Cyclic Program Synthesis

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Abstract

We describe the first approach to automatically synthesizing heap-manipulating programs with auxiliary recursive procedures. Such procedures occur routinely in data structure transformations (e.g., flattening a tree into a list) or traversals of composite structures (e.g., n-ary trees). Our approach, dubbed cyclic program synthesis, enhances deductive program synthesis with a novel application of cyclic proofs. Specifically, we observe that the machinery used to form cycles in cyclic proofs can be reused to systematically and efficiently abduce recursive auxiliary procedures.

We develop the theory of cyclic program synthesis by extending Synthetic Separation Logic (SSL), a logical framework for deductive synthesis of heap-manipulating programs from Separation Logic specifications. We implement our approach as a tool called Cypress, and showcase it by automatically synthesizing a number of programs manipulating linked data structures using recursive auxiliary procedures and mutual recursion, many of which were beyond the reach of existing program synthesis tools.


Keywords: Program Synthesis, Separation Logic, Cyclic Proofs

1 Introduction

Consider the task of flattening a binary tree into a linked list, which is typically solved by writing a recursive data traversal program. The promise of program synthesis is to automate such tedious data manipulation tasks by generating programs automatically from high-level, declarative specifications. Several recent synthesizers [1, 19, 27–29] are indeed capable of generating recursive programs given only the top-level description of their behavior. For example, SuSLik [29] can generate a provably correct, recursive C-like program that deallocates a binary tree given as input the following specification in Separation Logic (SL) [26, 34]:

\[
\{\text{tree}(x, s)\} \quad \text{treefree}(x) \quad \text{emp}\]

(1)

This specification says that initially the heap contains a binary tree rooted at address \(x\) with set of elements \(s\), and that after executing \(\text{treefree}\) the heap must be empty. Inspired by the success with \(\text{treefree}\), the programmer might try to synthesize tree flattening from the specification below:

\[
\{r \mapsto x \star \text{tree}(x, s)\} \quad \text{flatten}(r) \quad \{r \mapsto y \star \text{sll}(y, s)\}
\]

(2)

where \(\text{sll}\) describes a singly-linked list, and the location \(r\) initially stores the root of the input tree, and eventually the output list as computed by \(\text{flatten}\). Much to the programmer’s frustration, however, SuSLik fails to synthesize an implementation: it times out, without producing any useful output. In fact, given only the specification (2) or a similar one, and no additional hints, this example is out of reach for all other state-of-the-art synthesizers for recursive programs.

Challenge: recursive auxiliaries. This failure can be more readily understood when considering the expected solution. One such solution, depicted below, begins with two recursive calls which flatten the immediate subtrees of the input tree, obtaining two linked lists. Now, the synthesizer is at an impasse: how to combine the two lists to create the output list? This step requires an operation that \(\text{appends}\) lists, which is in itself a recursive program (and one which cannot be implemented by another call to \(\text{flatten}\), for example). This synthesis task illustrates a fundamental limitation of existing approaches to synthesis of recursion: tree flattening.
cannot be accomplished without a recursive auxiliary function. Existing synthesizers can generate flatten given the specification of append as a hint from the user [29]: using this auxiliary specification as a stepping stone, they can then generate code for both flatten and append as two synthesis tasks. It is, however, often non-trivial for the programmer to come up with this kind of hints.

Inferring auxiliary specifications automatically has been a long-standing open challenge in program synthesis. Since the hypothesis space is very large, simply allowing the synthesizer to conjecture any arbitrary auxiliary definition would be impractical, as that would make the search space explode. The state of the art is the work by Eguchi et al. [13], which attacks this problem in the context of functional programming by assuming a set of predefined recursion templates (e.g., a fold-right over lists). While syntactic templates help curb the search space explosion, they also limits the applicability of the technique, and in particular, preclude traversals of arbitrary user-defined data structures.

**Cyclic program synthesis.** We present a new synthesis technique, dubbed cyclic program synthesis, capable of automatically discovering recursive auxiliaries without the need for built-in templates or additional hints from the user. In particular, given the specification (2), our technique synthesizes a provably correct tree-flattening program, automatically discovering a recursive auxiliary that appends two lists.

Our technique draws inspiration from—and owes its name to—cyclic proofs, a powerful reasoning mechanism from the line of work on automated theorem proving [3, 9, 11, 25, 36, 37, 39]. In cyclic proofs, derivation "trees" can have backlinks from non-axiomatic leaves (called buds) to identical internal nodes (called companions). These backlinks enable an automation-friendly approach to proofs by induction: instead of conjecturing an induction hypothesis a-priori, the method exploits a similarity between a current goal and a companion goal elsewhere in the derivation, essentially turning the latter into an induction hypothesis on demand.

The key insight of this work is to apply the cyclic proof approach to automated deductive synthesis of recursive programs: instead of conjecturing auxiliary specifications a-priori, one can abduce them from the repeated goal patterns encountered during the main program derivation. For example, in flatten the synthesizer starts generating the code of append inline, and later recognizes that the program can be completed by extracting the code into a function and adding a recursive call.

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1 The choice of auxiliary is not unique, e.g. one may propose an auxiliary that uses a list accumulator.

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**Our contributions.** Realizing the idea of cyclic synthesis requires a carefully designed deductive system, in which the repeated goals observed in program derivations can be used to form backlinks. Our first contribution is the design of such a deductive system, which we dub Cyclic SSL (SSLaira). This system builds on top of Synthetic Separation Logic (SSL), the deductive synthesis framework underlying ScSLik [29]. SSLaira features a new set of rules for synthesizing procedure calls, incorporating an expressive trace-based termination checking mechanism from cyclic proofs [7, 8]. This mechanism enables SSLaira to derive a wider range of recursive programs, including programs with auxiliaries and non-structural recursion.

Our second contribution is an implementation of SSLaira in a new synthesis tool Cypress, which extends and subsumes ScSLik. The addition of cyclic reasoning requires an efficient mechanism for detecting potential companions for the current goal during search. Cypress achieves this via a call abduction oracle, which matches up goals that are not syntactically equal, adjusting them accordingly. Cypress also features more efficient theory reasoning via a mechanism we dub unification modulo theories, as well as new best-first proof search, guided by the size and shape of the goal.

We evaluated Cypress on 46 synthesis benchmarks. Our evaluation shows that Cypress is able to solve a number of challenging tasks requiring nested traversals of linked structures (e.g., sorting or de-duplicating a linked list) or traversals of mutually-recursive data structures (e.g., n-ary trees). To the best of our knowledge, these programs are beyond reach of any existing approaches to automated hint-free synthesis from declarative specifications.

**Paper outline.** The following sections provide a brief primer on synthesis via SSL, outlining this work’s innovations via a series of examples (Sec. 2); give a description of SSLaira and its meta-theory (Sec. 3); describe the synthesis algorithm (Sec. 4); and report on our evaluation (Sec. 5).

2 Cyclic Program Synthesis, by Example

This section presents the main ideas of Synthetic Separation Logic (SSL), followed by an overview of the scenarios enabled by our new rules and cyclic proofs principles. All code examples shown in this section are synthesized automatically using our novel synthesis tool Cypress.

2.1 Background: SSL and its Limitations

**Specifications.** Deductive synthesis based on SSL takes as input a pair of Hoare-style pre- and postconditions. For instance, recall the specification (1) for deallocating a tree:

```plaintext
{tree(x, s)} treefree(x) {emp}
```

Here the precondition `tree(x, s)` states that `treefree` may assume that it starts from a heap containing a binary tree rooted at address `x` with payload set `s`; the postcondition
emp states that treefree must guarantee that the heap is empty upon its termination.\footnote{This specification also implicitly guarantees that treefree always terminates and executes without memory errors (e.g., null-pointer dereferencing).} Note that the tree root \( x \) also appears as a parameter to treefree, and hence is a program variable, i.e., can be mentioned in the synthesized program; the payload \( s \), on the other hand, is a logical variable and must not appear in the program. In the rest of this section, we distinguish program variables from logical variables by using monotype font for the former.

In general, in a specification \( \{ P \} \ f(\ldots) \ \{ Q \} \), assertions \( P, Q \) have the form \( \varphi : P \), where the spatial part \( P \) describes the shape of the heap, while the pure part \( \varphi \) is a plain first-order formula that states the relations between variables (in (1) the trivial pure part true is omitted from both pre- and postcondition). For the spatial part, SSL employs the standard symbolic heap fragment of Separation Logic [26, 34]. Informally, a symbolic heap is a set of atomic formulas called heaplets joined with separating conjunction \( (\ast) \). The simplest kind of heaplet is a points-to assertion \( x \mapsto e \), which describes a single memory location with address \( x \) and payload \( e \). For example, the formula \( x \mapsto 5 \mapsto y \mapsto 10 \) describes a heap with two memory locations, \( x \) and \( y \), which store values 5 and 10, and are distinct, per the semantics of the \( \ast \) connective.

To capture linked data structures, such as lists and trees, SSL specifications make extensive use of inductive heap predicates, which are standard in Separation Logic. For instance, the tree predicate from (1) is inductively defined as follows:

\[
\text{tree}(x, s) \triangleq x = 0 \Rightarrow \{ s = 0; \text{emp} \} \\
| x \neq 0 \Rightarrow \{ s = \{ u \} \cup s_l \cup s_r ; \\
| \text{[x, 3]} \ast x \mapsto u \ast \langle x, 1 \rangle \mapsto l \ast \langle x, 2 \rangle \mapsto r \ast \\
\text{tree}(l, s_l) \ast \text{tree}(r, s_r) \}
\] (3)

This definition consists of two guarded clauses: the first one describes the empty tree (and applies when the root pointer \( x \) is null), and the second one describes a non-empty tree. In the second clause, a tree node is represented by a three-element record starting at address \( x \). The first field of the record stores the payload \( u \), while the other two store the addresses \( l \) and \( r \) of the left and right subtrees, correspondingly. Records are represented using a generalized form of the points-to assertion with an \( \text{offset} \): for example, the heaplet \( \langle x, 1 \rangle \mapsto l \) describes a memory location at the address \( x + 1 \). The block assertion \( [x, 3] \ast \) is an artifact of C-style memory management: it represents a memory block of size three at address \( x \) that has been dynamically allocated by \text{malloc} (and hence can be de-allocated by \text{free}). The two disjoint heaps \( \text{tree}(l, s_l) \) and \( \text{tree}(r, s_r) \) store the two subtrees. Finally, the pure part of the second clause indicates that the payload of the whole tree consist of \( u \) and the subtree payloads, \( s_l \) and \( s_r \).

**Deductive synthesis.** Given a pre-/postcondition pair \( P, Q \), deductive synthesis proceeds by constructing a derivation of the SSL judgment \( \{ P \} \ f(\ldots) \ \{ Q \} \ c \) for some program \( c \). Intuitively, this judgment has the same meaning as the Hoare triple \( \{ P \} \ c \ \{ Q \} \) (different syntax is used to emphasise that operationally the program \( c \) is “the output” rather than “the input”). The derivation is constructed by applying inference rules, a subset of which is presented in Fig. 1.

Inference rules gradually simplify the initial synthesis goal \( \{ P \} \ \{ Q \} \ c \), until symbolic heaps in both pre- and post-conditions are empty, at which point the terminal rule \text{Emp} concludes the derivation and “emits” a trivial program \text{skip}. The \text{Frame} rule reduces the synthesis goal to a smaller one by removing matching symbolic heaps in its pre- and post-condition. The \text{Free} rule eliminates a dynamically-allocated block of memory from the precondition by emitting a \text{free} statement. The rules \text{Read} and \text{Write} synthesize reads and writes of heap locations, correspondingly. The role of the \text{Write} rule is to “equalise” points-to heaplets that have the same address but different payloads, so that they can be subsequently “trimmed” by \text{Frame}. The role of the \text{Read} rule is to turn a logical variable \( a \) into a program variable \( y \), which might enable subsequent application of \text{Free} or \text{Write}. Note that reading from the heap always creates a fresh program variable (hence the \text{let} syntax), and variables, unlike heap locations, are never re-assigned.

To deal with inductive predicates, SSL features rules \text{Oren} and \text{Close} (elided from this overview), which unfold predicate definitions in the pre- and postcondition, respectively. Finally, the \text{Call} rule synthesizes a recursive call if some part of the current goal’s precondition matches the precondition \( P \) of the top-level, user-provided specification.

**Deriving treefree.** Let us illustrate how all those rules work in tandem to synthesize the implementation of treefree shown on the right from the specification (1).

We start by unfolding the definition of tree in the top-level goal \( \{ \text{tree}(x, s) \} \ \{ \text{emp} \} \), which generates two sub-goals (one for each clause of the predicate):

1. \text{void} \ treefree(x) 
2. \text{if} (x = 0) 
3. 1) \text{else} ( 
4. \text{let} l = x(x + 1); 
5. \text{let} r = x(x + 2); 
6. \text{free}(s); 
7. treefree(1); 
8. treefree(r); 
9. })

Figure 1. Selected SSL rules (simplified).
The programs \( c_1 \) and \( c_2 \) emitted by these subgoals will be conjoined via the statement if \( x = 0 \) \{ \( c_1 \) \} else \{ \( c_2 \) \}. The first subgoal (4) is trivially solved by the rule EMP, resulting in a program skip. In the second subgoal (5), the two grayed fragments enable two subsequent applications of the rule READ, adding two reads statements, from \( x + 1 \) and \( x + 2 \), correspondingly, creating two new program-level bindings, 1 and \( r \) and transforming the current goal into

\[
\{ x \neq 0; [x, s] \ast x \mapsto u \ast (x, 1) \mapsto f \ast (x, 2) \mapsto r \\
+ \text{tree}(l_1, s_1) + \text{tree}(r, s_r) \} \leadsto \{ \text{emp} \} \quad (6)
\]

The FREE rule now applies to the grayed fragment of the goal’s precondition, emitting free(\( x \)), and simplifying the synthesis goal to:

\[
\{ \ldots ; \text{tree}(l_1, s_1) + \text{tree}(r, s_r) \} \leadsto \{ \text{emp} \} \quad (7)
\]

To complete the synthesis, we notice that each of the two heaplets in the precondition matches the top-level specification (1), and hence can trigger the rule CALL, synthesizing a procedure call with a suitable argument.

**Limitations.** The CALL rule of SSL imposes significant limitations on the kinds of recursive functions it can derive. The first limitation is that it only allows using the top-level synthesis goal provided by the user as the specification for the callee; this precludes synthesis of recursive auxiliary functions, as required, for example, to flatten a tree into a list, as explained in the introduction.

A second, somewhat subtler limitation arises from the way SSL enforces termination of synthesized programs. To avoid generating trivial non-terminating solutions—such as \text{treefree}(x) immediately calling \text{treefree}(x) again—SSL restricts synthesized programs to be structurally recursive.\(^3\) More precisely, synthesis starts by picking a single inductive predicate in the precondition that the program will "recurse on", and only allows a recursive call once this predicate has been unfolded at least once. This limitation makes it impossible to synthesize programs with more complex recursion patterns: even something as simple as a (helper-free) function that deallocates two trees, as such a function would need to traverse both of those trees recursively in a single run.

In the remainder of this section we will demonstrate how SSL\(_{\lambda}\) overcomes both of these limitations by harnessing the cyclic proof methodology to enhance the CALL rule.

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\(^3\)Proof assistants like Coq [10] impose similar restrictions on recursion.
Sec. 2.1, with some evident parts of the goals elided. An important twist happens at the two inner derivation nodes corresponding to the premise of applying the rule Call. The goal in both nodes matches precisely the conclusion of the top-level application of Proc. These pairs of matching nodes create backlinks in the program derivation, connecting the premises of two Call applications to the top-level goal.

**Proving termination.** Cyclic reasoning is not valid in general: cyclic proofs must satisfy a well-formedness condition in order to preclude infinite derivations. Intuitively, one can view the derivation as a directed graph with edges pointing from conclusions to premises and from buds to companions. The well-formedness condition requires that along every infinite path in this graph, some well-founded measure decreases infinitely often [8]. In SSL<sub>Σ</sub>, infinite paths in the derivation correspond to potential infinite traces of the program’s execution. The well-formedness condition ensures that no such infinite executions exist since this would entail an infinitely decreasing chain in a well-founded set.

To trace well-founded measures, SSL<sub>Σ</sub> annotates inductive predicates with cardinality variables, which can be seen as sizes of the heap models of the corresponding predicate. We automatically instrument all predicate definitions with cardinality information; for example, the instrumentation of the tree predicate (3) is highlighted via gray boxes below:

\[
\text{tree-free(x) ≜ \{x \neq 0 \implies [s = \emptyset; \text{emp}] \}}
\]

Note the highlighted cardinality constraints we add to the second (recursive) clause, which state that cardinalities \(a_l\) and \(a_r\) of the the left and right subtrees are strictly smaller than \(a\), that of the enclosing tree. Given this instrumentation, the cardinality constraints end up in the goal’s precondition upon unfolding the predicate (via Open), as shown in Fig. 3.

To show that the derivation in Fig. 3 is well-formed, we must pick a sequence of cardinality variables to trace along each infinite path and prove that this sequence is strictly decreasing. All infinite paths in this derivation consist of arbitrarily alternating cycles (1) and (2). In each cycle, we will start by tracing \(a\), and then switch to either \(a_l\) or \(a_r\), depending on which cycle is being traversed. In either case, when we make the switch, the traced cardinality strictly decreases (following the cardinality constraints in the predicate definition), while elsewhere along the cycle is stays unchanged. Hence we have shown that along each infinite path the cardinality must strictly decrease infinitely often.

As prior work has shown [35], given cardinality constraints, the appropriate sequence of cardinalities to trace can be inferred automatically using automata-theoretic tools—an observation that is crucial for automating synthesis via SSL<sub>Σ</sub>. This mechanism subsumes termination measures based on maximum and/or lexicographic ordering of multiple arguments, and enable SSL<sub>Σ</sub> to synthesize non-structurally recursive programs, for example, one that deallocates two trees as part of the same traversal (see technical report [16]).

### 2.3 Synthesizing Auxiliary Recursive Functions

We now move on to the core of our contribution and illustrate how cyclic synthesis handles the motivating example from the introduction: the procedure that flattens a tree into a linked list, whose specification (2) we repeat for convenience:

\[
(r \mapsto x \ast \text{tree}(x, s)) \leadsto (r \mapsto y \ast \text{sll}(y, s))
\]

We omit the definition of the singly-linked list predicate sll, since it is standard for Separation Logic [34] and analogous to the tree predicate (3). The specification enforces that the payload set of the output list be the same as that of the input tree by using the same logical variable \(s\) in the pre- and postcondition. For the sake of brevity, we omit the set-related reasoning in the derivations shown below.

**Synthesized code.** The program synthesized from this specification is shown in Fig. 5. We have given more descriptive names (in lieu of automatically-generated ones) to local variables and the auxiliary function. The main procedure flatten calls itself recursively twice to produce the lists corresponding to the left and right subtrees of the node \(x\). The head of the first list, returned from the call in line 9 via \(r\), is then stored in \(y\), while the head of the second list is stored in \(r\) (through an extra level of indirection) after the call in line...
of this derivation is uneventful and quite similar to what we have already seen for treefree in Fig. 3: the two applications of CALL induce two backlinks (1) and (2) to the top-level goal and correspond to the recursive calls to flatten(r) in lines 9 and 12 of Fig. 5.

After these two calls, however, we find ourselves in the node (a) of the derivation\(^3\), with the following synthesis goal:

\[
\{ s = \{ v \} \cup s_l \cup s_r \mid r \mapsto y_r + \text{sl}(y_l, s_l) + \text{sl}(y_r, s_r) + \} \\
[x, 3] \times x \mapsto v \times (x, 1) \mapsto \_ \times (x, 2) \mapsto \_ \\
\rightharpoonup \{ r \mapsto y + \text{sl}(y, s) \}
\]

Here, we are given two lists, y\(_l\) and y\(_r\), and we need to obtain a single list y that contains all of their elements plus v. How should the synthesizer proceed to solve this goal? It proceeds just as one would for any goal that contains inductive predicates in the precondition: by unfolding one of their instances—in this case sl(y\(_l\), s\(_l\))—via Open. The recursive premise of Open is depicted in the derivation node (b), whose precondition again features two lists: one of them, y\(_r\), is the same as before, and the other one, n, is the tail of y\(_l\).

**Abducing the auxiliary.** At this point the synthesizer realizes that the CALL rule is applicable again; this time, however, the companion goal is not the top-level specification (2), but rather the goal (8) from node (a). Indeed, a sub-heap of the current precondition (the one containing everything but the head of y\(_l\)) can be unified with the precondition of (8) by substituting n for y\(_l\). In order to become an eligible companion, however, a node must emit a procedure call, which is clearly not the case for (a). To bridge this mismatch, the synthesizer retroactively inserts an application of Proc just below (a) and creates a new node (c) as its conclusion. The

\(^3\)Instead of passing x to append, it would have been more natural to dealocate it immediately in flatten. Although SSL\(_\cup\) is capable of deriving either program, our implementation makes the less natural choice, which we discuss further in Sec. 5.4.
new node has the same synthesis goal as \((a)\) and an identity call to a fresh procedure—here \(\text{append}(\_y, \_v, \_x, \_r)\)—as the emitted code.

This lazy application of \(\text{Proc}\) corresponds to abducing the recursive auxiliary on demand. The parameters of the new procedure are all the program variables of \((a)\); its pre- and postcondition are defined by \((\beta)\), the synthesis goal of \((a)\); finally, its body is the code emitted by \((a)\) (derived by the SSL\(_L\)) sub-derivation rooted at \((a)\).

**Termination.** As before, we perform a global well-formedness check on the entire derivation. Note, however, that in this case infinite paths can either follow some combination of backlinks \((1)\) and \((2)\) or always follow the backlink \((3)\); in other words, in the absence of mutual recursion, the termination arguments for the two procedures are entirely disjoint. Termination follows from the highlighted cardinality constraints: \([\alpha] < \bar{\alpha}, [\alpha\beta] < \bar{\alpha}\), and \([\beta] < [\beta]\).

### 2.4 More Examples

We conclude this section by outlining two examples that showcase unique capabilities of SSL\(_L\) and Cypress and go beyond the state of the art in synthesis with auxiliaries [13]. More details and synthesized code for these examples can be found in our technical report [16].

**Flattening a tree in-place.** Our first example leverages the imperative nature of our underlying language, allowing Cypress to flatten a binary tree into a doubly-linked list in-place: \(\text{flatten_to_dll(x)} \text{[dll(x, z, s)]}\). Note that here we require that the root of the input tree and the head of the output list be located at the same address \(x\). We omit the standard definition of the dll predicate, but note that in-place flattening is possible because both a tree node and a doubly-linked list node are represented as a three-element record, so one can be reinterpreted as the other.

**Mutual recursion.** Our final example shows the ability of Cypress to synthesize manipulations with mutually-recursive data structures. An \(n\)-ary tree, a.k.a. rose tree [23], can be implemented by storing the children of a tree node in a linked list. Its definition in Separation Logic uses a pair of mutually recursive predicates: \(r_{\text{treen}}\), representing a tree, and \(children\), representing a linked list of trees. Given these predicates and a specification \(\{r_{\text{treen}}(x, s)\} \rightarrow r_{\text{treen}}(x)\ \{\text{emp}\},

Cypress is able to generate a pair of mutually recursive functions that deallocate a rose tree.

### 3 Cyclic Program Synthesis, Formally

In this section, we give a formal presentation of declarative rules of SSL\(_L\) and describe the underlying metatheory.

#### 3.1 Programs and Assertions

**Programming language.** The target language of SSL\(_L\) is an imperative, C-like fragment with dynamic memory allocation, deallocation, store and load (Fig. 6, left). Values include at least booleans and integers, and a special type \(\text{loc}\) designates pointer variables. Pointers are isomorphic to unsigned integers, but there is only a single pointer constant, \(\_e\) (null). Expressions include at least variables, literal constants, equality check and logical connectives. Additional *theory-specific expressions* are allowed depending on the underlying theory used for checking entailment in derivations; our implementation supports linear integer arithmetic and sets. The language allows pointer arithmetic in the form \(x + i\), but other arithmetic operations are disabled for pointers.

The statement \(f(\overline{e})\) denotes a procedure call with actual parameters \(\overline{e}\). Procedures do not have a return value; the behavior of \(\text{return}\) is emulated by passing in an address of the heap location where the result should be stored. There are no variable re-assignments and no \(\text{while}\) loops. A program is a sequence of procedure definitions, followed by a statement.

**Assertion language.** The assertion language comprises pure assertions in the underlying theory, and SL assertions with inductively defined predicates (Fig. 6, right). Its semantics have been explored throughout Sec. 2. The set of pure logic terms \(\{\phi, \psi, \chi\}\) is a superset of program expressions \(e\). The logic is sorted, and pure parts (\(\phi\) in \(\{\phi; P\}\)) are ensured to be Boolean expressions via simple type checking. Predicate instances are annotated with cardinality variables \(\alpha\) and \(\beta\).

Assertions are interpreted in an environment \(\Gamma\) in which some of the variables are universally quantified and others existentially quantified, with a prefix of the form \(\forall \overline{G}. \exists \overline{J}\). Program variables are always included in the universal prefix. Logical variables are split between universal (also called *ghost* variables) and existential. We denote \(\text{Vars}(\Gamma) = \{\overline{G}, \overline{J}\}\) for all quantified variables, and \(\text{PV}(\Gamma) \land \overline{GV}(\Gamma) = \{\overline{G}\} \cup \overline{PV}, \overline{EV}(\Gamma) = \{\overline{J}\}\) for program variables, ghost variables and existentials of \(\Gamma\), respectively. We also use \(e[\Gamma]\) for the set of all

### Figure 6.

SSL\(_L\) programming language and assertion syntax.
expressions that can be constructed using $\text{PV}(\Gamma)$, and $\kappa[\Gamma]$—all logical terms that can be constructed with $\text{Vars}(\Gamma)$. When joining environments, the quantifier pattern is preserved, and we use the notation $\forall x.\exists y.\forall x'.\exists y'.\exists \chi; R$ with $x, x', y, y'$ disjoint. All variable sets $x, x', y, y'$ must be disjoint.

A clause $e \mapsto \exists y.\chi; R$ in a definition of a heap predicate $p''(\Gamma)$ consists of a selector expression $e$ and an assertion $\chi; R$. As explained in Sec. 2.2, the pure part $\chi$ contains a cardinality constraint of the form $\alpha < \kappa$ for each predicate instance $q''(\ldots)$ inside $R$. These are not part of the surface syntax, but are added automatically during pre-processing.

3.2 Proof Rules

Fig. 7 lists all synthesis-related SSL $\cup$ rules in a declarative manner. The rules operate on transforming entailment judgments $\Gamma; \mathcal{P} \rightarrow Q \mid c$, which informally means that any state that satisfies the assertion $\mathcal{P}$ can be transformed into some state that satisfies $Q$ by a statement $c$ [29]. Within rules, for clarity, we follow the convention of using lower latin letters $x, y$ for program variables, $e, t$ for program-level terms (of the syntactic class $e$ in Fig. 6), greek letters $\nu, \omega$ for logical variables, and $\phi, \psi, \chi$ for logical formulas. We will now describe the rules and their effects on the synthesis.

R0 Terminal rules.

The rules $\text{Emp}$ and $\text{Inconsistency}$ form the leaves of a derivation by emitting a $\text{skip}$ for a trivial goal or $\text{error}$ for a vacuous goal (unsatisfiable precondition). Here $\vdash \phi \Rightarrow \psi$ denotes entailment between pure formulas in the underlying theory; our implementation uses an SMT solver to discharge these premises.

R1 Rules for atomic operations.

Each of the pointer operations of the target language has a corresponding rule that describes when to emit it: $\text{Read}$ and $\text{Write}$ for memory access, $\text{Alloc}$ and $\text{Free}$ for dynamic memory management. These rules are more restricted versions of the corresponding symbolic execution rules of standard Separation Logic [5]; the additional restrictions are required to guide rule applications in the context of synthesis, where the program is not available. For example, the $\text{Write}$ rule uses the heaplet $(x, i) \mapsto e$ in the goal’s $\text{postcondition}$ to determine what should be written into the address $x$.

R2 Rules for inductive predicates.

The two rules Open and Close unfold definitions of inductive predicates in the pre- and the postcondition, respectively. These rules have dual effects on the program in the sense that Open eliminates a predicate instance and hence performs a case split on its clauses, while Close introduces an instance and hence picks a single clause non-deterministically. As a result, Close does not emit any code, while Open emits a conditional statement with one branch per clause, using clause selectors as guards.

R3 Rules for procedures.

These rules are the main innovation of SSL $\cup$ as compared with SSL. The rules Proc and Call were discussed in detail in Sec. 2.2. The rule Proc delineates procedure boundaries by emitting a call to a procedure whose body is emitted by its single premise.

Procedure calls are generated via the rule Call. It bundles together Separation Logic-style framing, with $R$ as the frame, and substitution of actual into formal parameters via $\sigma$, which is also applied to the postcondition $[\psi'; S]$. Existential variables in the procedure’s environment are remapped to fresh ghost variables in the second premise of the rule. Formal parameters $x_i$ are mapped to program expressions $e[\Gamma]$ using program variables of $\Gamma$, and ghosts $v_j$ are mapped to logical terms using any variables of $\Gamma$. 

```text
R0 Terminal rules
- Emp
  $\vdash \phi \Rightarrow \psi$
  $\Gamma; [\phi; \text{emp}] \rightarrow [\psi; \text{emp}] \text{skip}$
- Inconsistency
  $\vdash \phi \Rightarrow \bot$
  $\Gamma; [\phi; P] \rightarrow Q \text{error}$
```

```text
R1 Pointer operations
- Read
  $\Gamma; [\phi \land y = e; (x, i) \mapsto e + P] \Rightarrow Q \mid c\hspace{1cm}x \in \text{PV}\hspace{1cm}y \in \text{PV}\hspace{1cm}\text{Vars}(\Gamma)$
  $\Gamma; [\phi; (x, i) \mapsto e + P] \Rightarrow Q \mid \text{let } y = (x + i); c$
- Write
  $\Gamma; [\phi; (x, i) \mapsto e + P] \Rightarrow [\psi; (x, i) \mapsto e + Q] \mid c\hspace{1cm}\text{Vars}(e) \subseteq \text{PV}$
  $\Gamma; [\phi; (x, i) \mapsto e + P] \Rightarrow Q \mid (x + i) = e; c$
- Alloc
  $\Gamma; [\phi; [y, n] = \langle y, i \mapsto t \rangle; e] \Rightarrow [\psi; (x, i) \mapsto e_{\text{j}
\text{se}} + P] \Rightarrow Q \mid c\hspace{1cm}x \in \text{EV}(\Gamma)$
  $\Gamma; [\phi; P] \Rightarrow [\psi; [x, n] = \langle x, i \mapsto e \rangle_{\text{j}
\text{se}} + P] \Rightarrow Q \mid \text{let } y = \text{malloc}(n); c$
- Free
  $\Gamma; [\phi; P] \Rightarrow Q \mid c\hspace{1cm}x \in \text{PV}$
  $\Gamma; [\phi; [x, n] = \langle x, i \mapsto e \rangle_{\text{j}
\text{se}} + P] \Rightarrow Q \mid \text{free}(x); c$
```

```text
R2 Predicate unfolding
- Open
  $\Gamma \cup \exists \mathcal{P}_\mathcal{E}; \Gamma; [\phi \land e_j \land \chi_j; R_j; \mathcal{P}'] \Rightarrow Q \mid c_j\hspace{1cm}\text{for all } j = 1..r$
  $\mathcal{P}'(\Gamma); e_j \mapsto \exists \mathcal{P}_\mathcal{E}; \chi_j; R_j\mid c_j \in \Sigma\hspace{1cm}e_j \notin \text{Vars}(\Gamma)\hspace{1cm}\text{GV}(t_j) = \bot$
  $\Gamma; [\phi; \mathcal{P}'(\Gamma)] \Rightarrow Q \mid$ if $\sum (\mathcal{P}_\mathcal{E}; c_j)$ else if $\sum (\mathcal{P}_\mathcal{E}; c_j)$ else $\cdots$
- Close
  $\Gamma \cup \exists \mathcal{P}_\mathcal{E}; \Gamma; [\phi \land e_j \land \chi_j; R_j; \mathcal{P}'] \Rightarrow Q \mid c_j\hspace{1cm}\text{for some } j = 1..r$
  $\mathcal{P}'(\Gamma); e_j \mapsto \exists \mathcal{P}_\mathcal{E}; \chi_j; R_j\mid c_j \in \Sigma\hspace{1cm}e_j \notin \text{Vars}(\Gamma)$
  $\Gamma; \mathcal{P}' \Rightarrow [\phi; \mathcal{P}'(\Gamma)] \Rightarrow Q \mid c$
```

```text
R3 Procedures
- Proc
  $\Gamma; \mathcal{P} \Rightarrow Q \mid c\hspace{1cm}[\Gamma\mid \text{PV}(\Gamma)]$
  $\Gamma; \mathcal{P} \Rightarrow Q \mid f(\Gamma)$
- Call
  $\forall x, y.\exists \mathcal{P}; [\phi; P] \Rightarrow \exists \mathcal{P}; [\psi; S]\mid f(x, y)$
  $\Gamma \cup \forall \sigma(\mathcal{P}); [\psi; S] \Rightarrow \exists \mathcal{P}\mid \text{dom}(\sigma) = \{x, y, \text{var}\}$
  $\vdash \phi \Rightarrow [\psi; S]\sigma(x)\in \Sigma; \sigma(v)\in \{\Gamma\}$
  $\Gamma; [\phi; P \Rightarrow R \Rightarrow Q] \Rightarrow f(\sigma(x,e)); c$
- CallSetup
  $\Gamma; [\phi; P \Rightarrow Q] \Rightarrow \mathcal{C}_1\hspace{1cm}\Gamma \cup \text{BV}(\mathcal{C}_1); [\psi; S \Rightarrow R \Rightarrow Q] \Rightarrow f(\Gamma); c_2$
  $\Gamma; [\phi; P \Rightarrow Q] \Rightarrow \mathcal{C}_1\hspace{1cm}[\Gamma; [\psi; S \Rightarrow R \Rightarrow Q] \Rightarrow f(\Gamma); c_2]$
```

Figure 7. Synthesis rules of SSL $\cup$.
is required, consider the recursive call `flatten(r)` in line 9 of Fig. 5. To enable this call we first need to write the root of the left subtree `xi` into the return location `r`; but to trigger this write, we need to have `r \mapsto x_1` in the goal’s postcondition! `CALL SETUP` enables that: it performs `sequential decomposition` of the synthesis goal with the call’s precondition `ψ; S` as the intermediate state. As a result, `r \mapsto x_1` ends up in the postcondition of its first subgoal, triggering the synthesis of the write in line 8. Although the declarative presentation in Fig. 7 makes it look like the assertion `ψ; S` is chosen non-deterministically, in Sec. 4 we explain how `Cypress` implements this rule efficiently via a `call abduction oracle`.

**Logical rules.** The remainder of SSL\_\textsubscript{\textomega} rules are `logical rules`, which do not emit new code, but instead transform the goal in a way that would ultimately allow the application of other (operational) rules. Our logical rules are mostly standard for SL-based theorem provers [5], so we relegate them to the technical report [16] to save space. They include the `FRAME` rule we have seen in Sec. 2, as well as rules for pure reasoning, e.g. eliminating existentials. In Sec. 4 we discuss how `Cypress` implements such pure reasoning efficiently.

### 3.3 Cyclic Program Derivations

An SSL\_\textsubscript{\textomega} derivation is a tree consisting of goals `Γ; P \leadsto Q \mid c`, and constructed using the inference rules in Fig. 7. In contrast to the standard notion of a proof as a finite derivation tree, SSL\_\textsubscript{\textomega} derivations are permitted to be regular, non-well-founded (i.e., infinitely tall) trees. Regularity ensures that an SSL\_\textsubscript{\textomega} derivation tree always has a finite representation as a (possibly) cyclic graph. Concretely, we represent SSL\_\textsubscript{\textomega} derivations as finite trees, along with a set of `backlinks` connecting each non-terminal leaf node to a syntactically identical ancestor node. In other words, we allow goals from the middle of the proof to be used again as premises higher up the derivation tree. Formally, each backlink denotes the infinite unfolding of the path connecting the leaf—called `bud`—with its associated internal node—called `companion`.

We call SSL\_\textsubscript{\textomega} derivations `pre-proofs`, since they do not necessarily derive `terminating` programs. To ensure termination, we require that `pre-proofs` satisfy an additional global property, defined in terms of traces of cardinality variables.

**Definition 3.1** (Trace pairs). Let `G` and `G'` be, respectively, the conclusion and a premise of an inference rule `r`, and let `α` and `β` be cardinality variables occurring universally in `G` and `G'`, respectively. We say that `(α, β)` is a `trace pair` for `(G, G')` when: either `r` is `CALL` with substitution `σ`, `G'` is the left-hand premise, and `α = σ(β)`; or `r` \(\triangleleft ϕ \Rightarrow β ≤ α\) holds, where `ϕ` is the pure precondition of `G`. If `r` \(\triangleleft ϕ \Rightarrow β < α\) also holds, we say that the trace pair is `progressing`.

A `path` in a `pre-proof` `P` is a sequence `G_i (i ≥ 0)` of nodes in `P` such that each node `G_i` is the parent of `G_{i+1}` in the infinite derivation corresponding to `P`.

**Definition 3.2** (Traces). A `trace` is an infinite sequence `α_i (i ≥ 0)` of cardinality variables. We say that a trace follows a path `G_i (i ≥ 0)` in a `pre-proof` `P` when `(α_i, α_{i+1})` is a trace pair for `(G_i, G_{i+1})` for each `i ≥ 0`. When `(α_i, α_{i+1})` is progressing, we say that the trace `progresses` at `i`. A `trace` is called `infinitely progressing` if it progresses at infinitely many points.

**Definition 3.3** (Proofs). A `pre-proof` `P` is said to satisfy the global trace condition when every infinite path in `P` is followed by an infinitely progressing trace.

The global trace condition is an `ω-regular` property, so it is decidable when a `pre-proof` is a proof, cf. [9, Prop. 7.4]. We write `P \vdash G` when there is a `proof` deriving `G`.

### 3.4 Soundness

SSL\_\textsubscript{\textomega} inherits the memory model and operational semantics from traditional SL [5]. In the interest of space we only state the soundness theorem here. Its proof and the rest of the metatheory are relegated to the technical report [16].

**Theorem 3.4** (Soundness). If `Γ; P \leadsto Q \mid c`, then for any heap/stack pair `(h, s)` that satisfies `P`, there exists a heap/stack pair `(h', s')` that satisfies `Q`, such that executing `c` from state `(h, s)` terminates in state `(h', s')`.

### 4 Cyclic Program Synthesis, Pragmatically

We implemented cyclic program synthesis in a new synthesizer called `Cypress` [17]. `Cypress` takes as input a synthesis goal `\{P\} f (\mathcal{X}) \{Q\}` together with the definitions of all inductive predicates it mentions, and performs backtracking `proof search` for an SSL\_\textsubscript{\textomega} derivation of the judgment `P \leadsto Q \mid f (\mathcal{X})`. Once a proof has been constructed, `extracting` the synthesized program is straightforward: we simply consider each application of the `Proc` rule in isolation; each such application gives rise to a procedure, whose signature and body are the code emitted by the conclusion and the premise of `Proc`, respectively. For example, the two applications of `Proc` in Fig. 4 give rise to two procedures, `flatten` and `append`.

In the rest of this section we outline the mechanisms that make our proof search tractable. Since `Cypress` builds upon `SuSLik`—the original implementation of SL—we only focus on the new mechanisms, which make `Cypress` more general and/or more efficient than its predecessor. `Cypress` also leverages existing proof search features of `SuSLik`, such as early failure rules, phased proof search, and branch abduction (which enables it to synthesize conditionals beyond those in predicate selectors); we refer the reader to [29] for a detailed account of these features.

**Best-first search.** One difference in the overall search algorithm is that `Cypress` uses memoizing `best-first search` (inspired by [19]), instead of `SuSLik`’s naïve depth-first search. The search is guided by a cost function that assigns a cost to each heaplet in the goal’s pre- and postcondition, with predicate instances growing more expensive as they get unfolded.
Write with fresh existentials. The call abduction oracle only uses a pre-heap to understand how \( P \) comprises all existential substitutions from this derivation.

**Cypress**

To understand how \( P \) comprises all existential substitutions from this derivation.

- The oracle attempts to derive:
  
  \[ (\forall x. s \cup \{a\}) \leadsto (s \cup \{a\} \cup \{w\}) \]

  Figure 9. An example derivation with rules from Fig. 8.

**Termination checking.** Whenever the call abduction oracle succeeds, **Cypress** adds appropriate applications of \( \text{CALL} \) and \( \text{CALLSETUP} \), inserts an application of \( \text{Proc} \) below the companion candidate (using all its program variables as formal, and a fresh procedure name), and forms a backlink from the first premise of \( \text{CALL} \) to the conclusion of \( \text{Proc} \). Every time a backlink is formed, Cypress checks whether the pre-proof constructed so far satisfies the trace condition from Sec. 3.3. To this end, it builds a graph of the current pre-proof with edges labeled with all available trace pairs, according to Def. 3.1. It then invokes \( \text{Cyclist} \) [35], an off-the-shelf cyclic theorem prover, which uses an automata-theoretic algorithm to check whether every infinite path in the graph contains an infinitely progressing trace.

### 4.2 Pure Reasoning

Until now we have focused on synthesis rules, which directly emit code; the success of synthesis, however, also crucially relies on logical rules, which transform the goal into a form where synthesis rules can fire. Logical reasoning in SSL \( \cup \) is far from straightforward because it needs to support arbitrary \( \text{SMT} \)-decidable theories in its pure formulas.

To illustrate the challenges of pure reasoning, consider the following (simplified but representative) synthesis goal:

\[ \forall x, s, a. \exists w. (sll(x, s \cup \{a\})) \leadsto (sll(x, \{a\} \cup \{w\}) \] (9)

The simplest—and hence most desirable—solution to this goal is \( \text{skip} \), which informally can be obtained by simply framing away the \( sll \) heaplets; but formally, before \( \text{FRAME} \) can apply, we need to transform the post-height to be syntactically identical to the pre-height, which requires: (a) exploiting commutativity of set union, and (b) instantiating the existential \( w \) with \( s \). Fig. 8 shows two novel logical rules implemented in Cypress, which perform such transformations efficiently; Fig. 9 demonstrates how these rules work together to solve the synthesis goal (9) (we omit the emitted program \( \text{skip} \) and highlight new parts in each sub-goal for readability).

**Unification modulo theories.** The traditional approach to exploiting equational theories—such as commutativity of union in our example—is to eagerly normalize the goal after every proof step, by computing all implied equalities between its subterms [4]. For example, if a specification mentions both \( s \cup \{a\} \) and \( \{a\} \cup s \), normalization would replace one with the other. The normalization approach has two downsides: first, it is rather inefficient if you assume only blackbox access to the \( \text{SMT} \) solver; second, it does not help with the goal like (9), because here \( s \cup \{a\} = \{a\} \cup \)
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w is not a logical necessity, but rather a possibility, which happens to lead to the shortest solution. To circumvent these limitations, Cypress implements a new, lazy approach to equational reasoning via the rule Unify in Fig. 8, which we dub unification modulo theories. Unify looks for a pair of heaplets \([\sigma_1]R\) and \([\sigma_2]R\) in the pre- and postcondition that only differ in pure subterms, and speculatively unifies them, adding equalities between mismatched subterms, \(\sigma_1(v) = \sigma_2(v)\), as proofs obligation to the pure postcondition. In Fig. 9, Unify is used to unify the pre- and post-heaps of the goal (9), producing the proof obligation \(\sigma_1 \cup \{a\} = \{a\} \cup w\). Even in the absence of existentials, this approach is more efficient than eager normalization, because the SMT solver only needs to check equalities between terms that appear in matching positions inside a heaplet.

**Pure synthesis.** The other major challenge is to find appropriate instantiations for existential variables. To this end, Cypress includes the rule Solve-\(\exists\) in Fig. 8, which picks a substitution \(\sigma\) from existentials to universals that validates the pure specification. To find such a substitution, Cypress needs to solve the constraint \(\exists x. \phi \Rightarrow [\sigma]\phi\), which is itself a synthesis problem in the pure subset of our logic. Although such pure synthesis is generally a challenging task, it has been the subject of much prior work [2, 21, 32]. Cypress outsources pure synthesis queries to the CVC4 synthesizer [33].

5 Evaluation

We evaluated Cypress empirically along three axes: (1) *generality*: its ability to synthesize programs with complex recursion; (2) *efficiency*: the time it takes to synthesize programs; and (3) *utility*: the size of the input specification compared to the size of the generated programs, and the quality of generated programs.

5.1 Benchmarks and Setup

For our empirical evaluation we have assembled a suite of 46 synthesis benchmarks for pointer-manipulating programs. Each benchmark is defined by a top-level synthesis goal; recursion is expected, while the other two—flattening a tree

5.2 Results

Experiment results on the complex benchmarks are shown in Tab. 1, and on the simple benchmarks in Tab. 2. All specifications and generated code can be found in the technical report [16].

5.2.1 Generality. The results in Tab. 1 confirm that Cypress is able to synthesize a variety of functions with complex recursion. Benchmarks 10–13 were discussed in Sec. 2. Out of all benchmarks in Tab. 1, only 10 and 17 can be solved without auxiliaries, but they require a complex termination metric; interestingly, for 17—sorted list merge—Cypress generates an auxiliary anyway (see discussion in Sec. 5.3) All the other benchmarks require one or even two auxiliaries; for example, benchmark 14 flattens a rose tree into a list, and needs one auxiliary for flattening the list of children and another one for appending two lists (a flattened tree and a flattened list of children).

Finally, four of the synthesized programs feature mutual recursion. Two of them operate on rose trees, where mutual recursion is expected, while the other two—flattening a tree
Table 1. Benchmarks with complex recursion; all of these are out of reach for SuSlik. We report the number of Procedures generated, total number Stmt of statement in those procedures, the ratio Code/Spec of code to specification (in AST nodes), and the synthesis Time (in seconds).

<table>
<thead>
<tr>
<th>Group</th>
<th>Id</th>
<th>Description</th>
<th>Proc</th>
<th>Stmt</th>
<th>Code/Spec</th>
<th>Time</th>
</tr>
</thead>
<tbody>
<tr>
<td>Singly Linked List</td>
<td>1</td>
<td>deallocate two</td>
<td>2</td>
<td>9</td>
<td>6.2x</td>
<td>0.3</td>
</tr>
<tr>
<td></td>
<td>2</td>
<td>append three</td>
<td>2</td>
<td>14</td>
<td>2.3x</td>
<td>1.2</td>
</tr>
<tr>
<td></td>
<td>3</td>
<td>non-destructive append</td>
<td>2</td>
<td>21</td>
<td>3.0x</td>
<td>5.2</td>
</tr>
<tr>
<td></td>
<td>4</td>
<td>union</td>
<td>2</td>
<td>24</td>
<td>5.9x</td>
<td>9.6</td>
</tr>
<tr>
<td></td>
<td>5</td>
<td>intersection(^1)</td>
<td>3</td>
<td>33</td>
<td>7.3x</td>
<td>95.6</td>
</tr>
<tr>
<td></td>
<td>6</td>
<td>difference(^1)</td>
<td>2</td>
<td>22</td>
<td>5.5x</td>
<td>8.1</td>
</tr>
<tr>
<td></td>
<td>7</td>
<td>deduplicate(^1)</td>
<td>2</td>
<td>23</td>
<td>7.8x</td>
<td>6.2</td>
</tr>
<tr>
<td>List of Lists</td>
<td>8</td>
<td>deallocate</td>
<td>2</td>
<td>11</td>
<td>10.7x</td>
<td>0.3</td>
</tr>
<tr>
<td></td>
<td>9</td>
<td>flatten(^1)</td>
<td>2</td>
<td>19</td>
<td>4.8x</td>
<td>0.8</td>
</tr>
<tr>
<td>Binary Tree</td>
<td>10</td>
<td>deallocate two</td>
<td>1</td>
<td>16</td>
<td>11.8x</td>
<td>0.3</td>
</tr>
<tr>
<td></td>
<td>11</td>
<td>flatten</td>
<td>2</td>
<td>24</td>
<td>7.4x</td>
<td>1.5</td>
</tr>
<tr>
<td></td>
<td>12</td>
<td>flatten to dll in place</td>
<td>2(^7)</td>
<td>15</td>
<td>9.6x</td>
<td>2.7</td>
</tr>
<tr>
<td>Rose Tree</td>
<td>13</td>
<td>deallocate</td>
<td>2(^7)</td>
<td>9</td>
<td>12.0x</td>
<td>0.3</td>
</tr>
<tr>
<td></td>
<td>14</td>
<td>flatten</td>
<td>3(^7)</td>
<td>25</td>
<td>8.0x</td>
<td>12.6</td>
</tr>
<tr>
<td>Sorted list</td>
<td>15</td>
<td>reverse(^1)</td>
<td>2</td>
<td>11</td>
<td>3.3x</td>
<td>1.1</td>
</tr>
<tr>
<td></td>
<td>16</td>
<td>sort(^1)</td>
<td>2</td>
<td>12</td>
<td>3.6x</td>
<td>1.9</td>
</tr>
<tr>
<td></td>
<td>17</td>
<td>merge(^2)</td>
<td>2</td>
<td>23</td>
<td>2.2x</td>
<td>33.6</td>
</tr>
<tr>
<td>BST</td>
<td>18</td>
<td>from list(^1)</td>
<td>2</td>
<td>27</td>
<td>5.0x</td>
<td>11.5</td>
</tr>
<tr>
<td></td>
<td>19</td>
<td>to sorted list(^1)</td>
<td>2(^7)</td>
<td>35</td>
<td>6.4x</td>
<td>10.2</td>
</tr>
</tbody>
</table>

\(^1\) From [13] \(^2\) From [31] \(^3\) Mutually-recursive

into doubly-linked list (12) and flattening a binary search tree (BST) into a sorted list (19)—came as a surprise.

**Comparison with other tools.** Cypress was able to synthesize all eight selected benchmarks from [13]. Unlike their tool, Cypress does not use function templates as hints, and also targets pointer-manipulating programs instead of functional programs, which is arguably a harder problem. To the best of our knowledge, Cypress generates code with similar recursive structure to their tool: for example, list reversal, deduplication, and sorting all have the structure of two nested right-folds (and hence quadratic complexity); one exception is list intersection, discussed below, where Cypress generates an overly complex solution.

Cypress can also handle all 22 original SuSlik benchmarks (which are all part of the simple set). Finally, Cypress was also able to solve all 11 recursive benchmarks from ImpSynt [31] (one of which is in the complex set and the rest are in the simple set). Unlike ImpSynt, we do not require the user to provide program sketches, and additionally, our synthesis times on a commodity laptop are at least an order of magnitude faster than the run times reported in [31] on a server with 10 cores and 96GB of RAM.

On the other hand, SuSlik cannot handle any of the benchmarks in the complex set—because of complex recursion—and also fails on five benchmarks in the simple set. All five failures are due to restrictions on predicate unfolding, which SuSlik had to impose due to its ad-hoc termination checking mechanism, which in Cypress has been replaced with the more powerful cardinality-based mechanism from Sec. 3.3.

Table 2. Comparison with SuSlik on benchmarks with simple recursion. We report the number of statements Stmt and synthesis Time in seconds for both Cypress and SuSlik. Each benchmark generates a single procedure.

<table>
<thead>
<tr>
<th>Group</th>
<th>Id</th>
<th>Description</th>
<th>Stmt</th>
<th>Code/Spec</th>
<th>Time Cypress</th>
<th>Time SuSlik</th>
</tr>
</thead>
<tbody>
<tr>
<td>Integers</td>
<td>20</td>
<td>swap two(^1)</td>
<td>4</td>
<td>1.0x</td>
<td>0.2</td>
<td>&lt; 0.1</td>
</tr>
<tr>
<td></td>
<td>21</td>
<td>min of two(^3,4)</td>
<td>3</td>
<td>1.1x</td>
<td>1.5</td>
<td>0.4</td>
</tr>
<tr>
<td>Singly Linked List</td>
<td>22</td>
<td>length(^5,8)</td>
<td>6</td>
<td>1.2x</td>
<td>1.1</td>
<td>1.1</td>
</tr>
<tr>
<td></td>
<td>23</td>
<td>max(^3)</td>
<td>7</td>
<td>1.9x</td>
<td>0.7</td>
<td>0.7</td>
</tr>
<tr>
<td></td>
<td>24</td>
<td>min(^3)</td>
<td>7</td>
<td>1.9x</td>
<td>0.6</td>
<td>0.7</td>
</tr>
<tr>
<td></td>
<td>25</td>
<td>singleton(^3,4)</td>
<td>4</td>
<td>0.9x</td>
<td>0.3</td>
<td>&lt; 0.1</td>
</tr>
<tr>
<td></td>
<td>26</td>
<td>dispose(^3)</td>
<td>4</td>
<td>5.5x</td>
<td>0.2</td>
<td>&lt; 0.1</td>
</tr>
<tr>
<td></td>
<td>27</td>
<td>initialize(^3)</td>
<td>4</td>
<td>1.6x</td>
<td>0.6</td>
<td>0.1</td>
</tr>
<tr>
<td></td>
<td>28</td>
<td>copy(^3)</td>
<td>11</td>
<td>2.7x</td>
<td>0.8</td>
<td>0.3</td>
</tr>
<tr>
<td></td>
<td>29</td>
<td>append(^3,5)</td>
<td>6</td>
<td>1.1x</td>
<td>0.5</td>
<td>0.4</td>
</tr>
<tr>
<td></td>
<td>30</td>
<td>delete(^3,5)</td>
<td>12</td>
<td>2.6x</td>
<td>1.6</td>
<td>0.4</td>
</tr>
<tr>
<td>Sorted list</td>
<td>31</td>
<td>prepend(^2,3)</td>
<td>4</td>
<td>0.5x</td>
<td>0.3</td>
<td>0.2</td>
</tr>
<tr>
<td></td>
<td>32</td>
<td>insert(^2,3)</td>
<td>25</td>
<td>2.6x</td>
<td>4.4</td>
<td>5.2</td>
</tr>
<tr>
<td></td>
<td>33</td>
<td>insertion sort(^2,3)</td>
<td>7</td>
<td>1.0x</td>
<td>1.2</td>
<td>1.4</td>
</tr>
<tr>
<td>Tree</td>
<td>34</td>
<td>size(^3)</td>
<td>9</td>
<td>2.5x</td>
<td>0.7</td>
<td>0.3</td>
</tr>
<tr>
<td></td>
<td>35</td>
<td>dispose(^3)</td>
<td>6</td>
<td>8.0x</td>
<td>0.2</td>
<td>&lt; 0.1</td>
</tr>
<tr>
<td></td>
<td>36</td>
<td>copy(^3)</td>
<td>16</td>
<td>3.8x</td>
<td>2.8</td>
<td>0.7</td>
</tr>
<tr>
<td></td>
<td>37</td>
<td>flatten w/append(^3)</td>
<td>19</td>
<td>5.4x</td>
<td>0.4</td>
<td>0.7</td>
</tr>
<tr>
<td></td>
<td>38</td>
<td>flatten w/acc(^3)</td>
<td>12</td>
<td>2.1x</td>
<td>0.7</td>
<td>0.7</td>
</tr>
<tr>
<td>BST</td>
<td>39</td>
<td>insert(^2)</td>
<td>19</td>
<td>1.9x</td>
<td>9.8</td>
<td>36.9</td>
</tr>
<tr>
<td></td>
<td>40</td>
<td>rotate left(^2,3)</td>
<td>5</td>
<td>0.2x</td>
<td>6.2</td>
<td>23.9</td>
</tr>
<tr>
<td></td>
<td>41</td>
<td>rotate right(^2,3)</td>
<td>5</td>
<td>0.2x</td>
<td>4.8</td>
<td>9.1</td>
</tr>
<tr>
<td></td>
<td>42</td>
<td>delete root(^2)</td>
<td>29</td>
<td>1.7x</td>
<td>1304.3</td>
<td>-</td>
</tr>
<tr>
<td>Doubly Linked List</td>
<td>43</td>
<td>copy(^2)</td>
<td>22</td>
<td>4.3x</td>
<td>7.3</td>
<td>-</td>
</tr>
<tr>
<td></td>
<td>44</td>
<td>append(^5)</td>
<td>10</td>
<td>1.6x</td>
<td>2.3</td>
<td>-</td>
</tr>
<tr>
<td></td>
<td>45</td>
<td>delete(^5)</td>
<td>19</td>
<td>3.7x</td>
<td>4.7</td>
<td>-</td>
</tr>
<tr>
<td>Linked List</td>
<td>46</td>
<td>single to double</td>
<td>21</td>
<td>5.5x</td>
<td>1.3</td>
<td>-</td>
</tr>
</tbody>
</table>

\(^1\) From [31] \(^2\) From SuSlik \(^3\) From [32] \(^4\) From [22] \(^5\) From [30]

Although in principle ImpSynt is capable of solving complex benchmarks that require recursive auxiliaries using nested loops instead, none of the results reported in [31] contain nested loops, and in any case, ImpSynt relies on program sketches. To our knowledge, no existing synthesizer (for either functional or heap-manipulating programs) is able to generate mutually-recursive programs.

5.2.2 Efficiency. Our experiments show that Cypress is efficient in synthesizing a variety of programs: all 19 complex benchmarks were synthesized within two minutes, and all but two of them take less than fifteen seconds. Our comparison of Cypress with SuSlik on the simple benchmarks demonstrates that despite searching a larger space of programs, Cypress remains efficient. It is slightly slower on easy benchmarks: of the 18 benchmarks that take less than five seconds for SuSlik, the average time is 0.5 seconds for SuSlik compared to 0.8 seconds for Cypress; the remaining four hard benchmarks is where Cypress’s new search strategy pays off: the average time for those four benchmarks is 18.8 seconds for SuSlik and only 6.3 seconds for Cypress.

5.2.3 Utility. To quantify synthesis utility, we measured the ratio between the size of synthesized code and the input specification (taken as AST sizes). For all benchmarks from
the complex set, the generated code is larger than the specification by at least 2.2x (sorted list merge) and at most 12x (deallocate rose tree). This confirms our intuition that for simple, boilerplate data structure manipulations, like deallocation and copying, synthesis offers a good trade-off, since their specifications are very simple, while the code can be quite tricky. We only include pre- and postconditions in the specification size and omit predicate definitions, since those are reused between benchmarks. Anecdotally, the new benchmarks created for this paper were quick and easy to write: most predicate definitions were either reused from SsSLIK or were standard SL predicates. In both cases, the pre- and postconditions were very straightforward. Note that the code-to-spec ratios for the simple benchmarks are lower (between 0.2x and 8.0x), which serves as evidence that deductive synthesis for heap-manipulating programs delivers larger pay-off for complex traversals.

5.3 Notable Benchmarks

**Merge.** One benchmark where Cypress surprised us is merging two sorted lists (benchmark 17). We initially thought that this problem required an extension to the tool, because the traditional recursive implementation—without auxiliaries—has to unfold both input lists in order to compare their heads, but then fold one of the lists back again to pass it to the recursive call; this “folding back” is something that Cypress does not explicitly support. To our surprise, Cypress was instead able to solve this problem by inventing an auxiliary that merges two lists one of which is non-empty. This implementation is even slightly more efficient, since it eliminates a redundant emptiness check for one of the lists.

**Sort.** An important difference between the functional setting of [13] and our setting is that SL specifications give the user more fine-grained control over the relationship between input and output data structures in memory. For sorting (benchmark 16), we took the liberty of requiring the sort to be in-place, by using the following specification:

\[ \text{sll}(x, n, l, h) \sim \text{srll}(x, n, l, h) \]

Here sll is a list rooted at x with length n and lower and upper bounds on the elements l and h, and srll is a sorted list with the same parameters (notably, rooted at the same address x). Such in-place sorting is not expressible using refinement types from [13]. Given this specification—which contains no insight as to which algorithm to use to sort the list—Cy press synthesizes a rather peculiar version of in-place insertion sort: while traditionally insertion sort on linked lists performs insertion by switching next pointers, Cypress chose instead to do it by swapping elements in out-of-order list cells (similarly to a typical insertion sort on an array).

**Intersection.** Perhaps the most curious case is benchmark 5, which computes the intersection of two sets represented as linked lists with unique elements (denoted by the inductive predicate ul). The simplest specification for intersection is:

\[ \{ r \mapsto x * \text{ul}(x, s_1) * \text{ul}(y, s_2) \} \sim \{ r \mapsto z * \text{ul}(z, s_1 \cap s_2) \} \]

With this specification, however, Cypress fails to find a solution due to a limitation on the class of auxiliaries it can generate. Unlike the original functional setting, there is no simple, fold-like solution for this specification, because it is destructive: once it computes the intersection z’ of y and the tail of x, the list y is lost, and we cannot decide whether the head of x should be added to z’. A more sophisticated solution would require an auxiliary that tests membership, which is beyond the capabilities of cyclic synthesis.

To circumvent this issue, we added \(*\text{ul}(y, s_2)\) to the post-condition to preserve the input list y. Even with this change, however, Cypress fails to generate the simple solution with a single auxiliary (one that searches for the head of x in y, and if found, prepends it to z’), because doing so requires weakening of the auxiliary’s pure precondition, which cyclic synthesis currently does not support. Surprisingly, Cypress finds another solution, which uses a second auxiliary to append the head of x to z’ instead of prepending it. This solution is so unusual that we wondered if we found a soundness issue, until we checked it with an external program verifier: the solution is indeed correct (albeit inefficient), and both of the inferred auxiliary specifications are inductive.

5.4 Limitations

**When does Cypress fail?** The main limitation of SSL\(\land\) is that it can only derive a certain class of auxiliary functions. Intuitively, it can only extract auxiliary specifications from the goals in the main derivation, and cannot invent them “out of thin air”, so, for example, the auxiliary cannot take extra parameters or return a new data structure, which the main specification does not mention. For this reason, Cypress cannot synthesize linear-time implementations of list reversal or tree flattening, which would require conjecturing an extra accumulator parameter. As explained in Sec. 5.3, SSL\(\land\) also lacks support for generalizing the pure part of the auxiliary specification, which prevents it from deriving simpler version of set intersection. It is difficult to precisely characterize the class of synthesis problems that cyclic synthesis can and cannot solve, because, as illustrated above, it often finds alternative solutions that circumvent the limitations. Such characterization is an interesting direction for future work; another important and challenging direction is extending SSL\(\land\) with additional rules to support a wider class of programs, while continuing to strike a careful balance between expressiveness and tractability of proof search.

**Quality of solutions.** A Cypress solution might have suboptimal performance even if a more efficient program is derivable via SSL\(\land\). The core issue is that SSL\(\land\) has no means of analyzing program efficiency, and hence no reason to prefer a more efficient solution. A promising approach for producing efficient heap-manipulating would be to adopt a
flavor of Separation Logic with time credits [15], combining it with techniques for resource-aware synthesis for pure functional programs [20].

We also noticed that the division of code between the procedures in Cypress solutions is sometimes unnaturally: for example, the tree flattening program in Fig. 5 deallocates tree nodes inside the auxiliary append function instead of the main function; in terms of abstraction boundaries, it would be better if append were only concerned with appending lists and had no knowledge of tree nodes. The division of code depends on the order in which Cypress tries applying synthesis rules (in this case, the relative order of CALL and FREE); currently the order is optimized for efficiency of proof search rather than for optimal abstraction boundaries. We leave the investigation of improving program quality to future work.

Loop support. SSL_0 currently has no support for loops, which are often a more natural and efficient alternative to recursion in imperative programs. There are several existing techniques for deductive verification of loops using cyclic proofs [7, 43]; hence we believe the general cyclic synthesis technique could be extended to also handle them. To keep proof search tractable, however, we might not want to support both recursion and loops in our target language; a better idea might be to synthesize tail-recursive programs and then translate them into loops using standard techniques. The challenge, however, is that most tail-recursive programs require invented accumulator parameters (equivalently: most loops require temporary variables). Hence adding support for loops goes hand-in-hand with the extending the logic to support a wider class of auxiliaries.

6 Related Work

Deductive program synthesis. Our work on SSL_0 extends a line of research on synthesizing programs from logical specifications [22, 31, 38, 40, 44], and, in particular, on deductive synthesis [12, 19, 24, 28], which implements a search in the space of proofs of program correctness (rather than in the space of programs). Our work is the first to combine deductive synthesis with cyclic proof to generate provably correct and terminating programs with complex recursion patterns. Our technical contributions build primarily on the work by Polikarpova and Sergey [29], extending their logic SSL and the tool SuSLik with ideas from cyclic proofs. The first search algorithm for Cypress is inspired by the LeON system for deductive program verification, synthesis, and repair [18, 19], but tailored to Separation Logic.

Our work advances the state of the art for deductive synthesis tools with regard to establishing termination of synthesized programs. Specifically, it enables automated derivation of a termination argument along with the program being synthesized without being subject to restrictions of previous approaches: (1) requiring the user to provide an explicit termination measure [28]; (2) restricting the recursion to syntactic structural one [27, 29]; and (3) determining the termination measure by instantiating one of the pre-defined recursion/looping schemas [19, 31].

Synthesis of auxiliary functions. Eguchi et al. [13] implement a technique for automatically synthesizing implementations of pure functional programs with recursive helper functions from refinement types [45]. Their approach infers specifications for recursive helper functions by trying a number of predefined templates for the “main” function, which exercise different flavors of recursion (structural folds or divide-and-conquer) on the input data structures. Our work is complementary in that it considers imperative heap-manipulating programs, and also takes a fundamentally different proof-driven (rather than template-driven) approach to identify recursion patterns. By doing so, our technique removes the need to conjecture recursion principles upfront, yet it is capable of discovering many of those automatically, including non-trivial ones, such as traversals of a rose tree.

Several other techniques cannot synthesize recursive auxiliaries directly, but can synthesize nested folds [14] or nested loops [31, 38, 40]. Out of these techniques, $\lambda^2$ [14] is restricted to a set of predefined templates, and also provides no correctness guarantees beyond a finite set of input-output examples. Sketching-based approaches [31, 38, 40] are very flexible, but require the programmer to provide an extensive program sketch in order to make synthesis with nested loops tractable.

Cyclic proofs. The techniques and metatheory of cyclic proofs originates in the logic and proof theory community. Most related to our current work is the application of cyclic proof to reasoning about program correctness [7, 35, 43], as well as to proving pure entailments of Separation Logic with inductively defined predicates [6, 41, 42]. In particular, our use of cardinals with Separation Logic coincides with the approach used by Rowe and Brotherston [35].

7 Conclusion

We have demonstrated that cyclic proofs, already known as an automation-friendly method for reasoning about program termination, can also be an effective tool for automatically synthesizing programs with recursive auxiliary functions. By investigating this synergy between verification and synthesis, we have once again witnessed that the ideas developed by the logic community for scalable reasoning about heap-manipulating procedures can be instrumental in practical synthesis of correct-by-construction programs.

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