

A Logic of Reachable Patterns in Linked Data-Structures

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Abstract. We define a new decidable logic for expressing and checking invariants of programs that manipulate dynamically-allocated objects via pointers and destructive pointer updates. The main feature of this logic is the ability to limit the neighborhood of a node that is reachable via a regular expression from a designated node. The logic is closed under boolean operations (entailment, negation) and has a finite model property. The key technical result is the proof of decidability.

We show how to express precondition, postconditions, and loop invariants for some interesting programs. It is also possible to express properties such as disjointness of data-structures, and low-level heap mutations. Moreover, our logic can express properties of arbitrary data-structures and of an arbitrary number of pointer fields. The latter provides a way to naturally specify postconditions that relate the fields on entry to a procedure to the fields on exit. Therefore, it is possible to use the logic to automatically prove partial correctness of programs performing low-level heap mutations.

1 Introduction

The automatic verification of programs with dynamic memory allocation and pointer manipulation is a challenging problem. In fact, due to dynamic memory allocation and destructive updates of pointer-valued fields, the program memory can be of arbitrary size and structure. This requires the ability to reason about a potentially infinite number of memory (graph) structures, even for programming languages that have good capabilities for data abstraction. Usually abstract-datatype operations are implemented using loops, procedure calls, and sequences of low-level pointer manipulations; consequently, it is hard to prove that a data-structure invariant is reestablished once a sequence of operations is finished [19].

To tackle the verification problem of such complex programs, several approaches emerged in the last few years with different expressive powers and levels of automation, including works based on abstract interpretation [27, 34, 31], logic-based reasoning [23, 32], and automata-based techniques [24, 28, 5]. An important issue is the definition of a formalism that (1) allows us to express relevant properties (invariants) of various kinds of linked data-structures, and (2) has the closure and decidability features needed

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for automated verification. The aim of this paper is to study such a formalism based on logics over arbitrary graph structures, and to find a balance between expressiveness, decidability and complexity.

Reachability is a crucial notion for reasoning about linked data-structures. For instance, to establish that a memory configuration contains no garbage elements, we must show that every element is reachable from some program variable. Other examples of properties that involve reachability are (1) the acyclicity of data-structure fragments, i.e., every element reachable from node u cannot reach u , (2) the property that a data-structure traversal terminates, e.g., there is a path from a node to a sink-node of the data-structure, (3) the property that, for programs with procedure calls when references are passed as arguments, elements that are *not* reachable from a formal parameter are not modified.

A natural formalism to specify properties involving reachability is the first-order logic over graph structures with transitive closure. Unfortunately, even simple decidable fragments of first-order logic become undecidable when transitive closure is added [13, 21].

In this paper, we propose a logic that can be seen as a fragment of the first-order logic with transitive closure. Our logic is (1) simple and natural to use, (2) expressive enough to cover important properties of a wide class of arbitrary linked data-structures, and (3) allows for algorithmic modular verification using programmer's specified loop-invariants and procedure's specifications.

Alternatively, our logic can be seen as a propositional logic with atomic proposition modelling reachability between heap objects pointed-to by program variables and other heap objects with certain properties. The properties are specified using patterns that limit the neighborhood of an object. For example, in a doubly linked list, a pattern says that if an object v has an emanating `forward` pointer that leads to an object w , then w has a `backward` pointer into v .

The contributions of this paper can be summarized as follows:

- We define the *Logic of Reachable Patterns (LRP)* where reachability constraints such as those mentioned above can be used. Patterns in such constraints are defined by quantifier-free first-order formulas over graph structures and sets of access paths are defined by regular expressions.
- We show that *LRP* has a finite-model property, i.e., every satisfiable formula has a finite model. Therefore, invalid formulas are always falsified by a finite store.
- We prove that the logic *LRP* is, unfortunately, undecidable.
- We define a suitable restriction on the patterns leading to a fragment of *LRP* called *LRP₂*.
- We prove that the satisfiability (and validity) problem is decidable. The fragment *LRP₂* is the main technical result of the paper and the decidability proof is non-trivial. The main idea is to show that every satisfiable *LRP₂* formula is also satisfied by a tree-like graph. Thus, even though *LRP₂* expresses properties of arbitrary data-structures, because the logic is limited enough, a formula that is satisfied on an arbitrary graph is also satisfied on a tree-like graph. Therefore, it is possible to answer satisfiability (and validity) queries for *LRP₂* using a decision procedure for monadic second-order logic (MSO) on trees.

- We show that despite the restriction on patterns we introduce, the logic LRP_2 is still expressive enough for use in program verification: various important data-structures, and loop invariants concerning their manipulation, are in fact definable in LRP_2 .

The new logic LRP_2 forms a basis of the verification framework for programs with pointer manipulation [37], which has important advantages w.r.t. existing ones. For instance, in contrast to decidable logics that restrict the graphs of interest (such as monadic second-order logic on trees), our logic allows arbitrary graphs with an arbitrary number of fields. We show that this is very useful even for verifying programs that manipulate singly-linked lists in order to express postcondition and loop invariants that relate the input and the output state. Moreover, our logic strictly generalizes the decidable logic in [3], which inspired our work. Therefore, it can be shown that certain heap abstractions including [16, 33] can be expressed using LRP_2 formulas.

The rest of the paper is organized as follows: Section 2 defines the syntax and the semantics of LRP , and shows that it has a finite model property, and that LRP is undecidable; Section 3 defines the fragment LRP_2 , and demonstrates the expressiveness of LRP_2 on several examples; Section 4 describes the main ideas of the decidability proof for LRP_2 ; Section 5 discusses the limitations and the extensions of the new logics; finally, Section 6 discusses the related work. The full version of the paper [36] contains the formal definition of the semantics of LRP and proofs.

2 The LRP Logic

In this section, we define the syntax and the semantics of our logic. For simplicity, we explain the material in terms of expressing properties of heaps. However, our logic can actually model properties of arbitrary directed graphs. Still, the logic is powerful enough to express the property that a graph denotes a heap.

2.1 Syntax of LRP

LRP is a propositional logic over reachability constraints. That is, an LRP formula is a boolean combination of closed formulas in first-order logic with transitive closure that satisfy certain syntactic restrictions.

Let $\tau = \langle C, U, F \rangle$ denote a vocabulary, where (i) C is a finite set of constant symbols usually denoting designated objects in the heap, pointed to by program variables; (ii) U is a set of unary relation symbols denoting properties, e.g., color of a node in a Red-Black tree; (iii) F is a finite set of binary relation symbols (edges) usually denoting pointer fields.¹

A **term** t is either a variable or a constant $c \in C$. An **atomic formula** is an equality $t = t'$, a unary relation $u(t)$, or an edge formula $t \xrightarrow{f} t'$, where $f \in F$, and t, t' are terms. A **quantifier-free formula** $\psi(v_0, \dots, v_n)$ over τ and variables v_0, \dots, v_n is an arbitrary boolean combination of atomic formulas. Let $FV(\psi)$ denote the free variables of the formula ψ .

¹ We can also allow auxiliary constants and fields including abstract fields [8].

Definition 1. Let ψ be a conjunction of edge formulas of the form $v_i \xrightarrow{f} v_j$, where $f \in F$ and $0 \leq i, j \leq n$. The **Gaifman graph** of ψ , denoted by B_ψ , is an undirected graph with a vertex for each free variable of ψ . There is an arc between the vertices corresponding to v_i and v_j in B_ψ if and only if $(v_i \xrightarrow{f} v_j)$ appears in ψ , for some $f \in F$. The **distance** between logical variables v_i and v_j in the formula ψ is the minimal edge distance between the corresponding vertices v_i and v_j in B_ψ .

For example, for the formula $\psi = (v_0 \xrightarrow{f} v_1) \wedge (v_0 \xrightarrow{f} v_2)$ the distance between v_1 and v_2 in ψ is 2, and its underlying graph B_ψ looks like this: $v_1 - v_0 - v_2$.

Definition 2. (Syntax of LRP) A **neighborhood formula**: $N(v_0, \dots, v_n)$ is a conjunction of edge formulas of the form $v_i \xrightarrow{f} v_j$, where $f \in F$ and $0 \leq i, j \leq n$.

A **routing expression** is an extended regular expression, defined as follows:

$R ::= \emptyset$			
ϵ			empty set
\xrightarrow{f}	$f \in F$		forward along edge
\xleftarrow{f}	$f \in F$		backward along edge
u	$u \in U$		test if u holds
$\neg u$	$u \in U$		test if u does not hold
c	$c \in C$		test if c holds
$\neg c$	$c \in C$		test if c does not hold
$R_1.R_2$			concatenation
$R_1 R_2$			union
R^*			Kleene star

A routing expression can require that a path traverse some edges backwards. A routing expression has the ability to test presence and absence of certain unary relations and constants along the path.

A **reachability constraint** is a closed formula of the form:

$$\forall v_0, \dots, v_n. R(c, v_0) \Rightarrow (N(v_0, \dots, v_n) \Rightarrow \psi(v_0, \dots, v_n))$$

where $c \in C$ is a constant, R is a routing expression, N is a neighborhood formula, and ψ is an arbitrary quantifier-free formula, such that $FV(N) \subseteq \{v_0, \dots, v_n\}$ and $FV(\psi) \subseteq FV(N) \cup \{v_0\}$. In particular, if the neighborhood formula N is true (the empty conjunction), then ψ is a formula with a single free variable v_0 .

An **LRP formula** is a boolean combination of reachability constraints.

The subformula $N(v_0, \dots, v_n) \Rightarrow \psi(v_0, \dots, v_n)$ defines a **pattern**, denoted by $p(v_0)$. Here, the designated variable v_0 denotes a “central” node of the “neighborhood” reachable from c by following an R -path. Intuitively, neighborhood formula N binds the variables v_0, \dots, v_n to nodes that form a subgraph, and ψ defines more constraints on those nodes.²

² In all our examples, a neighborhood formula N used in a pattern is such that B_N (the Gaifman graph of N) is connected.

We use **let** expressions to specify the scope in which the pattern is declared:

$$\mathbf{let} \ p_1(v_0) \stackrel{\text{def}}{=} N_1(v_0, v_1, \dots, v_n) \Rightarrow \psi_1(v_0, \dots, v_n) \ \mathbf{in} \ \varphi$$

This allows us to write more concise formulas via sharing of patterns.

Shorthands. We use $c[R]p$ to denote a reachability constraint. Intuitively, the reachability constraint requires that every node that is reachable from c by following an R -path satisfy the pattern p .

We use $c_1[R]\neg c_2$ to denote $\mathbf{let} \ p(v_0) \stackrel{\text{def}}{=} (true \Rightarrow \neg(v_0 = c_2)) \ \mathbf{in} \ c_1[R]p$. In this simple case, the neighborhood is only the node assigned to v_0 . Intuitively, $c_1[R]\neg c_2$ means that the node labelled by constant c_2 is not reachable along an R -path from the node labelled by c_1 . We use $c_1\langle R \rangle c_2$ as a shorthand for $\neg(c_1[R]\neg c_2)$. Intuitively, $c_1\langle R \rangle c_2$ means that *there exists* an R -path from c_1 to c_2 . We use $c_1 = c_2$ to denote $c_1\langle \epsilon \rangle c_2$, and $c_1 \neq c_2$ to denote $\neg(c_1 = c_2)$. We use $c[R](p_1 \wedge p_2)$ to denote $(c[R]p_1) \wedge (c[R]p_2)$, when p_1 and p_2 agree on the central node variable. When two patterns are often used together, we introduce a name for their conjunction (instead of naming each one separately): $\mathbf{let} \ p(v_0) \stackrel{\text{def}}{=} (N_1 \Rightarrow \psi_1) \wedge (N_2 \Rightarrow \psi_2) \ \mathbf{in} \ \varphi$.

In routing expressions, we use Σ to denote $(\xrightarrow{f_1} \mid \xrightarrow{f_2} \mid \dots \mid \xrightarrow{f_m})$, the union of all the fields in F . For example, $c_1[\Sigma^*]\neg c_2$ means that c_2 is not reachable from c_1 by any path. Finally, we sometimes omit the concatenation operator “.” in routing expressions.

Semantics. An interpretation for an *LRP* formula over $\tau = \langle C, U, F \rangle$ is a labelled directed graph $G = \langle V^G, E^G, C^G, U^G \rangle$ where: (i) V^G is a set of nodes modelling the heap objects, (ii) $E^G: F \rightarrow \mathcal{P}(V^G \times V^G)$ are labelled edges, (iii) $C^G: C \rightarrow V^G$ provides interpretation of constants as unique labels on the nodes of the graph, and (iv) $U^G: U \rightarrow \mathcal{P}(V^G)$ maps unary relation symbols to the set of nodes in which they hold.

We say that node $v \in G$ is labelled with σ if $\sigma \in C$ and $v = C^G(\sigma)$ or $\sigma \in U$ and $v \in U^G(\sigma)$. In the rest of the paper, *graph* denotes a directed labelled graph, in which nodes are labelled by constant and unary relation symbols, and edges are labelled by binary relation symbols, as defined above.

We define a satisfaction relation \models between a graph G and *LRP* formula ($G \models \varphi$) similarly to the usual semantics the first-order logic with transitive closure over graphs (see [36]).

2.2 Properties of *LRP*

LRP with arbitrary patterns has a finite model property. If formula $\varphi \in \text{LRP}$ has an infinite model, each reachability constraint in φ that is satisfied by this model has a finite witness.

Theorem 1. (Finite Model Property): *Every satisfiable LRP formula is satisfiable by a finite graph.*

Sketch of Proof: We show that *LRP* can be translated into a fragment of an infinitary logic that has a finite model property. Observe that $c[R]p$ is equivalent to an infinite

conjunction of universal first-order sentences. Therefore, if G is a model of $c[R]p$ then every substructure of G is also its model. Dually, $\neg c[R]p$ is equivalent to an infinite disjunction of existential first-order sentences. Therefore, if G is a model of $\neg c[R]p$, then G has a finite substructure G' such that every substructure of G that contains G' is a model of $\neg c[R]p$. It follows that every satisfiable boolean combination of formulas of the form $c[R]p$ has a finite model. Thus, LRP has a finite model property.

The logic LRP is undecidable. The proof uses a reduction from the halting problem of a Turing machine.

Theorem 2. (Undecidability): *The satisfiability problem of LRP formulas is undecidable.*

Sketch of Proof: Given a Turing machine M , we construct a formula φ_M such that φ_M is satisfiable if and only if the execution of M eventually halts.

The idea is that each node in the graph that satisfies φ_M describes a cell of a tape in some configuration, with unary relation symbols encoding the symbol in each cell, the location of the head and the current state. The n -edges describe the sequence of cells in a configuration and a sequence of configurations. The b -edges describe how the cell is changed from one configuration to the next. The constant c_1 marks the node that describes the first cell of the tape in the first configuration, the constant c_2 marks the node that describes the first cell in the second configuration, and the constant c_3 marks the node that describes the last cell in the last configuration (see sketch in Fig. 1).

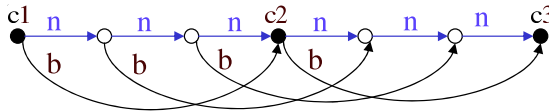


Fig. 1. Sketch of a model

The most interesting part of the formula φ_M ensures that all graphs that satisfy φ_M have a grid-like form. It states that for every node v that is n -reachable from c_1 , if there is a b -edge from v to u , then there is a b -edge from the n -successor of v to the n -successor of u :

$$\text{let } p(v) \stackrel{\text{def}}{=} (v \xrightarrow{b} u) \wedge (v \xrightarrow{n} v_1) \wedge (u \xrightarrow{n} u_1) \Rightarrow (v_1 \xrightarrow{b} u_1) \text{ in } c_1[(\xrightarrow{n})^*]p \quad (1)$$

Remark. The reduction uses only two binary relation symbols and a fixed number of unary relation symbols. It can be modified to show that the logic with three binary relation symbols (and no unary relations) is undecidable.

3 The LRP_2 Fragment and Its Usefulness

In this section we define the LRP_2 fragment of LRP , by syntactically restricting the patterns. The main idea is to limit the distance between the nodes in the pattern in certain situations.

Definition 3. A formula is in LRP_2 if in every reachability constraint $c[R]p$, with a pattern $p(v_0) \stackrel{\text{def}}{=} N(v_0, \dots, v_n) \Rightarrow \psi(v_0, \dots, v_n)$, ψ has one of the following forms:

- (**equality pattern**) ψ is an equality between variables $v_i = v_j$, where $0 \leq i, j \leq n$, and the distance between v_i and v_j in N is at most 2 (distance is defined in Def. 1),
- (**edge pattern**) ψ is of the form $v_i \xrightarrow{f} v_j$ where $f \in F$ and $0 \leq i, j \leq n$, and the distance between v_i and v_j in N is at most 1.
- (**negative pattern**) atomic formulas appear only negatively in ψ .

Remark. Note that formula (1), which is used in the proof of undecidability in Theorem 2, is not in LRP_2 , because p is an edge pattern with distance 3 between v_1 and u_1 , while LRP_2 allows edge patterns with distance at most 1.

3.1 Describing Linked Data-Structures

In this section, we show that LRP_2 can express properties of data-structures. Table 1 lists some useful patterns and their meanings. For example, the first pattern det_f means that there is at most one outgoing f -edge from a node. Another important pattern uns_f means that a node has at most one incoming f -edge. We use the subscript f to emphasize that this definition is parametric in f .

Well-formed Heaps. We assume that C (the set of constant symbols) contains a constant for each pointer variable in the program (denoted by x, y in our examples). Also, C contains a designated constant *null* that represents NULL values. Throughout the rest of the paper we assume that all the graphs denote well-formed heaps, i.e., the fields of all objects reachable from constants are deterministic, and dereferencing NULL yields *null*. In LRP_2 this is expressed by the formula:

$$\left(\bigwedge_{c \in C} \bigwedge_{f \in F} c[\Sigma^*]det_f \right) \wedge \left(\bigwedge_{f \in F} null \langle \xrightarrow{f} \rangle null \right) \quad (2)$$

Table 1. Useful pattern definitions ($f, b, g \in F$ are edge labels)

Pattern Name	Pattern Definition	Meaning
$det_f(v_0)$	$(v_0 \xrightarrow{f} v_1) \wedge (v_0 \xrightarrow{f} v_2) \Rightarrow (v_1 = v_2)$	f -edge from v_0 is deterministic
$uns_f(v_0)$	$(v_1 \xrightarrow{f} v_0) \wedge (v_2 \xrightarrow{f} v_0) \Rightarrow (v_1 = v_2)$	v_0 is not heap-shared by f -edges
$uns_{f,g}(v_0)$	$(v_1 \xrightarrow{f} v_0) \wedge (v_2 \xrightarrow{g} v_0) \Rightarrow false$	v_0 is not heap-shared by f -edge and g -edge
$inv_{f,b}(v_0)$	$(v_0 \xrightarrow{f} v_1 \Rightarrow v_1 \xrightarrow{b} v_0)$ $\wedge (v_0 \xrightarrow{b} v_1 \Rightarrow v_1 \xrightarrow{f} v_0)$	edges f and b form a doubly-linked list between v_0 and v_1
$same_{f,g}(v_0)$	$(v_0 \xrightarrow{f} v_1 \Rightarrow v_0 \xrightarrow{g} v_1)$ $\wedge (v_0 \xrightarrow{g} v_1 \Rightarrow v_0 \xrightarrow{f} v_1)$	edges f and g emanating from v_0 are parallel

Using the patterns in Table 1, Table 2 defines some interesting properties of data-structures using LRP_2 . The formula $reach_{x,f,y}$ means that the object pointed-to by the program variable y is reachable from the object pointed-to by the program variable x by following an access path of f field pointers. We can also use it with $null$ in the place of y . For example, the formula $reach_{x,f,null}$ describes a (possibly empty) linked-list pointed-to by x . Note that it implies that the list is acyclic, because $null$ is always a “sink” node in a well-formed heap. We can also express that there are no incoming f -edges into the list pointed to by x , by conjoining the previous formula with $unshared_{x,f}$. Alternatively, we can specify that x is located on a cycle of f -edges: $cyclic_{x,f}$. Disjointness can be expressed by the formula $disjoint_{x,f,y,g}$ that uses both forward and backward traversal of edges in the routing expression. For example, we can express that the linked list pointed to by x is disjoint from the linked-list pointed to by y , using the formula $disjoint_{x,f,y,f}$. Disjointness of data-structures is important for parallelization (e.g., see [17]).

Table 2. Properties of data-structures expressed in LRP_2

Name	Formula
$reach_{x,f,y}$	$x \langle (\overset{f}{\rightarrow})^* \rangle y$ the heap object pointed-to by y is reachable from the heap object pointed-to by x .
$cyclic_{x,f}$	$x \langle (\overset{f}{\rightarrow})^+ \rangle x$ cyclicity: the heap object pointed-to by x is located on a cycle.
$unshared_{x,f}$	$x [(\overset{f}{\rightarrow})^*] uns_f$ every heap object reachable from x by an f -path has at most one incoming f -edge.
$disjoint_{x,f,y,g}$	$x [(\overset{f}{\rightarrow})^* (\overset{g}{\leftarrow})^*] \neg y$ disjointness: there is no heap object that is reachable from x by an f -path and also reachable from y by a g -path.
$same_{x,f,g}$	$x [(\overset{f}{\rightarrow} \mid \overset{g}{\rightarrow})^*] same_{f,g}$ the f -path and the g -path from x are parallel, and traverse same objects.
$inverse_{x,f,b,y}$	$reach_{x,f,y} \wedge x [(\overset{f}{\rightarrow} \cdot \neg y)^*] inv_{f,b}$ doubly-linked lists between two variables x and y with f and b as forward and backward edges.
$tree_{root,r,l}$	$root [(\overset{l}{\rightarrow} \mid \overset{r}{\rightarrow})^*] (uns_{l,r} \wedge uns_l \wedge uns_r) \wedge \neg (root \langle (\overset{l}{\rightarrow} \mid \overset{r}{\rightarrow})^* \rangle root)$ tree rooted at $root$.

The last two examples in Table 2 specify data-structures with multiple fields. The formula $inverse_{x,f,b,y}$ describes a doubly-linked with variables x and y pointing to the head and the tail of the list, respectively. First, it guarantees the existence of an f -path. Next, it uses the pattern $inv_{f,b}$ to express that if there is an f -edge from one node to another, then there is a b -edge in the opposite direction. This pattern is applied to all nodes on the f -path that starts from x and that does not visit y , expressed using the test “ $\neg y$ ” in the routing expression. The formula $tree_{root,r,l}$ describes a binary tree. The first part requires that the nodes reachable from the root (by following any path of l and r fields) be not heap-shared. The second part prevents edges from pointing back to the root of the tree by forbidding the root to participate in a cycle.

3.2 Expressing Verification Conditions

The `reverse` procedure shown in Fig. 2 performs in-place reversal of a singly-linked list. This procedure is interesting because it destructively updates the list and requires two fields to express partial correctness. Moreover, it manipulates linked lists in which each list node can be pointed-to from the outside. In this section, we show that the verification conditions for the procedure `reverse` can be expressed in LRP_2 . If the verification conditions are valid, then the program is partially correct with respect to the specification. The validity of the verification conditions can be checked automatically because the logic LRP_2 is decidable, as shown in the next section. In [37], we show how to automatically generate verification conditions in LRP_2 for arbitrary procedures that are annotated with preconditions, postconditions, and loop invariants in LRP_2 .

```

Node reverse(Node x) {
  L0: Node y = NULL;
  L1: while (x != NULL) {
  L2:   Node t = x->n;
  L3:   x->n = y;
  L4:   y = x;
  L5:   x = t;
  L6: }
  L7: return y;
}

```

Fig. 2. Reverse

Notice that in this section we assume that all graphs denote valid stores, i.e., satisfy (2). The precondition requires that x point to an acyclic list, on entry to the procedure. We use the symbols x^0 and n^0 to record the values of the variable x and the n -field on entry to the procedure.

$$pre \stackrel{\text{def}}{=} x^0 \langle (\overset{n^0}{\rightarrow})^* \rangle null^0$$

The postcondition ensures that the result is an acyclic list pointed-to by y . Most importantly, it ensures that each edge of the original list is reversed in the returned list, which is expressed in a similar way to a doubly-linked list, using *inverse* formula. We use the relation symbols y^7 and n^7 to refer to the values on exit.

$$post \stackrel{\text{def}}{=} y^7 \langle (\overset{n^7}{\rightarrow})^* \rangle null^7 \wedge inverse_{x^0, n^0, n^7, y^7}$$

The loop invariant φ shown below relates the heap on entry to the procedure to the heap at the beginning of each loop iteration (label L1). First, we require that the part of the list reachable from x be the same as it was on entry to `reverse`. Second, the list reachable from y is reversed from its initial state. Finally, the only original edge outgoing of y is to x .

$$\varphi \stackrel{\text{def}}{=} same_{x^1, n^0, n^1} \wedge inverse_{x^0, n^0, n^1, y^1} \wedge x^0 \langle (\overset{n^0}{\rightarrow}) \rangle y^1$$

Note that the postcondition uses two binary relations, n^0 and n^7 , and also the loop invariant uses two binary relations, n^0 and n^1 . This illustrates that reasoning about singly-linked lists requires more than one binary relation.

The verification condition of `reverse` consists of two parts, VC_{loop} and VC , explained below.

The formula VC_{loop} expresses the fact that φ is indeed a loop invariant. To express it in our logic, we use several copies of the vocabulary, one for each program point. Different copies of the relation symbol n in the graph model values of the field n at different program points. Similarly, for constants. For example, Fig. 3 shows a graph that satisfies the formula VC_{loop} below. It models the heap at the end of some loop iteration of `reverse`. The superscripts of the symbol names denote the corresponding program points.

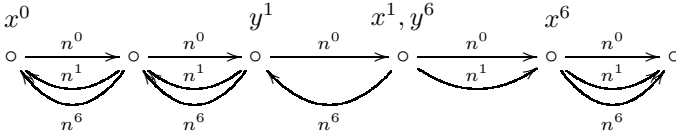


Fig. 3. An example graph that satisfies the VC_{loop} formula for `reverse`

To show that the loop invariant φ is maintained after executing the loop body, we assume that the loop condition and the loop invariant hold at the beginning of the iteration, and show that the loop body was executed without performing a null-dereference, and the loop invariant holds at the end of the loop body:

$$\begin{array}{ll}
 VC_{loop} \stackrel{\text{def}}{=} (x \neq null) & \text{loop is entered} \\
 \wedge \varphi & \text{loop invariant holds on loop head} \\
 \wedge (y^6 = x^1) \wedge x^1 \langle n^1 \rangle x^6 \wedge x^1 \langle n^6 \rangle y^1 & \text{loop body} \\
 \wedge \text{same}_{y^1, n^1, n^6} \wedge \text{same}_{x^1, n^1, n^6} & \text{rest of the heap remains unchanged} \\
 \Rightarrow (x^1 \neq null) & \text{no null-dereference in the body} \\
 \wedge \varphi^6 & \text{loop invariant after executing loop body}
 \end{array}$$

Here, φ^6 denotes the loop-invariant formula φ after executing the loop body (label L6), i.e., replacing all occurrences of x^1 , y^1 and n^1 in φ by x^6 , y^6 and n^6 , respectively. The formula VC_{loop} defines a relation between three states: on entry to the procedure, at the beginning of a loop iteration and at the end of a loop iteration.

The formula VC expresses the fact that if the precondition holds and the execution reaches procedure’s exit (i.e., the loop is not entered because the loop condition does not hold), the postcondition holds on exit: $VC \stackrel{\text{def}}{=} pre \wedge (x^1 = null) \Rightarrow post$.

4 Decidability of LRP_2

In this section, we show that LRP_2 is decidable for validity and satisfiability. Since LRP_2 is closed under negation, it is sufficient to show that it is decidable for satisfiability.

The satisfiability problem for LRP_2 is decidable. The proof proceeds as follows:

1. Every formula $\varphi \in LRP_2$ can be translated into an equi-satisfiable normal-form formula that is a disjunction of formulas in $CLRP_2$ (Def. 4 and Theorem 3). It is sufficient to show that the satisfiability of $CLRP_2$ is decidable.
2. Define a class of simple graphs \mathcal{A}_k , for which the Gaifman graph is a tree with at most k additional edges (Def. 5).
3. Show that if formula $\varphi \in CLRP_2$ has a model, φ has a model in \mathcal{A}_k , where k is linear in the size of the formula φ (Theorem 4). This is the main part of the proof.
4. Translate formula $\varphi \in CLRP_2$ into an equivalent MSO formula.
5. Show that the satisfiability of MSO logic over \mathcal{A}_k is decidable, by reduction to MSO on trees [30]. We could have also shown decidability using the fact that the tree width of all graphs in \mathcal{A}_k is bounded by k , and that MSO over graphs with bounded tree width is decidable [11, 1, 35].

Definition 4. (Normal-Form Formulas): A formula in $CLRP_2$ is a conjunction of reachability constraints of the form $c_1(R)c_2$ and $c[R]p$, where p is one of the patterns allowed in LRP_2 (Def. 3). A normal-form formula is a disjunction of $CLRP_2$ formulas.

Theorem 3. There is a computable translation from LRP_2 to a disjunction of formulas in $CLRP_2$ that preserves satisfiability.

Ayah Graphs. We define a notion of a simple tree-like directed graph, called Ayah graph.

Let $\mathcal{G}(S)$ denote the Gaifman graph of the graph S , i.e., an undirected graph obtained from S by removing node labels, edge labels, and edge directions (and parallel edges). The distance between nodes v_1 and v_2 in S is the number of edges on the shortest path between v_1 and v_2 in $\mathcal{G}(S)$. An undirected graph B is in T^k if removing self loops and at most k additional edges from B results in an acyclic graph.

Definition 5. For $k \geq 0$, an Ayah graph of k is a graph S for which the Gaifman graph is in T^k : $\mathcal{A}_k = \{S | \mathcal{G}(S) \in T^k\}$.

Let $\varphi \in CLRP_2$ be of the form $\varphi_\diamond \wedge \varphi_\square \wedge \varphi_= \wedge \varphi_\rightarrow$, where φ_\diamond is a conjunction of constraints of the form $c_1(R)c_2$, φ_\square is a conjunction of reachability constraints with negative patterns, $\varphi_=$ is a conjunction of reachability constraints with equality patterns, and φ_\rightarrow is a conjunction of reachability constraints with edge patterns.

Theorem 4. If $\varphi \in CLRP_2$ is satisfiable, then φ is satisfiable by a graph in \mathcal{A}_k , where $k = 2 \times n \times |C| \times m$, m is the number of constraints in φ_\diamond , $|C|$ is the number of constants in the vocabulary, and for every regular expression that appears in φ_\diamond there is an equivalent automaton with at most n states.

Sketch of Proof: Let S be a model of $\varphi : S \models \varphi$. We construct a graph S' from S and show that $S' \models \varphi$ and $S' \in \mathcal{A}_k$. The construction uses the following operations on graphs.

Witness Splitting. A witness W for a formula $c_1 \langle R \rangle c_2$ in $CLRP_2$ in a graph S is a path in S , labelled with a word $w \in L(R)$, from the node labelled with c_1 to the node labelled with c_2 . Note that the nodes and edges on a witness path for R need not be distinct. Using W , we construct a graph W' that consists of a path, labelled with w , that starts at the node labelled by c_1 and ends at the node labelled by c_2 . Intuitively, we duplicate a node of W each time the witness path for R traverses it, unless the node is marked with a constant. As a result, all shared nodes in W' are labelled with constants. Also, every cycle contains a node labelled with a constant. By construction, we get that $W' \models c_1 \langle R \rangle c_2$. We say that W' is the result of *splitting* the witness W .

Finally, we say that W is the *shortest witness* for $c_1 \langle R \rangle c_2$ if any other witness path for $c_1 \langle R \rangle c_2$ is at least as long as W . The result of splitting the shortest witness is a graph in \mathcal{A}_k , where $k = 2 \times n \times |C|$: to break all cycles it is sufficient to remove all the edges adjacent to nodes labelled with constants, and a node labelled with a constant is visited at most n times. (If a node is visited more than once in the same state of the automaton, the path can be shortened.)

Merge Operation. Merging two nodes in a graph is defined in the usual way by gluing these nodes. Let $p(v_0) \stackrel{\text{def}}{=} N(v_0, v_1, v_2) \Rightarrow (v_1 = v_2)$ be an equality pattern. If a graph violates a reachability constraint $c[R]p$, we can assign nodes n_0, n_1 , and n_2 to v_0, v_1 , and v_2 , respectively, such that there is a R -path from c to v_0 , $N(n_0, n_1, n_2)$ holds, and n_1 and n_2 are distinct nodes. In this case, we say that *merge operation of n_1 and n_2 is enabled* (by $c[R]p$). The nodes n_1 and n_2 can be merge to discharge this assignment (other merge operations might still be enabled after merging n_1 and n_2).

Edge-Addition Operation. Let $p(v_0) \stackrel{\text{def}}{=} N(v_0, v_1, v_2) \Rightarrow v_1 \xrightarrow{f} v_2$ be an edge pattern. If a graph violates a reachability constraint $c[R]p$, we can assign nodes n_0, n_1 , and n_2 to v_0, v_1 , and v_2 , respectively, such that there is a R -path from c to v_0 , $N(n_0, n_1, n_2)$ holds, and there is no f -edge from n_1 to n_2 . In this case, we say that *edge-operation operation is enabled* (by $c[R]p$). We can add an f -edge from n_1 and n_2 to discharge this assignment.

The following lemma is the key observation of this proof.

Lemma 1. *The class of \mathcal{A}_k graphs is closed under merge operations of nodes in distance at most two and edge-addition operations at distance one.*

Sketch of Proof: If an edge is added in parallel to an existing one (distance one), it does not affect the Gaifman graph, thus \mathcal{A}_k is closed under edge-addition. The proof that \mathcal{A}_k is closed under merge operations is more subtle [36].

In particular, the class \mathcal{A}_k is closed under the merge and edge-addition operations forced by LRP_2 formulas. This is the only place in our proof where we use the distance restriction of LRP_2 patterns.

Given a graph S that satisfies φ , we construct the graph S' as follows:

1. For each constraint i in φ_\diamond , identify the shortest witness W_i in S . Let W'_i be the result of splitting the witness W_i .
2. The graph S_0 is a union of all W'_i 's, in which the nodes labelled with the (syntactically) same constants are merged.

3. Apply all enabled merge operations and all enabled edge-addition operations in any order, producing a sequence of distinct graphs S_0, S_1, \dots, S_r , until S_m has no enabled operations.
4. The result $S' = S_r$.

The process described above terminates after a finite number of steps, because in each step either the number of nodes in the graph is decreased (by merge operations) or the number of edges is increased (by edge-addition operations).

The proof proceeds by induction on the process described above. Initially, S_0 is in \mathcal{A}_k . By Lemma 1, all S_i created in the third step of the construction above are in \mathcal{A}_k ; in particular, $S' \in \mathcal{A}_k$.

By construction of S_0 , it contains a witness for each constraint in φ_\diamond , and merge and edge-addition operations preserve the witnesses, thus S' satisfies φ_\diamond . Moreover, S_0 satisfies all constraints in φ_\square . We show that merge and edge-addition operations applied in the construction preserve φ_\square constraints, thus S' satisfies φ_\square . The process above terminates when no merge and edge-addition operations are enabled, that is, S' satisfies $\varphi_= \wedge \varphi_\rightarrow$. Thus, S' satisfies φ .

The full proof is available at [36].

4.1 Complexity

We proved decidability by reduction to MSO on trees, which allows us to decide LRP_2 formulas using MONA decision procedure [18]. Alternatively, a decision procedure for LRP_2 can directly construct a tree automaton from a normal-form formula, and can then check emptiness of the automaton. The worst case complexity of the satisfiability problem of LRP_2 formulas is at least doubly-exponential, but it remains elementary (in contrast to MSO on trees, which is non-elementary); we are investigating tighter upper and lower bounds. The complexity depends on the bound k of \mathcal{A}_k models, according to Theorem 4. If the routing expressions do not contain constant symbols, then the bound k does not depend on the routing expressions: it depends only on the number of reachability constraints of the form $c_1 \langle R \rangle c_2$. The LRP_2 formulas that come up in practice are well-structured, and we hope to achieve a reasonable performance.

5 Limitations and Further Extensions

Despite the fact that LRP_2 is useful, there are interesting program properties that cannot be expressed. For example, transitivity of a binary relation, that can be used, e.g., to express partial orders, is naturally expressible in LRP , but not in LRP_2 . Also, the property that a general graph is a tree in which each node has a pointer back to the root is expressible in LRP , but not in LRP_2 . Notice that the property is non-trivial because we are operating on general graphs, and not just trees. Operating on general graphs allows us to verify that the data-structure invariant is reestablished after a sequence of low-level mutations that temporarily violate the invariant data-structure.

There are of course interesting properties that are beyond LRP , such as the property that a general graph is a tree in which every leaf has a pointer to the root of a tree.

In the future, we plan to generalize LRP_2 while maintaining decidability, perhaps beyond LRP . We are encouraged by the fact that the proof of decidability in Section 4 holds “as is” for many useful extensions. For example, we can generalize the patterns to allow neighborhood formulas with disjunctions and negations of unary relations. In fact, more complex patterns can be used, as long as they do not violate the \mathcal{A}_k property. For example, we can define trees rooted at x with parent pointer b from every tree node to its parent by $tree_{x,r,l,b} \wedge \mathbf{let} p(v_0) \stackrel{\text{def}}{=} ((v_1 \xrightarrow{l} v_0) \vee (v_1 \xrightarrow{r} v_0)) \Rightarrow (v_0 \xrightarrow{b} v_1) \mathbf{in} x[(\xrightarrow{l} \mid \xrightarrow{r})^*](det_b \wedge p)$. The extended logic remains decidable, because the pattern p adds edges only in parallel to the existing ones.

Currently, reachability constraints describe paths that start from nodes labelled by constants. We can show that the logic remains decidable when reachability constraints are generalized to describe paths that start from any node that satisfies a quantifier-free *positive* formula θ : $\forall v, w_0, \dots, w_m, v_0, \dots, v_n. R(v, v_0) \wedge \theta(v, w_0, \dots, w_m) \Rightarrow (N(v_0, \dots, v_n) \Rightarrow \psi(v_0, \dots, v_n))$.

6 Related Work

There are several works on logic-based frameworks for reasoning about graph/heap structures. We mention here the ones which are, as far as we know, the closest to ours.

The logic LRP can be seen as a fragment of the first-order logic over graph structures with transitive closure (TC logic [20]). It is well known that TC is undecidable, and that this fact holds even when transitive closure is added to simple fragments of FO such as the decidable fragment L^2 of formulas with two variables [29, 15, 13].

It can be seen that our logics LRP and LRP_2 are both incomparable with $L^2 + TC$. Indeed, in LRP no alternation between universal and existential quantification is allowed. On the other hand, LRP_2 allows us to express patterns (e.g., heap sharing) that require more than two variables (see Table 1, Section 3).

In [3], decidable logic L_r (which can also be seen as a fragment of TC) is introduced. The logics LRP and LRP_2 generalize L_r , which is in fact the fragment of these logics where only two fixed patterns are allowed: equality to a program variable and heap sharing.

In [21, 2, 26, 4] other decidable logics are defined, but their expressive power is rather limited w.r.t. LRP_2 since they allow at most one binary relation symbol (modelling linked data-structures with 1-selector). For instance, the logic of [21] does not allow us to express the reversal of a list. Concerning the class of 1-selector linked data-structures, [6] provides a decision procedure for a logic with reachability constraints and arithmetical constraints on lengths of segments in the structure. It is not clear how the proposed techniques can be generalized to larger classes of graphs. Other decidable logics [7, 25] are restricted in the sharing patterns and the reachability they can describe.

Other works in the literature consider extensions of the first-order logic with fixpoint operators. Such an extension is again undecidable in general but the introduction of the notion of (loosely) guarded quantification allows one to obtain decidable fragments such as μGF (or μLGF) (Guarded Fragment with least and greater fixpoint operators) [14, 12]. Similarly to our logics, the logic μGF (and also μLGF) has the tree model property: every satisfiable formula has a model of bounded tree width. However,

guarded fixpoint logics are incomparable with LRP and LRP_2 . For instance, the LRP_2 pattern det_f that requires determinism of f -field, is not a (loosely) guarded formula.

The PALE system [28] uses an extension of the monadic second order logic on trees as a specification language. The considered linked data structures are those that can be defined as *graph types* [24]. Basically, they are graphs that can be defined as trees augmented by a set of edges defined using routing expressions (regular expressions) defining paths in the (undirected structure of the) tree. LRP_2 allows us to reason naturally about arbitrary graphs without limitation to tree-like structures. Moreover, as we show in Section 3, our logical framework allows us to express postconditions and loop invariants that relate the input and the output state. For instance, even in the case of singly-linked lists, our framework allows us to express properties that cannot be expressed in the PALE framework: in the list reversal example of Section 3, we show that the output list is precisely the reversed input list, whereas in the PALE approach, one can only establish that the output is a list that is the permutation of the input list.

In [22], we tried to employ a decision procedure for MSO on trees to reason about reachability. However, this places a heavy burden on the specifier to prove that the data-structures in the program can be simulated using trees. The current paper eliminated this burden by defining syntactic restrictions on the formulas and showing a general reduction theorem.

Other approaches in the literature use undecidable formalisms such as [17], which provides a natural and expressive language, but does not allow for automatic property checking.

Separation logic has been introduced recently as a formalism for reasoning about heap structures [32]. The general logic is undecidable [10] but there are few works showing decidable fragments [10, 4]. One of the fragments is propositional separation logic where quantification is forbidden [10, 9] and therefore seems to be incomparable with our logic. The fragment defined in [4] allows one to reason only about singly-linked lists with explicit sharing. In fact, the fragment considered in [4] can be translated to LRP_2 , and therefore, entailment problems as stated in [4] can be solved as implication problems in LRP_2 .

7 Conclusions

Defining decidable fragments of first order logic with transitive closure that are useful for program verification is a difficult task (e.g., [21]). In this paper, we demonstrated that this is possible by combining three principles: (i) allowing arbitrary boolean combinations of the reachability constraints, which are closed formulas without quantifier alternations, (ii) defining reachability using regular expressions denoting pointer access paths (not) reaching a certain pattern, and (iii) syntactically limiting the way patterns are formed. Extensions of the patterns that allow larger distances between nodes in the pattern either break our proof of decidability or are directly undecidable.

The decidability result presented in this paper improves the state-of-the-art significantly. In contrast to [21, 2, 26, 4], LRP allows several binary relations. This provides a natural way to (i) specify invariants for data-structures with multiple fields (e.g., trees, doubly-linked lists), (ii) specify post-condition for procedures that mutate pointer fields

of data-structures, by expressing the relationships between fields before and after the procedure (e.g., list reversal, which is beyond the scope of PALE), (iii) express verification conditions using a copy of the vocabulary for each program location.

We are encouraged by the expressiveness of this simple logic and plan to explore its usage for program verification and abstract interpretation.

References

1. S. Arnborg, J. Lagergren, and D. Seese. Easy problems for tree-decomposable graphs. *J. Algorithms*, 12(2):308–340, 1991.
2. I. Balaban, A. Pnueli, and L. D. Zuck. Shape analysis by predicate abstraction. In *VMCAI*, pages 164–180, 2005.
3. M. Benedikt, T. Reps, and M. Sagiv. A decidable logic for describing linked data structures. In *European Symp. On Programming*, pages 2–19, March 1999.
4. J. Berdine, C. Calcagno, and P. O’Hearn. A Decidable Fragment of Separation Logic. In *FSTTCS’04*. LNCS 3328, 2004.
5. A. Bouajjani, P. Habermehl, P.Moro, and T. Vojnar. Verifying Programs with Dynamic 1-Selector-Linked Structures in Regular Model Checking. In *Proc. of TACAS ’05*, volume 3440 of *LNCS*. Springer, 2005.
6. M. Bozga and R. Iosif. Quantitative Verification of Programs with Lists. In *VISSAS intern. workshop*. IOS Press, 2005.
7. M. Bozga, R. Iosif, and Y. Lakhnech. On logics of aliasing. In *Static Analysis Symp.*, pages 344–360, 2004.
8. L. Burdy, Y. Cheon, D. Cok, M. Ernst, J. Kiniry, G. T. Leavens, K. R. M. Leino, and E. Poll. An overview of jml tools and applications. *Int. J. on Software Tools for Technology Transfer*, 7(3):212–232, 2005.
9. C. Calcagno, P. Gardner, and M. Hague. From Separation Logic to First-Order Logic. In *FOSSACS’05*. LNCS 3441, 2005.
10. C. Calcagno, H. Yang, and P. O’Hearn. Computability and Complexity Results for a Spatial Assertion Language for Data Structures. In *FSTTCS’01*. LNCS 2245, 2001.
11. B. Courcelle. The monadic second-order logic of graphs, ii: Infinite graphs of bounded width. *Mathematical Systems Theory*, 21(4):187–221, 1989.
12. E. Grädel. Guarded fixed point logic and the monadic theory of trees. *Theoretical Computer Science*, 288:129–152, 2002.
13. E. Grädel, M.Otto, and E.Rosen. Undecidability results on two-variable logics. *Archive of Math. Logic*, 38:313–354, 1999.
14. E. Grädel and I. Walukiewicz. Guarded Fixed Point Logic. In *LICS’99*. IEEE, 1999.
15. E. Graedel, P. Kolaitis, and M. Vardi. On the decision problem for two variable logic. *Bulletin of Symbolic Logic*, 1997.
16. L. Hendren. *Parallelizing Programs with Recursive Data Structures*. PhD thesis, Cornell Univ., Ithaca, NY, Jan 1990.
17. L. Hendren, J. Hummel, and A. Nicolau. Abstractions for recursive pointer data structures: Improving the analysis and the transformation of imperative programs. In *SIGPLAN Conf. on Prog. Lang. Design and Impl.*, pages 249–260, New York, NY, June 1992. ACM Press.
18. J.G. Henriksen, J. Jensen, M. Jørgensen, N. Klarlund, B. Paige, T. Rauhe, and A. Sandholm. Mona: Monadic second-order logic in practice. In *TACAS*, 1995.
19. C.A.R. Hoare. Recursive data structures. *Int. J. of Comp. and Inf. Sci.*, 4(2):105–132, 1975.
20. N. Immerman. Languages that capture complexity classes. *SIAM Journal of Computing*, 16:760–778, 1987.

21. N. Immerman, A. Rabinovich, T. Reps, M. Sagiv, and G. Yorsh. The boundary between decidability and undecidability of transitive closure logics. In *CSL*, 2004.
22. N. Immerman, A. Rabinovich, T. Reps, M. Sagiv, and G. Yorsh. Verification via structure simulation. In *CAV*, 2004.
23. S. S. Ishtiaq and P. W. O'Hearn. Bi as an assertion language for mutable data structures. In *POPL*, pages 14–26, 2001.
24. N. Klarlund and M. I. Schwartzbach. Graph Types. In *POPL'93*. ACM, 1993.
25. V. Kuncak and M. Rinard. Generalized records and spatial conjunction in role logic. In *Static Analysis Symp.*, Verona, Italy, August 26–28 2004.
26. S. K. Lahiri and S. Qadeer. Verifying properties of well-founded linked lists. In *Symp. on Princ. of Prog. Lang.*, 2006. To appear.
27. T. Lev-Ami and M. Sagiv. TVLA: A system for implementing static analyses. In *Static Analysis Symp.*, pages 280–301, 2000.
28. A. Möller and M.I. Schwartzbach. The pointer assertion logic engine. In *SIGPLAN Conf. on Prog. Lang. Design and Impl.*, pages 221–231, 2001.
29. M. Mortimer. On languages with two variables. *Zeitschrift für Mathematische Logik und Grundlagen der Mathematik*, 21:135–140, 1975.
30. M. Rabin. Decidability of second-order theories and automata on infinite trees. *Trans. Amer. Math. Soc.*, 141:1–35, 1969.
31. T. Reps, M. Sagiv, and R. Wilhelm. Static program analysis via 3-valued logic. In *CAV*, pages 15–30, 2004.
32. J. C. Reynolds. Separation Logic: A Logic for Shared Mutable Data Structures. In *LICS'02*. IEEE, 2002.
33. M. Sagiv, T. Reps, and R. Wilhelm. Solving shape-analysis problems in languages with destructive updating. *ACM Transactions on Programming Languages and Systems*, 20(1): 1–50, January 1998.
34. M. Sagiv, T. Reps, and R. Wilhelm. Parametric shape analysis via 3-valued logic. *ACM Transactions on Programming Languages and Systems*, 2002.
35. D. Seese. Interpretability and tree automata: A simple way to solve algorithmic problems on graphs closely related to trees. In *Tree Automata and Languages*, pages 83–114. 1992.
36. G. Yorsh, M. Sagiv, A. Rabinovich, A. Bouajjani, and A. Meyer. A logic of reachable patterns in linked data-structures. Technical report, Tel Aviv University, 2005. Available at “www.cs.tau.ac.il/~gretay”.
37. G. Yorsh, M. Sagiv, A. Rabinovich, A. Bouajjani, and A. Meyer. Verification framework based on the logic of reachable patterns. In preparation, 2005.