapping from Map; Return null if map is empty.
       op "magnitude"(M: Map) -> Univ_Integer
24
           // Number of mappings in the table; Supports "|M|" notation
25
       func Is_Empty(M: Map) -> Boolean
26
           // True if no mappings in the table
27
28 end interface PSL::Containers::Map
```

#### 2.3.1 Parameterized and Parameterless Modules

The list of module parameters is given in <> immediately after the module name. Each parameter that is a type specifies its name and the interface it must implement. Assignable imposes no special interface requirements. Hashable is defined as follows:

```
abstract interface PSL::Containers::Hashable<> is
op "=?"(Left, Right: Hashable) --> Ordering
func Hash(Val: Hashable) --> Univ_Integer
end interface PSL::Core::Hashable
```

Hashable has no module parameters (empty <>). The parameterless interfaces that a module implements need not be specified explicitly – any module that provides the required operations of a parameterless interface is automatically defined to implement the interface. This allows a parameterized module to define exactly the operations it needs of a given type parameter using a parameterless interface, without requiring

that the actual type used to instantiate the module explicitly lists that interface as one of its implemented interfaces. Hence, if a hypothetical type Integer provides the "=?" and Hash operations, then Map<Integer, String> is permitted, even if the module defining Integer doesn't explicitly mention Hashable among the modules that it implements.

#### 2.3.2 The "=?" Operator

The "=?" operator in Hashable is used to define the equality and relational properties of the associated type. Syntactic sugar is used to map the equality operators ("==" and "!=") and the relational operators ("<", "<=", ">=", ">=", ">>", ">>", ">>") to this one compare operator. The Ordering result type of "=?" is an enumeration type with four possible values, #less, #equal, #greater, and #unordered. The expression A == B is de-sugared into (A =? B) in [\#equal] while A <= B is de-sugared into (A =? B) in [\#less, #equal], where [X, Y, ...] is a container aggregate notation used to define values for sets, maps, arrays, etc. The container aggregate notation is itself syntactic sugar, which de-sugars into a sequence of operations starting with "[]" to produce an empty container of the desired type, and then invocations of operators to add elements sequentially to the growing container. These operations are performed at compile-time if all elements are compile-time-known (e.g. literals) or instantiation-time known (e.g. module parameters). Note that "=?" can be used for partially-ordered types as well as fully ordered types. If A =? B returns #unordered, then both A <= B and A >= B will return #false, indicating that A and B are not ordered with respect to one another.

#### 2.3.3 The Map Class

A module may have a class part that provides an implementation of its interface. Below is a partial listing of the Map class. As described above, a class starts with declarations of internal data components (Table in this case) and internal operations (none needed in this case), followed by the keyword exports and then the implementations of the visible operations of the module.

```
1
 2 class PSL::Containers::Map is
       // A Map is simply a wrapper of a Hash_Table of Key=>Value pairs
 3
       var Table: Hash_Table<Pair>
 4
     exports
 5
 6
       op "[]"() -> Map is
 7
           // Return an empty map
 8
           return (Table => [])
       end op []"
 9
       op "|="(var Left: Map; Right: Pair) is
           // Add Key=>Value to Map
11
           Left.Table |= Right
12
       end op |="
13
       op "|"(Left: Map; Right: Pair) -> Result: Map is
14
           // Return Map with Key=>Value added
15
           Result := Left
16
17
           Result |= Right
18
       end op |"
19
20 end class PSL::Containers::Map
```

The above is an example of a wrapper module, meaning it has exactly one component, while providing a different set of operations than the underlying data object. ParaSail is designed so that no per-object space overhead is necessary for such a wrapper module – it can have exactly the same run-time representation as its underlying component, even though its compile-time interface is potentially quite different. This contrasts with some languages where each layer of compile-time abstraction becomes another layer of run-time object overhead [21].

The implementation of the "|" operator above illustrates the use of a named result object (Result). In the absence of a return

## 2.4 Hash\_Table, Keyed, and Key\_Value Modules

Here are the interfaces for the Key\_Value and Hash\_Table modules used above in the Map module. Note that Hash\_Table takes a single type parameter which must implement the Keyed interface, also given below. A Hash\_Table is a good example of an irregular data structure, in that in a typical implementation, the number of elements in any given bucket of the hash table will vary depending on the number of keys that hash to the same hash-table index. Furthermore, when such a hash table hits some defined limit on density, the hash table is typically expanded to have more buckets, with the number of elements in each bucket again changing based on the enlarged range of the hashed index.

```
interface PSL::Containers::Hash_Table<KV_Type is Keyed<>> is
       // A simple hash table of keyed entries
 2
       op "[]"() -> Hash_Table // Empty table
 3
       op "|="(var Left: Hash_Table; Right: KV_Type)
 4
 5
           // Add Keyed entry to table
       op "in" (Key: KV_Type::Key_Type; T: Hash_Table) -> Boolean
 6
           // True if Key in table
 8
       op "—="(var T: Hash_Table; Key: KV_Type::Key_Type)
           // Remove entry with given key, if any
 9
       op "index_set"(T: Hash_Table) -> Set<KV_Type::Key_Type>
10
           // Return set of keys in table
11
       op "indexing"(ref T: Hash_Table; Key: KV_Type::Key_Type){Key in T} --> ref KV_Type
12
           // Used for references to T[Key];
13
       func Remove_Any(var T: Hash_Table) -> optional KV_Type
14
           // Remove entry from table;
15
           // Return null if table is empty.
16
       op Count(T: Hash_Table) -> Univ_Integer
17
           // Number of entries in the table
18
19 end interface PSL::Containers::Hash_Table
```

The interface Keyed requires only a single operation, Key Of, as follows:

```
abstract interface Keyed<Key_Type is Hashable<>> is
func Key_Of(Keyed) —> Key_Type
end abstract interface Keyed
```

The Key\_Value module defines two visible components (Key and Value), and provides the Key\_Of operation, among oth-ers. It explicitly implements the Keyed interface. Because the Keyed interface has a parameter, the Key Value interface must list it

explicitly in the ancestry part of the interface declaration, to indicate how the formal types of Key Value relate to the formal type of the Keyed interface:

```
interface Key_Value<Key_Type is Hashable<>; Value_Type is Assignable<>>
implements Keyed<Key_Type> is
var Key: Key_Type
var Value: Value_Type
func Key_Of(Key_Value) -> Key_Type
...
end interface Key_Value
```

Note that operation parameters may be specified merely by their type, in which case the name of the parameter defaults to the simple name of the type. In the above, the Key\_Value parameter of Key\_Of has both name Key\_Value and type Key\_Value. The distinction is resolved by context of usage. This short-hand is only permitted if each such default-named parameter has a distinct type.

Finally, here is the class part of the Hash\_Table module, showing the underlying representation of the Hash\_Table as an array of optional Nodes, each having a Keyed component and an optional Next component. Each node is effectively the head of a linked list, terminated by a node that has a null Next component. Note that in a language with no re-assignable pointers, it is useful to think of this not as a linked list, but rather as an expandable object, which grows somewhat like a vine, sprouting subcomponents out of the Next field (see section 3 below for more discussion of the pointer-free memory model). In this example, we see two internal data components, Backbone and Count, and a local module Node that has two visible components (Entry and Next) and no operations (thus requiring no class part to implement the module's interface). The functioning of the "in"and "index\_set" operations is described in the next section.

```
1 class PSL::Containers::Hash_Table is
       interface Node<> is
 2
           var Entry: Keyed
 3
           var Next: optional Node
 4
 5
       end interface Node
 6
 7
       var Backbone: Basic_Array<optional Node>
 8
       var Count: Univ_Integer:= 0
 9
     exports
       op "[]"() -> Hash Table
10
           return (Backbone => [], Count => 0)
11
       end op "[]"
12
13
       op "in" (Key: KV_Type::Key_Type; T: Hash_Table) -> Boolean is
14
           if T.Count > 0 then // non-empty
15
               const H:= Hash(Key) mod |T.Backbone|
16
               for N => T.Backbone[H+1]
17
18
                then N.Next while N not null loop
                  if Key_Of(N.Entry) == Left then
19
                     return #true
20
                  end if
21
22
               end loop
           end if
23
```

```
return #false
24
       end op "in"
25
26
       op "index_set"(T: Hash_Table) -> Result: Set<KV_Type::Key_Type> is
27
           // Build up set of keys
           Result := []
29
           for each B of T.Backbone loop
30
               for N => B then N.Next
31
                 while N not null loop
32
                   Result |= Key_Of(N)
33
               end loop
34
           end loop
35
       end op "index_set"
       op Count(T: Hash_Table) -> Univ_Integer
37
          is (T.Count) // an expression function
39 end class PSL::Containers::Hash Table
```

**Iterators and References** The Hash\_Table class above illustrates a couple of operations with more complex implementations. The operator "in" hashes the given Key to identify the Hash\_Table bucket which should be scanned to see whether the Key is already present. This uses one of the three forms of **for** loop provided by ParaSail, the one allowing an initial object (**for** N => Root) or value (**for** I := First), the next object or value (**then** N.Next or **then** I+1), and a termination test (**while** N **not null**, or **while** I <= Last).

The "index\_set" operator returns a set of keys, given a hash table. This uses both the for/then/while form of for loop, as well as a container element iterator, which uses for each Element of Indexed\_Container to iterate through the set of Elements of the given indexed container. The element iterator is syntactic sugar for the following expansion:

```
var @Keys := "index_set"(Indexed_Container)
for @K := Remove_Any(@Keys)
then Remove_Any(@Keys)
while @K not null loop
ref Element => Indexed_Container[@K]
... // body of loop
end loop
```

where @K and @Keys are meant to represent compiler-generated unique names. In the above expansion, and in the declaration for the "indexing" operators, we see the use of the ref keyword to indicate a local, short-lived name for an existing object (Element is the local name for the given element of Indexed\_Container). Such names inherit the type and writability of the referenced object. Any use of such a ref is equivalent to a use of the referenced object. An operation may return a ref, but only if it is a reference to some part of an object passed to it as a ref parameter. This is how the "indexing" operator works.

## 2.4.1 ParaSail Literals and Univ Types

In the above examples, we have used integer literals, such as o and I, without describing their semantics. In addition we have used the Univ\_Integer type and also Integer as an example of a type over which a Set might be defined. There are actually five

different sorts of literals in Parasail: integer, real, character, string, and enumeration. Each has a distinct syntax, and each has an associated type in which the literal's value is initially represented. This is summarized in the following table:

Kind of Literal	Example Syntax	Туре
Integer	123, OxFF, 8#77#	Univ_Integer
Real	123.4, 1.2E7	Univ_Real
Character	'i', '\n', '\#03_Co#'	Univ_Character
String	"abc", "two\nlines"	Univ_String
Enumeration	#red, #false, #equal	Univ_Enumeration

Most of the ParaSail syntax for literals is quite similar to other languages such as C or Java. The '\#...#' form of character literal is used to specify the Unicode value of the literal. Enumeration literals have a distinct syntax in ParaSail. This is common in Lisp-based languages, but less common in imperative languages. By using a distinct syntax, with its own Univ\_Enumeration type, we enable significant flexibility to users in defining the mapping from such literals to the values of a given type.

In general, to allow a given kind of literal to be used with a user-defined type, the associated module must define two operators, "from\_univ" and "to\_univ". These are conversion functions, from a Univ type, or back to such a type. By defining a function of the form "from\_univ"(Univ\_Integer) —> My\_Type integer literals may be used to represent values of My\_Type. Similarly, by defining a "from\_univ"(Univ\_Enumeration) —> My\_Enum\_Type, enumeration literals may be used to represent values of My\_Enum\_Type. Calls on these conversion functions are inserted implicitly during name and type resolution by the ParaSail front end, when a literal is used within an expression. Effectively, a literal is actually syntactic sugar for "from univ"(literal).

These "from\_univ" conversion functions must include a precondition (specified with the syntax "Boolean-expression" as illustrated in the "indexing" operators above) which determines which literals can be converted into values of the given type. So, for example, the precondition for the Ordering type's "from\_univ" operator, presuming it is declared "from\_univ"(Univ:Univ:Enumeration) —> Ordering, would be:

{Univ in [#less,#equal,#greater,#unordered]}

By specifying such a precondition, the compiler will disallow use of other literals of the Univ\_Enumeration type when it expects a value of type Ordering.

## 2.4.2 User-Defined Numeric and Enumeration Types

Values and objects of the Univ types can in fact be used at run-time as well, but their representation and manipulation will generally not be as efficient as a user-defined type that need only represent some particular range of values. In particular, in the ParaSail standard library there are modules designed for more efficient representation of numeric and enumeration types, including an Integer, Float, Fixed, and Enum module. The Integer module defines all of the usual operators, and has one module parameter which is the range of Univ\_Integers that are to be representable in objects of the type:

```
interface Integer <Range: Countable_Range<Univ_Integer> := -2**63+1 .. +2**63-1> is

op from_univ" (Univ : Univ_Integer) {Univ in Range} -> Integer
```

```
op to_univ" (Integer) --> Result : Univ_Integer {Result in Range} // postcondition
op +" (Left, Right : Integer) --> Integer
...
end interface Integer
```

Because the Range parameter has a default, Integer by itself is interpreted as an instantiation of the module Integer with all parameters defaulted, i.e. Integer is a short-hand for Integer<> which is a short-hand for Integer<Range => -2\*\*63+1...+2\*\*63-1>. Note that ".." is a user-definable operator in ParaSail, and is expected to return a set or a range of values. Also note that "from\_univ" has a *precondition*, while "to\_univ" has a *postcondition*, based on the specified Range.

The Univ types are universal in the sense that values of a Univ type are implicitly convertible to and from all types of the corresponding kind. So in addition to the implicit calls on "from\_univ" applied to literals, if a formal parameter of some operation is declared to be of a Univ type, then a call on the appropriate "to\_univ" conversion will be inserted as appropriate if an operand of a non-universal type of the corresponding kind is passed as the actual parameter. For example, a formal parameter of type Univ\_Integer accepts *any* integer type as its actual parameter. So Univ types effectively allow *weak* typing, while non-Univ types enforce *strong* typing for numeric, character, string, and enumeration types.

## 3 Pointer-Free Region-Based Storage

Pointers are ubiquitous in modern object-oriented programming languages, and many data structures such as trees, lists, graphs, hash tables, etc. depend on them heavily. Unfortunately, pointers can add significant complexity to programming. Pointers tend to make storage management more complex, to make assignment and equality semantics more complex, to increase the ways two different names (access paths) can designate the same object, to make program analysis and proof more complex, and to make it harder to divide and conquer a data structure for parallel processing.

#### 3.1 Expandable and Optional Objects

Rather than using pointers, ParaSail supports flexible data structuring using *expandable* (and shrinkable) objects, along with generalized indexing. An expandable object is one that can grow without using pointers, much as a plant can grow through sprouting new stems. The basic mechanism for expansion in ParaSail is as mentioned in section 2.2 above, namely that every type has one additional value, called null. A component can initially be null, and then be replaced by a non-null value, thereby expanding the enclosing object. At some later point the enclosing object could shrink, by replacing a non-null component with null.

As also mentioned in section 2.2, not every component of an object is allowed to be null. The component must be declared as optional if it is allowed to take on a null value. For example, a Tree structure might have a (non-optional) Payload component, and then two additional components, Left and Right, which are each declared as

optional Tree. Similarly, a stand-alone object may be declared to be of a type T, or of a type optional T. Only if it is declared optional may it take on the null value. The value of an object X declared as optional may be tested for nullness using X is null or X not null.

Another example of a data structure using optional components would be a linked list, with each node having two components, say, a Payload component of some type, and a Tail component of type optional List. There is also a built-in parameterized type, Basic\_Array <Component\_Type> which allows the Component\_Type to be specified as op-tional. This allows, for example, the construction of a hash table with buckets represented as linked-lists, by declaring the backbone of the hash table as a Basic\_Array<optional Node> as illustrated in the Hash\_Table example in section 2.3.4 above. The elements of the hash table backbone would start out as null, but as items are added to the hash table, one or more of the component lists would begin to grow. In this case, a Node is defined as having an Entry component and an optional Next component of type Node.

#### 3.1.1 Assignment, Move, and Swap Operations

Because there are no pointers, the semantics of *assignment* in ParaSail are straightforward, namely the entire right-hand-side object is copied and assigned into the left-hand side, replacing whatever prior value was there. However, there are times when it is desirable to move a component from one object to another, or swap two components. Because implementing these on top of an assignment that uses copying might impose undue overhead, in ParaSail, *move* and *swap* are separate operations. The semantics of *move* are that the value of the left-hand-side is replaced with the value of the right-hand-side, and the right-hand-side ends up null. For *swap*, the values of the left- and right-hand-side are swapped. Syntactically, Para-Sail uses ":=" for (copying) assignment, "<==" for move, and "<=>" for swap. The ParaSail compiler is smart enough to automatically use move semantics when the right-hand-side is the result of a computation, rather than an object or component that persists after the assignment.

As an example of where move might be used, if our hash table grows to the point that it would be wise to lengthen the back-bone, we could create a new Basic\_Array twice as large (for example), and then move each list node from the old array into the new array in an appropriate spot, rebuilding each linked list, and then finally move the new array into the original hash-table object, replacing the old array. Here is sample code for such an expansion:

```
func Expand (var HT: Hash_Table) is
         // Double the size of the Hash_Table backbone
2
        var Old_Backbone <== HT.Backbone // Move old backbone to temp</pre>
3
        const New_Len := |Old_Backbone| * 2
4
        // Create backbone with double the number of buckets
5
6
        HT.Backbone := Create(New_Len, null)
        for each Old_Bucket of Old_Backbone loop
7
8
           for Old_Elem => Old_Bucket then Old_Elem.Next while Old_Elem not null loop
              const New_Hash := Hash(Key_Of(Old_Elem.Entry)) mod New_Len
9
              ref New_Bucket => HT.Backbone[New_Hash + 1]
              // Insert at front, using move"s to create new node.
11
```

```
New_Bucket := Node::(Entry <== Old_Elem.Entry, Next <== New_Bucket)

end loop

end loop

end func Expand
```

The swap operation is also useful in many contexts, for example when balancing a tree structure, or when sorting an array.

#### 3.2 Cyclic Data Structures and Generalized Indexing

Expandable objects allow the construction of many kinds of data structures, but a general, possibly cyclic graph is not one of them. For this, ParaSail provides generalized indexing. The array-indexing syntax, A[I], is generalized in ParaSail to be usable with any container-like data structure, where A is the container and I is the key into that data structure. A directed graph in ParaSail could be represented as a table of Nodes, where the index into the table is a unique node Id of some sort, with edges represented as Predecessors and Successors components of each Node, where Predecessors and Successors are each sets of node-ids.

If edges in a directed graph were instead represented with pointers, it would be possible for there to be an edge that refers to a deleted node, that is, a dangling reference. Such a dangling reference could result in a storage leak, because the target node could not be reclaimed, or it could lead to a potentially destructive reference to reclaimed storage. By contrast, when edges are represented using node-ids, there is still the possibility of an edge referring to a deleted node or the wrong node, but there is no possibility for there to be associated storage leakage or destructive reference to reclaimed storage, as node-ids are only meaningful as keys into the associated container.

## 3.3 Region-Based Storage Management

Storage management without pointers is significantly simplified, even with highly irregular data structures. All of the objects declared in a given scope are associated with a *storage region*, essentially a local heap. As an object grows, all new storage for it is allocated out of this region. As an object shrinks, the old storage can be immediately released back to this region. When a scope is exited, the entire region is reclaimed. There is no need for asynchronous garbage collection, as garbage never accumulates. Objects may grow in a highly irregular fashion without losing their locality of reference.

Every object identifies its region, and in addition, when a function is called, the region in which the result object should be allocated is passed as an implicit parameter. This target region is determined by how the function result is used. If it is a temporary, then it will be allocated out of a temporary region associated with the point of call. If it is assigned into a long-er-lived object, then the function will be directed to allocate the result object out of the region associated with this longer-lived object. The net effect is that there is no copying at the call site upon function return, since the result object is already sitting in the correct region.

Note that pointers are still used behind the scenes in the ParaSail implementation, but eliminating them from the surface syntax and semantics eliminates the complexity associated with pointers. That is, a semantic model of expandable and shrinkable objects, operating under (mutable) value semantics, rather than a semantic model of nodes connected with pointers, operating under reference semantics, provides a number of benefits, such as simpler storage management, simpler assignment semantics, easier analyzability, etc. while preserving flexibility in representing potentially highly irregular structures.

ParaSail's move and swap operations have well-defined semantics independent of the region-based storage management, but they provide significant added efficiency when the objects named on the left and right-hand side are associated with the same region, because then their dynamic semantics can be accomplished simply by manipulating pointers. In some cases the programmer knows when declaring an object that it is intended to be moved into or swapped with another existing object. In that case, ParaSail allows the programmer to give a hint to that effect by specifying in the object's declaration that it is "for X" meaning that it should be associated with the same region as X. With region-based storage management, it is always safe to associate an object with a longer-lived region, but to avoid a storage leak the ParaSail implementation sets the value of such an object to null on scope exit, as its storage would not otherwise be reclaimed until the longer-lived region is re-claimed. An optimizing compiler could automatically choose to allocate a local variable out of an outer region when it determines that its last use is a move or an assignment to an object from an outer region.

It is straightforward to show that when a non-null object or a component is set to null, immediate reclamation of the old value is possible, and will not create a dangling reference. Assignment copies rather than shares data, and move and swap create no sharing relationships, so each piece of storage used to represent the value of an object is unshared.

One possible way to create a dangling reference might be if two computations were being performed in parallel, and one were to set an object to null while the other was still using the object. The mechanism to prevent this is part of the more general mechanism to prevent concurrent update of an object while other computations have access to it. This is covered in the next section.

## 4 Parallel and Distributed Programming

In addition to removing pointers, certain other simplifications are made in ParaSail to ease parallel and distributed program-ming of potentially irregular computations. In particular, there are no global variables; functions may only update objects passed to them as var (in-out) parameters. Furthermore, as part of passing an object as a var parameter, it is effectively handed off to the receiving function, and compile-time checks ensure that no further references are made to the object, until the function completes. In particular, the checks ensure that no part of the var parameter is passed to any other function, nor to this same function as a separate parameter. This eliminates

at compile-time the possibility of aliasing between a var parameter and any other object visible to the function. These two additional rules, coupled with the lack of pointers, mean that all parameter evaluation may happen in parallel (e.g. in G(X) + H(Y), the operands to H(Y), and H(Y), may be evaluated in parallel). These rules also imply that a ParaSail function call can safely cross an address-space boundary, since the objects are self-contained (with no incoming or outgoing references), and only one function at a time can update a given object.

Because of the simplifications in ParaSail, conservative data race detection can be incorporated directly into the compiler front end, ensuring that no data races remain in the program independent of whether expressions are evaluated sequentially or in parallel. This data race detection permits the compiler to safely and automatically insert parallel evaluation even across sequential statements in a ParaSail programs, so long as the compiler can determine it would not introduce a data race. Furthermore, in ParaSail the programmer can explicitly claim that two statements can safely be executed in parallel, by using "||" rather than ";" as the separator between the statements. Alternatively, the programmer can specify that two statements must not be executed in parallel, by using "then" rather than ";" as the separator.

As a simple example of an irregular computation that uses parallelism, below is an exhaustive search of a binary tree, where each Tree Node has four components, a Key (of type Key Type) a Value (of type Value Type), and Left and Right subtrees (each of type optional Tree Node). Each iteration of the loop checks to see whether the Value of the node referred to by T matches Desired Value. If so, it returns the associated Key field of the node, and the function ends. Otherwise, it uses parallel continue statements to spawn two more iterations, one to search the Left subtree, and one to search the Right sub-tree. The "while T not null" of the loop header acts as a filter on the iterations, immediately terminating an iteration if T is null. If T is not null, the iteration proceeds, and either returns or spawns two more iterations. A loop like this continues until all iterations complete (in this example, the function would then return null), or until one of the iterations does a re-turn, in which case all other iterations are terminated, and then the return causes the function to exit with the given value. If two or more iterations concurrently reach a return statement, one is chosen arbitrarily to proceed while the others are terminated. This is effectively viewing a loop as a bag of iterations executing in parallel, with continue adding another iteration to the bag, and the loop terminating when the bag of iterations is empty, or when one (or more) of the iterations does a return (or exit).

```
func Search(Root : Tree_Node; Desired_Value : Value_Type) -> optional Key_Type is
 1
 2
          for T => Root while T not null loop
             if T.Value == Desired_Value then
 3
                return T.Key
 4
             else
 5
 6
                continue loop with T.Left
 7
                continue loop with T.Right
 8
 9
             end if
          end loop
          return null
11
       end func Search
12
```

A more complete example of the parallelism features is provided in the next section, by a parallel, non-recursive implementation of in-place Quicksort.

#### 4.1 Parallel Non-Recursive Quicksort

Quicksort is an example of an irregular computation, in that it repeatedly partitions the array to be sorted at points that depend both on the values in the array and on which values are chosen as pivots. Quicksort also illustrates the use of swap as the primary mutation operation on the array being sorted in place. Below is an in-place version of Quicksort that uses parallelism in a number of ways, with swap as the fundamental data-moving operation. The slicing operation A[X..Y] produces a slice of the array A comprising the elements with indices from X through Y. The operation A[..] is used to create a full slice that goes from the first to the last element of A, essentially viewing the array as a slice.

The Quicksort operation is structured as an outer loop where each iteration sorts a slice of the array. The first iteration operates on a full slice of the array. Additional iterations are created by continue statements on sub-slices of the array. As illustrated above in the Search example, when two continue statements are invoked in parallel, then the two iterations can run in parallel with one another. The loop as a whole completes once all of the iterations of the loop are complete. Effectively this sort of ParaSail loop implements a kind of work-list algorithm, with continue being the way to add a new work-item to the work-list. Note that similar to the Search example, the while |Arr| > 1 acts as a filter on the iterations, in that iterations for a slice of length <= 1 terminate immediately.

In each iteration, if the array-slice Arr is of length exactly two, then the two elements are checked to see whether they are in order, and if not, they are swapped (using the ParaSail "<=>" swap operation). If the slice Arr comprises more than two elements, then the iteration proceeds to partition the slice into subslices, by picking a pivot value (Mid), and then looking (in parallel) for two elements that are on the "wrong" side, and swapping them (again using "<=>"). Once there are no more elements to swap, the original array slice has been partitioned, and the two partitions (subslices) are themselves sorted. Rather than recursion, the implicit bag or work-list model of this kind of ParaSail for loop allows a non-recursive solution, with each subslice to be sorted merely being added to the bag or work-list of iterations to be performed, rather than resulting in a recursion.

```
func Quicksort(var A: Array_Type) is
1
           // Handle short arrays directly. Partition longer arrays.
2
           for Arr => A[..] while |Arr| > 1 loop
3
               if |Arr| == 2 then
4
                  if Arr[Arr.Last] < Arr[Arr.First] then
5
6
                       // Swap elements
                      Arr[Arr.First] <=> Arr[Arr.Last];
7
8
                  end if;
               else
9
                  // Partition array
                  const Mid := Arr[Arr.First + |Arr|/2];
```

```
var Left := Arr.First;
12
                   var Right := Arr.Last;
13
                   until Left > Right loop
14
                       var New_Left := Right+1;
15
                       var New_Right := Left—1;
16
                     then
17
                        // Find item in left half to swap
18
                       for I in Left .. Right forward loop
19
                            if not (Arr[I] < Mid) then
                                // Found an item that can go into right partitition
21
                                New_Left := I;
22
                                if Mid < Arr[I] then</pre>
23
                                     // Found an item that *must* go into right part
24
                                    exit loop;
25
26
                                end if;
                            end if:
27
                       end loop;
                     Ш
29
                        // Find item in right half to swap
30
                       for J in Left .. Right reverse loop
31
                            if not (Mid < Arr[J]) then</pre>
32
                                // Found an item that can go into left partition
33
34
                                New_Right := J;
                                if Arr[J] < Mid then</pre>
35
                                     // Found an item that *must* go into left part
36
37
                                    exit loop;
                                end if:
38
                            end if:
39
                       end loop;
40
                     then
41
                       if New_Left > New_Right then
42
                            // Nothing more to swap
43
                            // Exit loop and recurse on two partitions
44
                            Left := New_Left;
45
                            Right := New_Right;
46
                            exit loop;
47
                       end if;
48
                        // Swap items
49
                       Arr[New_Left] <=> Arr[New_Right];
50
                       // continue looking for items to swap
51
52
                       Left := New_Left + 1;
                        Right := New_Right - 1;
53
                   end loop;
54
                 then
55
                   // continue with two halves in parallel
56
                   continue loop with Arr => Arr[Arr.First .. Right];
57
58
                   continue loop with Arr => Arr[Left .. Arr.Last];
59
                end if;
60
            end loop:
61
        end func Quicksort;
62
```

## 4.2 Concurrent Objects

The handoff model of parameter passing applies to objects that are not designed for concurrent access. ParaSail also supports the construction of concurrent objects, which allow lock-free, locked, and queued simultaneous access. Concurrent objects are not "handed off" as part of parameter passing, and aliasing of such parameters is permitted; concurrent objects provide operations that synchronize any attempts at concurrent access. Three kinds of synchronization are supported. Lock-free synchronization relies on low-level hardware-supported operations such as atomic load and store, and compare-and-swap. Locked synchronization relies on automatic locking as part of calling a locked operation of a concurrent object, and automatic un-locking as part of returning from the operation. Finally, queued synchronization is provided, which evaluates a dequeue condition upon call (under a lock), and only if the condition is satisfied is the call allowed to proceed, still under the lock. A typical dequeue condition might be that a buffer is not full, or that a mailbox has at least one element in it. If the dequeue condition is not satisfied, then the caller is added to a queue. At the end of any operation on the concurrent object that might change the result of the dequeue condition for a queued caller, the dequeue condition is evaluated and if true, the operation requested by the queued caller is performed before the lock is released. If there are multiple queued callers, then they are serviced in turn until there are none with satisfied dequeue conditions.

One way to understand the distinction between "normal" objects and concurrent objects is that the compiler performs com-pile-time checks to ensure there are no data races on accessing "normal" objects, while concurrent objects use run-time synchronization to prevent data races.

Below is a simple example of a concurrent module, a Locked\_Box. This concurrent module has both an interface and a class that implements it. In the interface we see the declaration of five operations: one operation that constructs a Locked Box (Create), one locking operation that overwrites the content (Set\_Content which gets an exclusive read-write lock on its var parameter B), one locking operation that reads the content (Content which gets a shared lock on its read-only parameter B), and two queuing operations, one that will add a value to an empty Box (Put), and one that will remove a value from a full Box (Get). In the class for the module Locked\_Box, we see the internal data component Content which is declared optional to indicate that it can be null, followed by the implementations of the five operations. The operations that have locked or queued access can be written knowing that an appropriate exclusive or shared lock is acquired as part of the call of the operation. Furthermore, for the queued operations, the call is queued until the specified dequeue condition is satisfied. In this case, the dequeue condition for Put ensures the box is empty (i.e. has a null value) and the dequeue condition for Get ensures the box is full (i.e. has a non-null value). Note that a queued operation can safely assume that the dequeue condition is satisfied when it begins. ParaSail semantics ensure there is no need to recheck the condition explicitly. The locking, waiting, and signaling to support the semantics of these operations are all provided automatically in ParaSail as part of the semantics of a call on such an operation.

concurrent interface Locked\_Box <Content\_Type is Assignable<>> is

```
func Create(C : optional Content_Type) -> Locked_Box;
 2
            // Create a box with the given content
 3
       func Set_Content (locked var B : Locked_Box; C : optional Content_Type);
 4
           // Set content of box
 5
       func Content(locked B : Locked_Box) --> optional Content_Type;
 6
            // Get a copy of current content
 7
       func Put(queued var B : Locked_Box; C : Content_Type);
 8
           // Wait for the box to be empty, and then Put something into it.
 9
       func Get(queued var B : Locked_Box) --> Content_Type;
10
            // Wait until content is non—null, then return it, leaving it null.
11
12 end interface Locked_Box;
13
14 concurrent class Locked_Box is
       var Content: optional Content_Type; // Content might be null
15
16
       func Create(C : optional Content_Type) -> Locked_Box is
17
            // Create a box with the given content
18
           return (Content => C);
19
       end func Create;
20
21
       func Set_Content (locked var B : Locked_Box; C : optional Content_Type) is
22
23
            // Set content of box
24
           B.Content := C;
       end func Set_Content;
25
26
27
       func Content(locked B: Locked_Box) -> optional Content_Type is
           // Get a copy of current content
28
           return B.Content;
29
       end func Content;
31
       func Put(queued var B : Locked_Box; C : Content_Type) is
         queued until B.Content is null then
33
           // Wait for the box to be
34
           // and then Put something into it.
35
           B.Content := C;
36
       end func Put;
37
38
       func Get(queued var B : Locked_Box) -> Result : Content_Type is
39
         queued while B.Content is null then
           // Wait until content is non-null,
41
           // then return it, leaving it null.
42
           Result <== B.Content;
43
       end func Get;xs
45 end class Locked_Box;
```

The above Get operation makes use of the move construct ("<==") which moves the value of the right-hand side (B.Content) into the left-hand side (Result) leaving the right-hand side null afterward. This matches the desired semantics, namely that Get waits until the box B is "full" (i.e. non-null), but then leaves it "empty" (i.e. null) upon return.

## 5 Related Work

There are very few pointer-free languages currently under active development. Fortran 77 [32] was the last of the Fortran series that restricted itself to a pointer-free model of programming. Algol 60 lacked pointers [24], but Algol 68 introduced them [17]. Early versions of Basic had no pointers [14], but modern ver-sions of Basic use pointer assignment semantics for most complex objects [20]. The first versions of Pascal, Ada, Modula, C, and C++ all used pointers for objects that were explicitly allocated on the heap, while still supporting stack-based records and arrays; these languages also required manual heap storage reclamation. The first versions of Eiffel, Java, and C# provided little or no support for stack-based records and arrays, moving essentially all complex objects into the heap, with pointer semantics on assignment, and automatic garbage collection used for heap storage reclamation.

In many cases, languages that originally did not require heavy use of pointers, as they evolved to support object-oriented programming, the use of pointers increased, often accompanied by a reliance on garbage collection for heap storage reclamation. For example, Modula-3 introduced object types, and all instances of such types were allocated explicitly on the heap, with pointer semantics on assignment, and automatic garbage collection for storage reclamation [5].

The Hermes language (and its predecessor NIL) was a language specifically designed for distributed processing [25]. The Hermes type system had high-level type constructors, which allowed them to eliminate pointers. As the designer of Hermes explained it, "pointers are useful constructs for implementing many different data structures, but they also introduce aliasing and increase the complexity of program analysis" [25, p. 80]. Hermes pioneered the notion of *type state*, as well as *handoff* semantics for communication, both of which are relevant to ParaSail, where compiletime assertion checking depends on flow analysis, and handoff semantics are used for passing **var** parameters in a call on an operation.

The SPARK language, a high-integrity subset of Ada with added proof annotations, omits pointers from the subset [6]. No particular attempt was made to soften the effect of losing pointers, so designing semi-dynamic data structures such as trees and linked-lists in SPARK requires heavy use of arrays [28].

A relatively new language that is pointer-free is Composita, described in the 2007 Ph. D. thesis of Dr. Luc Bläser from ETH in Zurich [3]. Composita is a component-based language, which uses message passing between active components. Sequences of statements are identified as either exclusive or shared to provide synchronization between concurrent activities. Composita has the notion of empty and installed components, analogous to the notion of optional values in ParaSail.

Annotations that indicate an ownership relationship between a pointer and an object can provide some of the same benefits as eliminating pointers [7]. AliasJava [1] provides annotations for specifying ownership relationships, including the notion of a unique pointer to an object. Guava [2] is another Java-based language that adds value types which have no aliases, while still retaining normal object types for other purposes. Assignment of value types in Guava involves copying, but they also provide a move operation essentially equivalent to that in ParaSail. These approaches,

by limiting the possibilities for aliasing, can significantly help in proving desirable properties about programs that use pointers. However, the additional programmer burden of choosing between multiple kinds of pointers or objects based on their aliasing behavior can increase the complexity of such approaches.

One reason given in these papers on aliasing control for not going entirely to a pointer-free, or unique-pointer approach for object-oriented programming, is that certain important object-oriented programming paradigms, such as the Observer pattern [9], depend on the use of pointers and aliasing. ParaSail attempts to provide an existence proof to the contrary of that premise, as do other recent pointer-free languages such as Composita. In general, a more loosely-coupled pointer-free approach using container data structures with indices of various sorts, allows the same problem to be solved, with fewer storage management and synchronization issues. For example, the Observer pattern, which is typically based on lists of pointers to observing objects, might be implemented using a pointer-free Publish-Subscribe pattern, which can provide better scalability and easier use of concurrency [13]. In general, pointers are not directly usable in distributed systems, so many of the algorithms adopted to solve problems in a distributed manner are naturally pointer-free, and hence are directly implementable in ParaSail. The Rust language [23] from Mozilla Research has adopted unique pointers for all inter-task communication, thereby eliminating all race conditions between tasks. Originally they intended to allow non-unique pointers for intra-task operations, but in more recent writings [31] they seem to be concluding that unique pointers can provide adequate flexibility, thus providing more evidence that fully general pointers are not needed even for complex data structure manipulations.

Pure functional languages, such as Haskell [18], avoid many of the issues of pointers by adopting immutable objects, meaning that sharing of data creates no aliasing or race condition problems. However, mostly functional languages, such as those derived from the ML language [11], include references to mutable objects, thereby reintroducing most of the potential issues with aliasing and race conditions. Even Haskell has found it necessary to introduce special monads such as the IO monad to support applications where side-effects are essential to the operation of the program. In such cases, these side-effects need to be managed in the context of parallel programming [19].

Hoare in his 1975 paper on Recursive Data Structures [12] identified many of the problems with general pointers, and proposed a notation for defining and manipulating recursive data structures without the use of pointers at the language level, even though pointers were expected to be used at the implementation level. Language-level syntax and semantics reminiscent of this early proposal have appeared in functional languages, but have not been widely followed in languages with mutable values. Mostly-functional languages such as ML have also more followed the Algol 68 model of explicit references when defining mutable recursive data structures, despite Hoare's many good arguments favoring a pointer-free semantics at the language level. Hoare's notation did not introduce the notion of optional values, but instead relied on types defined by a tagged union of generators, at least one of which was required to not be recursive. ParaSail adopts the optional value approach and allows the set of generators

that can be used to create objects to be open-ended, by relying on object-oriented polymorphism over interfaces.

Minimizing use of a global heap through the use of region-based storage management was proposed by Tofte and Talpin [29], implemented in the ML Kit with Regions [30], and refined further in the language Cyclone [10]. Cyclone was not a pointer-free language. Instead, every pointer was associated with a particular region at compile time, allowing compile-time detection of dangling references. A global, garbage-collected heap was available, but local dynamic regions provided a safe, more efficient alternative.

Many functional (or mostly functional) languages have a notion similar to ParaSail's optional objects. For example, in Haskell they are called *maybe* objects [18]. In ParaSail, because of its fundamental role in supporting recursive data structures, **optional** is a built-in property usable with every object, component, or type declaration, rather than being an additional level of type. In addition, this approach allows null-ness to be represented without a distinct null object, by ensuring that every type has at least one bit pattern than can be recognizable as a null value.

## Implementation Status and Evaluation

A version of the ParaSail front end and accompanying documentation is available for download [26]. The front end generates instructions for a ParaSail Virtual Machine (PSVM). A full multi-threaded interpreter for the PSVM instruction set is built into the front end, and includes a simple interactive Read-Eval-Print Loop for testing. A backend that translates from the PSVM instruction set to LLVM has been developed, along with a static analysis tool to allow the compiler to enforce preconditions, postconditions, and nullness checks at compile time.

The ParaSail front end automatically splits computations up into very light-weight picothreads, each representing a potentially parallel sub-computation. The PSVM includes special instructions for spawning and awaiting such picothreads. The PSVM run-time uses the work stealing model [4] to execute the picothreads; work stealing incorporates heavier weight server processes which each service their own queue of picothreads (in a LIFO manner), stealing from another server's queue (in a FIFO manner) only when their own queue becomes empty.

ParaSail adopted a pointer-free model initially to enable easy and safe pervasively parallel programming for potentially irregular computations. However, the ongoing experience in programming in ParaSail with its pointer-free, mutable value semantics, has provided support for the view that pointers are an unnecessary burden on object-oriented programming. The availability of optional values allows the direct representation of tree structures, singly-linked lists, hash tables, and so on in much the same way they are represented with pointers, but without the added complexities of analysis, storage management, and parallelization associated with pointers.

Data structures that require multiple paths to the same object, such as doubly-linked lists or general graphs, can be implemented without pointers by using indexing into generalized container structures. Even in languages without the restriction against

pointers, it is not uncommon to represent directed graphs using indices rather than pointers, in part because the presence or absence of edges between nodes does not necessarily affect whether the node itself should exist. An additional ad-vantage to using a container such as a vector to represent a graph, is that partitioning of the graph for the purpose of a parallel divide-and-conquer computation over the graph can be simplified, by using a simple numeric range test on the index to determine whether a given node is within the subgraph associated with a particular sub-computation. Operations on indices tend to be easier to analyze than those on pointers, including, for example, a proof that two variables contain different indices, as would be needed for a proof of non-aliasing when the indices are used to index into a container.

In our ongoing experiments, programmers familiar with Java or C# have not had trouble understanding and learning to pro-gram potentially irregular applications in ParaSail, thanks in part to its familiar class-and-interface object-oriented programming model. The notion of optional values matches quite directly how pointers work. The fact that assignment is by copy, and there is a separate move operation, is a bit of a surprise, but once explained it seems to make sense. The ease of parallel programming and the lack of problems involving undesired aliasing are seen by these ParaSail users as valuable benefits of the shift. Perhaps the bigger challenge for some is the lack of global variables in ParaSail. Eliminating global variables seems to require more restructuring than does doing without pointers. It would be possible to allow global concurrent objects in ParaSail without interfering with easy parallelization, but these would add complexity to the language and its analysis in other ways.

For our own use, we have written two major programs in ParaSail: a compiler "back end" that reads the PSVM representation of a ParaSail program and generates the corresponding LLVM [16] instructions, and a static analyzer ("Para-Scope") that does an advanced static analysis of ParaSail programs identifying all places where a precondition or postcondition might fail. These programs have confirmed the safety, flexibility, and convenience provided by pointer-free expandable objects and region-based storage management. In addition, the elimination of global variables and aliasing meant that these programs were trivial to parallelize, resulting in significant speed-ups when executed on multi-core processors because of the ability to concurrently compile or analyse the various operations that make up the typical ParaSail program. As an example, we ran the compiler back end on the 10k lines of code that comprise the ParaSail run time library, first using only a single core, and then second using all four virtual cores of a dual core hyper-threaded 2.5Ghz Intel i5 processor (averaged over two runs in each configuration):

Number of cores	Wall Clock Time	CPU Time	CPU Utilization
Single threaded	2:48	164 secs	99.5
Hyper-threaded Dual Core	1:31	290 secs	324

As can be seen, using multiple threads does incur CPU overhead, but it is more than made up by the parallelism, producing almost a two-times speed-up when going from single-threaded single core to hyper-threaded dual core. Note that "CPU Time" and "CPU Utilization" in the above effectively refers to hyper-thread time and hyper-thread utilization.

The static analyser is essentially a rewrite of a commercial static analyser written in Ada. As a simple comparison in expressivity, lines of code for the value propagation phase of these analysers were compared:

Implementation Language	Source Lines of Code
Ada	31029
ParaSail	9937

Note that this significant increase in expressivity is provided in a language with no global variables and no re-assignable pointers.

The primary purpose of our eliminating pointers remains the support of easy, pervasive parallelism without being limited to regular data-parallel computations. From that point of view, ParaSail is a good showcase. ParaSail programs, even those manipulating irregular data structures, produce a great deal of parallelism without the programmer having to make any significant effort. Almost any algorithm that is structured as a recursive walk of a tree, or as a divide and conquer algorithm such as a recursive Quicksort, will by default have its recursive calls treated as potentially parallel sub-computations. Monitoring built into the ParaSail interpreter indicates the level of parallelism achieved, and it can be substantial for algorithms not normally thought of as being embarrassingly parallel. We believe the implicit, safe, pervasive parallelism provided by Para-Sail is one of its unique contributions, and this relies on the simplifications made possible by the elimination of pointers and other sources of hidden aliasing.

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