DETERMINISTIC-RULE PROGRAMS ON SPECIALIZATION SYSTEMS

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ABSTRACT. In this paper, we formulate a class of deterministic programs, called deterministic-rule programs, on a specialization system, and formalize their procedural semantics, called the clause-model semantics, taking their recursive conditional state-transition structures into account. The proposed theory makes clear what it means for a deterministic-rule program to be correct with respect to a specification. It provides a basis for developing methods for synthesis of deterministic programs from declarative specifications. Taking a specialization system as a parameter, the theory is applicable to many concrete classes of deterministic-rule programs with various forms of data structures through parameter instantiation.

Keywords: Deterministic computation, Specialization system, Program synthesis, Query-answering problem, Equivalent transformation

1. **Introduction.** Program synthesis is concerned with the construction of a correct and efficient program from a given specification. A general class of specifications based on query-answering (QA) problems is considered in this paper. Given a specification, we want to construct a deterministic program that is correct with respect to it. Starting from an initial state constructed from an input query, a deterministic program uniquely determines a (finite or infinite) sequence of states, called a *computation*, and if the computation ends with a final state, an output value is obtained. A deterministic program is correct with respect to a specification iff for each query, the program yields a finite computation with an obtained output value being equal to the answer to the query defined by the specification.

We establish a class of deterministic programs that are suitable for program synthesis. A program in this class is called a deterministic-rule program (D-rule program). It is a sequence of deterministic rules (D-rules) for transformation of definite clauses, which are regarded as computation states. Application of D-rules is determined by pattern matching and their applicability condition, which together make them very expressive for computation control. We give a clear and elegant semantics, called the clause-model semantics, for D-rule programs, taking their recursive applicability-checking structures into consideration. Based on this semantics, the correctness of a D-rule program with respect to a specification is clearly defined. Since a specification can be represented using clauses, the clause-model semantics narrows the gaps between D-rule programs and specifications, thereby simplifying the difficulty of program synthesis.

The paper is organized as follows. After defining the class of specifications and that of program synthesis problems considered herein, Section 2 introduces the concept of a deterministic program in general and identifies the objective of the paper. Section 3 introduces D-rules by means of examples. Section 4 formulates D-rule programs on a specialization system. Section 5 describes computation states and computations of D-rule programs, and presents the clause-model semantics. Section 6 shows how D-rule programs are used for computing the answers to QA problems and illustrates program correctness and program synthesis on the space of D-rule programs. Section 7 summarizes the characteristics of the D-rule language and makes a comparison with Prolog [1], Guarded Horn Clause (GHC) [2], the nondeterministic-rule (N-rule) language [3], and imperative languages. Section 8 concludes the paper.

Preliminary Notation. The notation that follows holds thereafter. Given a set A, pow(A) denotes the power set of A and partialMap(A) the set of all partial mappings on A (i.e., from A to A). For any sets A and B, $f:A \to B$ denotes a partial mapping f from A to B and partialMap(A,B) the set of all partial mappings from A to B. For any partial mappings f and g, $f \circ g$ denotes the composition of f with g^1 . For any nonempty sequence \mathbf{s} , $first(\mathbf{s})$ denotes the first element of \mathbf{s} ; $last(\mathbf{s})$ denotes the last element of \mathbf{s} if \mathbf{s} is finite; and $rest(\mathbf{s})$ denotes the sequence obtained from \mathbf{s} by removing its first element. For any sequences \mathbf{s} and \mathbf{s}' , if \mathbf{s} is finite, $\mathbf{s} \cdot \mathbf{s}'$ denotes the concatenation of \mathbf{s} and \mathbf{s}' .

2. Program Synthesis Problems and Design of Deterministic Programs. First, the class of specifications and that of program synthesis problems considered in this paper are defined in Section 2.1. The concepts of a deterministic program, its computations, and its computed answers are given in Section 2.2. The objective of the paper is then identified in Section 2.3.

2.1. Specifications and program synthesis problems.

- 2.1.1. QA problems on definite clauses. A query-answering problem (QA problem) on definite clauses is a pair $\langle D, q \rangle$, where D is a set of definite clauses, representing background knowledge, and q is a user-defined atom, representing a query. The answer to a QA problem $\langle D, q \rangle$ is the set $\mathcal{M}(D) \cap rep(q)$, where $\mathcal{M}(D)$ is the least model of D and rep(q) is the set of all ground instances of q.
- 2.1.2. Specifications. A specification based on QA problems on definite clauses is a set of QA problems on definite clauses with common background knowledge, i.e., a set $\{\langle D, q \rangle \mid q \in Q\}$, where D is a set of definite clauses and Q is a set of query atoms. All specifications considered henceforth are specifications in this class.

A specification $\{\langle D, q \rangle \mid q \in Q\}$ is denoted by the pair $\langle D, Q \rangle$. Let \mathcal{G} denote the set of all ground atoms. A specification $S = \langle D, Q \rangle$ determines a mapping $answer_S : Q \to pow(\mathcal{G})$ such that for any $q \in Q$, $answer_S(q) = \mathcal{M}(D) \cap rep(q)$.

2.1.3. Program synthesis problems and program correctness. A program synthesis problem is to find in a given program space a program that is correct with respect to a given specification. A program P is correct with respect to a specification $S = \langle D, Q \rangle$ iff for any query atom $q \in Q$, (i) P returns an answer to the QA problem $\langle D, q \rangle$ in finite time and (ii) the returned answer coincides with $answer_S(q)$.

 $[\]overline{\ ^{1}f\circ g=\{\langle x,z\rangle\mid (\langle x,y\rangle\in g)\ \&\ (\langle y,z\rangle\in f)\}}.$

- 2.2. **Deterministic programs and computations.** A deterministic program P has the following characteristics:
 - 1. P is associated with a set STA of states, which includes a set INI of initial states and a set FIN of final states.
 - 2. P is deterministic, i.e., for any given initial state $st \in Ini$, P uniquely determines a (finite or infinite) sequence of states beginning with st, which is called a *computation* of P from st.
 - 3. A computation of P contains at most one final state, which can occur only as its last state.
 - 4. P determines a partial mapping $comp_P : Ini \rightarrow Fin$ as follows: let $st \in Ini$.
 - (a) If the computation of P from st reaches a final state $st' \in F$ IN in finite steps, then $comp_P(st) = st'$.
 - (b) If the computation of P from st ends in finite steps without reaching any final state in Fin, then $comp_P(st)$ is undefined.
 - (c) If the computation of P from st does not end in finite steps, then $comp_P(st)$ is undefined.

A set Q of query atoms is associated with a mapping $makeState_Q: Q \to INI$ for determining initial states from query atoms. Associated with FIN is a partial mapping $val: FIN \to pow(\mathcal{G})$ for determining answers obtained from final states. Given a set Q of query atoms, a deterministic program P determines a partial mapping $compute(P,Q): Q \to pow(\mathcal{G})$ by

$$compute(P,Q) = val \circ comp_P \circ makeState_Q.$$

The obtained partial mapping compute(P,Q) associates with query atoms in Q the answers computed using P.

Given a specification $S = \langle D, Q \rangle$, a deterministic program P is correct with respect to S iff $compute(P,Q)(q) = answer_S(q)$ for any $q \in Q$.

- 2.3. **Objective.** The objective of this paper is to design a program space \mathbb{P} that satisfies the following requirements:
 - 1. Each program in the space \mathbb{P} is deterministic.
 - 2. The program space \mathbb{P} has rich expressive power.
 - 3. For any program P in the space \mathbb{P} , the partial mapping $comp_P$ is clearly and elegantly defined.
 - 4. The space \mathbb{P} is suitable for program synthesis both practically and theoretically.

In this paper, we propose a program space \mathbb{P} that fulfills these requirements and make the partial mapping compute(P,Q) explicit for any program P in \mathbb{P} and any set Q of query atoms.

- 3. **D-Rules by Examples.** Next, D-rules are introduced by way of examples. For reasons of readability, D-rules in the domain of first-order terms are used.
- 3.1. Built-in atoms, built-in evaluators, and user-defined atoms. In a D-rule system, some atoms, including extralogical atoms, are used for specifying predefined operations, and are referred to as built-in atoms. Built-in atoms are evaluated by a predetermined built-in evaluator, and if the evaluation succeeds, it yields a substitution as a result. Examples of built-in atoms are equality atoms, i.e., atoms of the form =(t, t'), where t and t' are first-order terms. An equality atom represents a unification operation. If t and t' are unifiable, the evaluation of =(t, t') succeeds, with the resulting substitution being their most general unifier.

Atoms other than built-in atoms are considered as user-defined atoms. User-defined atoms are target atoms for rule application; they are evaluated through transformation of definite clauses by applying D-rules. In the examples that follow, atoms of the forms app(l,l',l''), toSet(l,l'), member(t,l), and occur(t,t') are user-defined atoms, where l,l',l'' are lists and t,t' are terms. They are intended to mean, respectively, "appending the list l' to the list l yields the list l'''', "l' is the list representing the set obtained from the list l by removing repeated elements", "the term t is an element of the list l''', and "the term t occurs in the term t'''.

3.2. Simple D-rules. Figure 1 shows two D-rules for rewriting app-atoms, where each variable begins with an asterisk. Their applicability is determined by pattern matching. As specified by its left side, the rule r_1 (respectively, r_2) matches any app-atom whose first argument is the empty list (respectively, a nonempty list). When applied, the rules r_1 and r_2 replace their target app-atoms with corresponding instances of atoms specified in their right sides. Table 1 illustrates transformation of definite clauses by application of these two rules and the built-in evaluator. The predicate ans stands for "answer" and the definite clause in the first row of the table is intended to mean "*A is the answer if it is the result of appending the list [3] to the list [1,2]". When the first atom in the body of a definite clause is an app-atom, it is rewritten using either r_1 or r_2 . When it is an equality atom, it is evaluated using the built-in evaluator. The label of the rule applied at each rule-application step is shown in the second column of the table. The letter 'e' in the same column indicates a transformation step resulting from built-in atom evaluation. The transformation changes the initial clause into the unit clause $ans([1,2,3]) \leftarrow$, which means "the list [1,2,3] is the answer unconditionally".

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r_1: app([], *Y, *Z) \longrightarrow =(*Y, *Z).

r_2: app([*a|*X], *Y, *Z) \longrightarrow =(*Z, [*a|*W]), app(*X, *Y, *W).
```

Figure 1. D-rule examples

Table 1. An example of a transformation sequence using the rules in Figure 1

Step	Rule	Definite clause
		$ans(*A) \leftarrow app([1,2],[3],*A)$
1	r_2	$ans(*A) \leftarrow = (*A, [1 *W1]), app([2], [3], *W1)$
2	e	$ans([1 *W1]) \leftarrow app([2], [3], *W1)$
3	r_2	$ans([1 *W1]) \leftarrow =(*W1, [2 *W2]), app([], [3], *W2)$
4	e	$ans([1,2 *W2]) \leftarrow app([],[3],*W2)$
5	r_1	$ans([1,2 *W2]) \leftarrow =([3],*W2)$
6	e	$ans([1,2,3]) \leftarrow$

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\begin{array}{ll} r_3\colon & toSet([],*Z) \longrightarrow = (*Z,[]). \\ r_4\colon & toSet([*a|*X],*Z), \{member(*a,*X)\} \longrightarrow toSet(*X,*Z). \\ r_5\colon & toSet([*a|*X],*Z) \longrightarrow = (*Z,[*a|*W]), toSet(*X,*W). \\ r_6\colon & member(*a,[*a|*X]) \longrightarrow . \\ r_7\colon & member(*a,[*b|*X]) \longrightarrow member(*a,*X). \end{array}
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Figure 2. D-rule examples

Step	Rule	Definite clause
'		$ans(*A) \leftarrow toSet([1, 2, 1], *A)$
1	r_4	$ans(*A) \leftarrow toSet([2,1],*A)$
2	r_5	$ans(*A) \leftarrow = (*A, [2 *W1]), toSet([1], *W1)$
3	e	$ans([2 *W1]) \leftarrow toSet([1], *W1)$
4	r_5	$ans([2 *W1]) \leftarrow =(*W1, [1 *W2]), toSet([], *W2)$
5	e	$ans([2,1 *W2]) \leftarrow toSet([],*W2)$
6	r_3	$ans([2,1 *W2]) \leftarrow =(*W2,[])$
7	е	$ans([2,1]) \leftarrow []$

Table 2. An example of a transformation sequence using the rules in Figure 2

TABLE 3. Checking whether r_4 is applicable at the first step in Table 2

Step	Rule	Definite clause			
		$toSet([2,1],*A) \leftarrow member(1,[2,1])$			
1	r_7	$toSet([2,1],*A) \leftarrow member(1,[1])$			
2	r_6	$toSet([2,1],*A) \leftarrow []$			

```
r_8: occur(*a, *a) \longrightarrow.

r_9: occur(*a, [*A|*B]), \{occur(*a, *A)\} \longrightarrow.

r_{10}: occur(*a, [*A|*B]) \longrightarrow occur(*a, *B).
```

Figure 3. D-rule examples

3.3. **D-rules with applicability conditions.** In addition to pattern matching, some applicability condition may be specified in order to confine a rule to being applicable to a more specific class of target atoms, enabling more specific atom replacement. Figure 2 shows D-rules for rewriting toSet-atoms and member-atoms. The rule r_4 has an applicability condition, i.e., $\{member(*a,*X)\}$, which indicated using a pair of curly braces in its left side. When its target-atom pattern, i.e., toSet([*a|*X],*Z), is instantiated into a body atom using a substitution θ , its corresponding instantiated applicability condition is checked, i.e., $member(*a\theta, *X\theta)$ is evaluated. A separate transformation sequence is constructed for the evaluation. Consider, for example, the definite clause in the first row of Table 2. To check whether r_4 is applicable to the body atom toSet([1,2,1],*A), the instantiated condition member(1,[2,1]) is evaluated using the transformation in Table 3. Since this transformation ends with a unit clause, indicating the success of the evaluation, r_4 is applied, resulting in the first transformation step in Table 2.

For each transformation step, a rule is selected deterministically: the applicabilities of rules are checked one-by-one in the rule appearance order and (only) the first applicable rule is selected. For example, to make the second transformation step in Table 2, the applicability of r_4 to the target atom toSet([2,1],*A) is checked first, i.e., member(2,[1]) is evaluated. Since the evaluation fails, the next rule, i.e., r_5 , which is applicable to the target atom, is used at that step.

3.4. **D-rules with recursive applicability conditions.** It is often natural to write a D-rule with a recursive applicability condition. Consider the D-rules for rewriting *occur*-atoms in Figure 3. The rule r_9 removes an atom of the form $occur(t_a, [t_A|t_B])$, where t_a, t_A, t_B are terms, if t_a occurs in t_A , i.e., if $occur(t_a, t_A)$ is satisfied. Table 4 illustrates a

Table 4. An example of a transformation sequence using the rules in Figure 3

Step	Rule	Definite clause
		$ans \leftarrow occur(1, [[2, 1, 0], [5, 4, 3]])$
1	r_9	$ans \leftarrow []$

Table 5. Checking whether r_9 is applicable at the first step in Table 4

Step	Rule	Definite clause
		$ans \leftarrow occur(1, [2, 1, 0])$
1	r_{10}	$ans \leftarrow occur(1, [1, 0])$
2	r_9	$ans \leftarrow []$

Table 6. A transformation failure

Step	Rule	Definite clause
		$ans \leftarrow occur(1,2)$
1	_	\perp

transformation sequence using the rules in Figure 3^2 . To determine whether r_9 is applicable to the body atom occur(1, [[2, 1, 0], [5, 4, 3]]), the condition occur(1, [2, 1, 0]) is checked, initiating the transformation sequence in Table 5. To make the first transformation step in Table 5, the applicability of r_9 to occur(1, [2, 1, 0]) is determined, i.e., the condition occur(1, 2) is checked recursively using the transformation sequence in Table 6. Since none of r_8 , r_9 , and r_{10} is applicable to occur(1, 2), the transformation in Table 6 fails, which is indicated by the symbol ' \bot '. The rule r_9 is thus not applicable at the first step in Table 5 and the next rule, i.e., r_{10} , is used at that step.

3.5. Passing values through applicability conditions. Evaluating an applicability condition may yield a substitution that instantiates body atoms, having the effect of passing a value to them. To illustrate, let us assume that (1) a calc-atom is a two-argument built-in atom that takes its first argument as an input for performing some calculation and outputs the calculation result as its second argument, and (2) a condatom is a one-argument built-in atom that tests whether its argument satisfies a certain condition. Now consider the following two rules:

$$calcCond(*x,*z), \{calc(*x,*y), cond(*y)\} \longrightarrow = (*z,*y).$$

 $calcCond(*x,*z) \longrightarrow = (*z,*x).$

Suppose that a target atom $calcCond(t_x, *z)$ is given, where t_x is a term representing an input. To transform this target atom, the applicability of the first rule to it is checked first, i.e., a value t_y is produced from t_x using a calc-atom and then the condition $cond(t_y)$ is evaluated. If the evaluation of $cond(t_y)$ succeeds, the first rule is applied, i.e., the target atom is replaced with the equality atom $=(*z,t_y)$. If the evaluation of $cond(t_y)$ fails, the second rule is used instead, by which the target atom is replaced with $=(*z,t_x)$.

Supposing that the first rule is applied, the value t_y is in turn passed to *z by the evaluation of the equality atom $=(*z, t_y)$. One may produce the same effect by changing the first rule into

$$calcCond(*x,*z), \{calc(*x,*y), cond(*y)\} \longrightarrow calc(*x,*z).$$

²When it takes no argument, an ans-atom means "true".

The application of this new rule does not pass the value t_y to its right side. Instead, it replaces the target atom with $calc(t_x,*z)$, the evaluation of which assigns the value t_y directly to *z. This alternative, however, requires two calc-atoms to be evaluated – one for rule applicability checking and another for instantiating *z – with their input arguments being the same. If the evaluation of a calc-atom takes high cost, the new rule is apparently less efficient.

- 4. **D-Rule Programs on Specialization Systems.** After recalling the notion of a specialization system in Section 4.1, we formulate on it a general class of D-rule programs in Section 4.2.
- 4.1. **Specialization systems.** The concept of a specialization system, introduced in [4], provides an axiomatic structure for studying the common interrelations between various forms of extended atoms and specialization operations on them. It provides a basis for a discussion of data structure extension [5] and for formulating declarative descriptions in many data domains, e.g., typed feature terms [6], conceptual graphs [7], and XML expressions [8]. A specialization system is recalled below.

Definition 4.1. A specialization system Γ is a quadruple $\langle \mathcal{A}, \mathcal{G}, \mathcal{S}, \mu \rangle$ of three sets $\mathcal{A}, \mathcal{G},$ and $\mathcal{S},$ and a mapping μ from \mathcal{S} to partialMap(\mathcal{A}) that satisfies the following conditions:

- 1. $(\forall s', s'' \in \mathcal{S})(\exists s \in \mathcal{S}) : \mu(s) = \mu(s') \circ \mu(s'')$.
- 2. $(\exists s \in \mathcal{S})(\forall a \in \mathcal{A}) : \mu(s)(a) = a$.
- 3. $\mathcal{G} \subseteq \mathcal{A}$.

Elements of \mathcal{A} , \mathcal{G} , and \mathcal{S} are called atoms, ground atoms, and specializations, respectively. The mapping μ is called the specialization operator of Γ . A specialization $s \in \mathcal{S}$ is said to be applicable to $a \in \mathcal{A}$ iff $a \in dom(\mu(s))$.

In the rest of this paper, assume that a specialization system $\Gamma = \langle \mathcal{A}, \mathcal{G}, \mathcal{S}, \mu \rangle$ is given. A specialization in \mathcal{S} is often denoted by a Greek letter such as θ . A specialization $\theta \in \mathcal{S}$ is often identified with the partial mapping $\mu(\theta)$ and used as a postfix unary (partial) operator on \mathcal{A} , e.g., $\mu(\theta)(a) = a\theta$, provided that no confusion is caused. Given an expression E containing occurrences of atoms in \mathcal{A} and $\theta \in \mathcal{S}$ such that θ is applicable to all those atoms, we write $E\theta$ to denote the expression obtained from E by replacing each atom $a \in \mathcal{A}$ that occurs in E with $a\theta$. Let ϵ denote the identity specialization in \mathcal{S} , i.e., $a\epsilon = a$ for any $a \in \mathcal{A}$. For any $\theta, \sigma \in \mathcal{S}$, let $\theta \circ \sigma$ denote a specialization $\rho \in \mathcal{S}$ such that $\mu(\rho) = \mu(\sigma) \circ \mu(\theta)$, i.e., $a(\theta \circ \sigma) = (a\theta)\sigma$ for any $a \in \mathcal{A}$.

A subset A' of \mathcal{A} is said to be *closed* iff for any $a \in A'$ and any $\theta \in \mathcal{S}$, and if θ is applicable to a, then $a\theta \in A'$.

4.2. **D-rule programs on specialization systems.** D-rules and D-rule programs on Γ are defined below. Assume that \mathcal{A}_B and \mathcal{A}_U are disjoint closed subsets of \mathcal{A} such that $\mathcal{A}_B \cup \mathcal{A}_U = \mathcal{A}$. Atoms in \mathcal{A}_B are regarded as built-in atoms, and those in \mathcal{A}_U as user-defined atoms.

A deterministic rule (for short, D-rule) r on Γ is an expression of the form

$$h, \{c_1, \ldots, c_m\} \longrightarrow b_1, \ldots, b_n,$$

where $h \in \mathcal{A}_{\mathrm{U}}$; $m, n \geq 0$; $c_i \in \mathcal{A}_{\mathrm{B}} \cup \mathcal{A}_{\mathrm{U}}$ for each $i \in \{1, \ldots, m\}$; and $b_j \in \mathcal{A}_{\mathrm{B}} \cup \mathcal{A}_{\mathrm{U}}$ for each $j \in \{1, \ldots, n\}$. The user-defined atom h is called the *head* of r, denoted by head(r). The sequences $[c_1, \ldots, c_m]$ and $[b_1, \ldots, b_n]$ are called the *applicability condition* of r, denoted by cond(r), and the body of r, denoted by body(r), respectively. The pair of braces on the left side of r does not indicate the set notation; the order of atoms in the applicability condition as well as the order of those in the body of r is important. When

m=0, the pair of braces on the left side of r is omitted. A specialization $\theta \in \mathcal{S}$ is said to be *applicable* to r iff θ is applicable to each atom occurring in r. Let $\mathsf{DRULE}(\Gamma)$ denote the set of all D-rules on Γ .

A deterministic-rule program (for short, D-rule program) on Γ is a finite sequence of D-rules on Γ .

- 5. Computations of a D-Rule Program and Clause-Model Semantics. First, a computation and a complete computation set are defined in Section 5.1. Applicability of D-rules to states with respect to a complete computation set is then defined in Section 5.2. The conditional state-transition structure of a D-rule program is described in Section 5.3. It is followed by a formalization of the clause-model semantics in Section 5.4.
- 5.1. States and computations. A clause-model state (for short, C-state) on Γ takes one of the following forms:
 - 1. $\langle (ans(as) \leftarrow gs), \rho \rangle$, where as and gs are finite sequences of atoms in \mathcal{A} and ρ is a specialization in \mathcal{S} .
 - 2. A special symbol \perp , which is called the *null C-state*.

An initial C-state on Γ is a C-state on Γ of the first form such that ρ is the identity specialization ϵ . A final C-state on Γ is either the null C-state (\bot) or a C-state on Γ of the first form such that gs is the empty sequence. Let STA, INI, and FIN be the set of all C-states, the set of all initial C-states, and the set of all final C-states, respectively, on Γ . When no confusion is caused, a C-state is simply called a state.

- **Definition 5.1.** A computation on STA is a nonempty sequence of states in STA. A computation on STA is said to be infinite if it is an infinite sequence, and it is said to be finite otherwise. A computation com on STA is said to be complete with respect to INI and FIN iff it satisfies the following conditions:
 - 1. $first(com) \in Ini.$
 - 2. If com is finite, then $last(com) \in Fin.$

Definition 5.2. A set M of computations on STA is deterministic iff for any com, $com' \in M$, if first(com) = first(com'), then com = com'.

Definition 5.3. A set M of computations on STA is complete with respect to INI and FIN iff the following conditions are satisfied:

- 1. For any computation com in M, com is complete with respect to Ini and Fin.
- 2. M is deterministic.

Let CMPCOMP(STA, INI, FIN) denote the set of all complete sets of computations on STA with respect to INI and FIN. ■

When no confusion is caused, CMPCOMP(STA, INI, FIN) is also written as CMPCOMP. Let a partial mapping $fin : \text{CMPCOMP} \times \text{INI} \to \text{FIN}$ be defined as follows: for any $M \in \text{CMPCOMP}$ and any $st \in \text{INI}$, if M contains a finite computation com such that first(com) = st and $last(com) \in \text{FIN}$, then fin(M, st) = last(com); otherwise it is undefined.

5.2. Applicability of D-rules with respect to a complete computation set. To apply a rule to a state, a pattern-matching specialization is determined. If no pattern matching is possible, the rule is not applicable. The determination of pattern-matching specializations is specified by a mapping

$$\mathbf{m}: (\mathrm{Drule}(\Gamma) \times (\mathrm{STA} - \mathrm{Fin})) \to (\mathcal{S} \cup \{\bot\})$$

such that for any rule $r \in DRULE(\Gamma)$ and any state $st = \langle (ans(as) \leftarrow gs), \rho \rangle \in STA - FIN$, if $\mathbf{m}(r, st)$ is a specialization, say θ , in \mathcal{S} , then

- 1. θ is applicable to r (i.e., it is applicable to head(r), cond(r), and body(r)), and
- 2. $head(r)\theta = first(gs)$.

Intuitively, given a D-rule r and a state $st = \langle (ans(as) \leftarrow gs), \rho \rangle \in STA - FIN$,

- if $\mathbf{m}(r, st)$ is a specialization $\theta \in \mathcal{S}$, then head(r) is matched with first(gs) by θ and the applicability of r to st will be checked further by considering $cond(r)\theta$; and
- if $\mathbf{m}(r, st) = \bot$, then r is not applied.

Now let M be a complete set of computations and $st \in STA - FIN$. Applicability and non-applicability of a D-rule to st with respect to M are defined as follows:

Definition 5.4. A D-rule r is applicable to st with respect to M iff $\mathbf{m}(r, st)$ is a specialization, say θ , in S and M contains a finite computation com such that

- 1. $first(com) = \langle (ans(body(r)\theta) \leftarrow cond(r)\theta), \epsilon \rangle \in INI, and$
- 2. $last(com) = \langle (ans(body(r)\theta\sigma) \leftarrow []), \sigma \rangle \in Fin \ for \ some \ specialization \ \sigma \in \mathcal{S}.$

The specialization σ in Condition 2 above is unique if it exists, and is referred to as spec(r, st, M).

Definition 5.5. A D-rule r is non-applicable to st with respect to M iff either (i) $\mathbf{m}(r,st) = \bot$ or (ii) $\mathbf{m}(r,st)$ is a specialization, say θ , in S and M contains a finite computation com such that

- 1. $first(com) = \langle (ans(body(r)\theta) \leftarrow cond(r)\theta), \epsilon \rangle \in INI, and$
- 2. $last(com) = \bot$.
- It follows directly that:

Proposition 5.1. Let r be a D-rule, $st \in Sta - Fin$, and $M, M' \in CMPCOMP$ such that $M \subseteq M'$. If r is applicable to st with respect to M, then r is applicable to st with respect to M'. If r is non-applicable to st with respect to M, then r is non-applicable to st with respect to M'.

5.3. Successor states with respect to a complete computation set. Given a complete set M of computations, the conditional state-transition structure of a D-rule program P with respect to M is characterized by a partial mapping $condSucc_P(M)$, which determines the successors of states by considering computations in M for evaluating rule applicability conditions and for computing specializations used for constructing the successors. More precisely, a mapping

$$condSucc_P : CMPCOMP \rightarrow partialMap(STA - FIN, STA),$$

called the *conditional successor mapping* of P, is defined as follows: let $M \in \text{CMPCOMP}$ and $st = \langle (ans(as) \leftarrow gs), \rho \rangle \in \text{STA} - \text{Fin}$. Then:

- 1. If first(gs) is a built-in atom whose evaluation fails, then $condSucc_P(M)(st) = \bot$.
- 2. If first(gs) is a built-in atom whose evaluation yields a specialization σ and σ is applicable to as and gs, then

$$condSucc_P(M)(st) = \langle (ans(as\sigma) \leftarrow rest(gs)\sigma), \rho \circ \sigma \rangle.$$

- 3. If first(gs) is a user-defined atom and every D-rule in P is non-applicable to st with respect to M, then $condSucc_P(M)(st) = \bot$.
- 4. If first(gs) is a user-defined atom and there exists a D-rule r in P such that
 - (a) r is applicable to st with respect to M, and
 - (b) every D-rule that precedes r in P is non-applicable to st with respect to M,

then

```
condSucc_P(M)(st) = \langle (ans(as\sigma) \leftarrow body(r)\theta\sigma \cdot rest(gs)\sigma), \rho \circ \sigma \rangle,
where \theta = \mathbf{m}(r, st) and \sigma = spec(r, st, M).
```

The conditional state-transition structure formalized by the mapping $condSucc_P$ is an extension of a simple state-transition structure discussed in [9], where each step in a state-transition sequence is determined without considering other state-transition sequences.

Since a successor state can be known only when all necessary computations required for checking relevant rule applicability are supplied by M, $condSucc_P(M)$ is in general not total.

Proposition 5.2. The mapping condSucc_P is monotonic, i.e., for any $M, M' \in \text{CMPCOMP}$, if $M \subset M'$, then $condSucc_P(M) \subset condSucc_P(M')$.

Proof: Let $M, M' \in \text{CMPCOMP}$ such that $M \subseteq M'$. Assume that $st \in \text{STA} - \text{Fin}$, $st' \in \text{STA}$, and $(st, st') \in condSucc_P(M)$. It follows from Proposition 5.1 that $(st, st') \in condSucc_P(M')$.

5.4. Clause-model semantics. Based on the mapping $condSucc_P$, a mapping K_P on CMPCOMP is associated with P as follows:

Definition 5.6. For any $M \in \text{CMPCOMP}$, $K_P(M)$ is the set consisting of every computation com on STA that satisfies the following conditions:

- 1. $first(com) \in Ini.$
- 2. For any two successive states st_i and st_{i+1} in com, $condSucc_P(M)(st_i) = st_{i+1}$.
- 3. If com is finite, then $last(com) \in Fin.$

Obviously, $K_P(M)$ is deterministic for any $M \in \text{CMPCOMP}$, and K_P is a well-defined mapping from CMPCOMP to CMPCOMP. It is also readily seen that for any $M \in \text{CMPCOMP}$, $K_P(M)$ contains a single-state computation [st] for any final state $st \in \text{Fin}$.

It follows directly from Proposition 5.2 that:

Proposition 5.3. K_P is monotonic.

For any $n \geq 0$, let $K_P^n(\emptyset)$ be defined by: $K_P^0(\emptyset) = \emptyset$ and if $n \geq 1$, then $K_P^n(\emptyset) = K_P(K_P^{n-1}(\emptyset))$. Using K_P , the meaning of P is defined below.

Definition 5.7. The meaning of P, denoted by $\mathbb{M}(P)$, is defined as $\lim_{n\to\infty} K_P^n(\varnothing)$.

Since K_P is monotonic, $\mathbb{M}(P)$ is well defined.

In the following examples, let BComp denote the set consisting of every computation com on STA such that (i) first(com) is a non-null state and (ii) the atom sequence on the right-hand side of the clause in first(com) consists only of built-in atoms in \mathcal{A}_{B} .

```
 \begin{split} & [\langle (ans([app([1,2],[3],*A)]) \leftarrow [app([1,2],[3],*A)]), \epsilon \rangle, \\ & \langle (ans([app([1,2],[3],*A)]) \leftarrow [=(*A,[1|*W1]),app([2],[3],*W1)]), \epsilon \rangle, \\ & \langle (ans([app([1,2],[3],[1|*W1])]) \leftarrow [app([2],[3],*W1)]), \{*A/[1|*W1]\} \rangle, \\ & \langle (ans([app([1,2],[3],[1|*W1])]) \leftarrow [=(*W1,[2|*W2]),app([],[3],*W2)]), \{*A/[1|*W1]\} \rangle, \\ & \langle (ans([app([1,2],[3],[1,2|*W2])]) \leftarrow [app([],[3],*W2)]), \{*A/[1,2|*W2],*W1/[2|*W2]\} \rangle, \\ & \langle (ans([app([1,2],[3],[1,2|*W2])]) \leftarrow [=([3],*W2)]), \{*A/[1,2|*W2],*W1/[2|*W2]\} \rangle, \\ & \langle (ans([app([1,2],[3],[1,2|*W2])]) \leftarrow []), \{*A/[1,2,3],*W1/[2,3],*W2/[3]\} \rangle ] \end{split}
```

Figure 4. An example of a computation

Example 5.1. Referring to the D-rules r_1 and r_2 in Figure 1 (Section 3.2), let P be the D-rule program $[r_1, r_2]$. Obviously, $K_P^1(\varnothing) = BComp \cup \{[st] \mid st \in Fin\}$. Figure 4 gives an example of a computation in $K_P^2(\varnothing) - K_P^1(\varnothing)$.

Example 5.2. Next, consider the D-rules r_8 , r_9 , and r_{10} in Figure 3 (Section 3.4). Let P be the D-rule program $[r_8, r_9, r_{10}]$. Again $K_P^1(\varnothing) = BComp \cup \{[st] \mid st \in Fin\}$. Consider the sets $K_P^2(\varnothing) - K_P^1(\varnothing)$ and $K_P^3(\varnothing) - K_P^1(\varnothing)$. The former set is a proper subset of the latter one. Both of them contain, for example, the following computations:

```
1. [\langle (ans([occur(3,2)]) \leftarrow [occur(3,2)]), \epsilon \rangle, \bot]
2. [\langle (ans([occur(3,3)]) \leftarrow [occur(3,3)]), \epsilon \rangle, \langle (ans([occur(3,3)]) \leftarrow []), \epsilon \rangle]
```

Figure 5 illustrates a computation that belongs to the latter set but not the former one.

```
 \begin{split} & [\langle (ans([occur(3,[2,3])]) \leftarrow [occur(3,[2,3])]), \epsilon \rangle, \\ & \langle (ans([occur(3,[2,3])]) \leftarrow [occur(3,[3])]), \epsilon \rangle, \\ & \langle (ans([occur(3,[2,3])]) \leftarrow []), \epsilon \rangle] \end{split}
```

Figure 5. An example of a computation

- 6. Query Answering and Program Synthesis on the Space of D-Rule Programs. Following the general scheme established in Section 2.2, how the clause-model semantics characterizes D-rule programs in the context of query answering is described in Section 6.1. Along with program correctness, program synthesis on the space of D-rule programs is illustrated in Section 6.2.
- 6.1. Query answering using D-rule programs. Let P be a D-rule program. Referring to the general scheme in Section 2.2 and the partial mapping fin in Section 5.1, how $\mathbb{M}(P)$ determines the computed answers to query atoms is given below. Assume that Q is a set of query atoms. First, a mapping $makeState_Q: Q \to INI$, a partial mapping $comp_P: INI \to FIN$, and a partial mapping $val: FIN \to pow(\mathcal{G})$ are given as follows:
 - For any query atom $q \in Q$, $makeState_Q(q)$ is the initial state $\langle (ans([q]) \leftarrow [q]), \epsilon \rangle$.
 - For any initial state $st \in Ini$, $comp_P(st) = fin(\mathbb{M}(P), st)$.
 - $val(\bot) = \emptyset$ and for any non-null final state $st = \langle (ans(as) \leftarrow []), \rho \rangle \in FIN$, if as is a singleton sequence [a], then val(st) = rep(a); otherwise val(st) is undefined.

Next, the computed answers to query atoms in Q are determined by the partial mapping $compute(P,Q): Q \rightarrow pow(\mathcal{G})$ defined by $compute(P,Q) = val \circ comp_P \circ makeState_Q$, i.e.,

$$compute(P,Q)(q) = val(fin(\mathbb{M}(P), makeState_Q(q)))$$

for any $q \in Q$. It is readily seen that for any $q \in Q$, compute(P,Q)(q) can be restated as follows:

- 1. compute(P,Q)(q) = rep(q') if $\mathbb{M}(P)$ contains a finite computation com such that $first(com) = makeState_Q(q)$ and $last(com) = \langle (ans([q']) \leftarrow []), \rho \rangle$ for some specialization $\rho \in \mathcal{S}$.
- 2. $compute(P,Q)(q) = \emptyset$ if $\mathbb{M}(P)$ contains a finite computation com such that $first(com) = makeState_Q(q)$ and $last(com) = \bot$.
- 3. compute(P,Q)(q) is undefined otherwise.

Given a query atom $q \in Q$, compute(P,Q)(q) is the computed answer to q obtained using the D-rule program P.

6.2. Program synthesis problems for query answering. A D-rule program P is correct with respect to a specification $S = \langle D, Q \rangle$ iff for any $q \in Q$, $compute(P,Q)(q) = answer_S(q)$. Let \mathbb{P} be the set of all D-rule programs. A program synthesis problem for a specification S on the space \mathbb{P} is to construct a D-rule program that is correct with respect to S.

Example 6.1. Assume that S is a specification $\langle D, Q \rangle$, where D consists of the two definite clauses

```
1. app([], *Y, *Y) \leftarrow
```

2.
$$app([*a|*X], *Y, [*a|*Z]) \leftarrow app(*X, *Y, *Z),$$

which together provide the definition of the predicate app, and

$$Q = \{app(l_1, l_2, v) \mid (l_1 \text{ and } l_2 \text{ are ground lists}) \& (v \text{ is a variable})\}.$$

An atom $app(l_1, l_2, v)$ in Q represents the query "find the result of appending l_2 to l_1 " and the answer to this query is given by instantiating v.

Let P be the D-rule program $[r_1, r_2]$, where r_1 and r_2 are the D-rules in Figure 1 (Section 3.2). P is correct with respect to the specification S, the reasons being as follows:

- From the background knowledge D, the following equivalent transformation (ET) rules [3] are derived:
 - 1. An atom of the form app([], *Y, *Z) can be replaced equivalently with a built-in equality atom of the form =(*Y, *Z).
 - 2. An atom of the form app([*a|*X], *Y, *Z) can be replaced equivalently with an atom set of the form $\{=(*Z, [*a|*W]), app(*X, *Y, *W)\}.$

Since r_1 and r_2 are directly obtained, respectively, from these two ET rules, each state-transition step of P is always an equivalent transformation step with respect to D (see, e.g., Figure 4). Hence for any $q \in Q$, if the computation of P for q ends with a final state, then the obtained computed answer always coincides with the answer to q defined by the specification S.

- Let com be any arbitrary computation of P that begins with makeState_Q(q) for some $q \in Q$. It is readily seen that com possesses the following properties:
 - The right-hand side of the clause in each non-final state in com comprises at most one equality atom and at most one app-atom, which has ground lists as its first and second arguments. An equality atom is always processable by the built-in evaluator. One of r_1 and r_2 is always applicable to any app-atom in a non-final state in com. Therefore, P always makes state transition on any non-final state possibly occurring in com.
 - When r_2 is applied to an app-atom whose first argument is a ground nonempty list, the length of that first argument list decreases by one. As a result, after a finite number of application of r_2 , r_1 is always applicable. Application of r_1 followed by the evaluation of an equality atom always yields a final state. So com terminates within finite state-transition steps.

Hence for any $q \in Q$, the computation of P for q always terminates and reaches a final state in finite time. \blacksquare

- 7. Comparison with Related Rule Languages. Table 7 compares D-rule programs with Prolog [1], Guarded Horn Clause (GHC) [2], and nondeterministic-rule (N-rule) programs [3] from the following viewpoints:
 - (Ch1) Single-clause state
 - (Ch2) Deterministic computation
 - (Ch3) Recursive applicability condition

- (Ch4) Instantiation into specific classes of programs through specialization systems
- (Ch5) Appropriateness for synthesis of deterministic programs

N-rule

Characteristics of D-rule programs from these viewpoints and the comparison in Table 7 are described below.

Language/ characteristic	(Ch1)	(Ch2)	(Ch3)	(Ch4)	(Ch5)
D-rule	0	0	0	0	0
Prolog	Δ	0	Δ	×	Δ
GHC	0	×	Δ	×	Δ

TABLE 7. Comparing D-rule, Prolog, GHC, and N-rule programs

- 7.1. Characteristics of D-rule programs. A D-rule program is a sequence of D-rules defined on a specialization system. A computation state for a D-rule program is a single definite clause on a specialization system and a computation is a sequence of states obtained by successive application of D-rules. Computation of a D-rule program is deterministic, since the first atom in the right-hand side of a state is selected to be transformed by the first applicable D-rule in the program. D-rules have recursive applicability conditions. D-rule programs are appropriate for generation of deterministic programs for solving QA problems, since many useful D-rules can be constructed directly from equivalent transformation (ET) rules [3], which are derivable from clauses [10].
- 7.2. **Comparison.** A pure Prolog program [11] is a sequence of ordered definite clauses³, which are conventionally regarded as rules for making backward chaining inference. The main structure of the procedural semantics of a Prolog program is a deterministic depth-first search for finding all answers to a given query. Such a search can be seen as a process of successively transforming a set of definite clauses using general unfolding-based rules [10]. Moreover, the applicability of a rule (an ordered definite clause) in pure Prolog is determined solely by unification of its head and a target atom; no applicability condition other than unification checking can be specified, resulting in the lack of expressive power for computation control. The extralogical predicate *cut* is introduced in Prolog as a remedy [1]. The sequence of atoms that precedes *cut* in the body of a rule can be considered as the applicability condition of the rule. However, the introduction of *cut* increases difficulty in semantics formalization, which is necessary for a discussion of program correctness and program synthesis.

Guarded Horn Clause (GHC) rules [2] yield single-clause transformation and appear to be more similar to D-rules than Prolog rules in regard to rule applicability checking. The applicability of a GHC rule is determined by pattern matching and GHC provides commit operators for specifying additional applicability conditions. However, the computation model of GHC is nondeterministic and parallel, while that of D-rule programs is deterministic and sequential. A simplified version of GHC, i.e., Flat GHC, is often used to reduce the cost of computing recursive applicability conditions. Research on GHC focusses more towards parallelism and efficiency, rather than program synthesis.

 $[\]circ\text{--"good"}; \quad \Delta\text{--"moderate"}; \quad \times\text{--"poor"}$

³An ordered definite clause is a definite clause whose right-hand side is regarded as an atom sequence, rather than an atom set.

A nondeterministic-rule (N-rule) program [3] is a set of nondeterministic rules (N-rules), which have no recursive applicability condition. A computation state for an N-rule program is a set of definite clauses on a specialization system and a computation is a sequence of states obtained by successive application of N-rules. Computation by an N-rule program is nondeterministic, i.e., a target definite clause in a computation state, a target atom for rule application, and an applicable N-rule is selected nondeterministically for making state transition. With regard to program synthesis, if an N-rule program comprises only ET rules, then its computation is guaranteed to yield a correct answer whenever a final state is reached.

Programs in most imperative languages are deterministic programs. However, the procedural semantics of existing imperative languages has little in common with specifications based on QA problems. It is thus difficult to establish relationships between programs in these languages and specifications in this class, and consequently, difficult to develop a theory for program synthesis based on these languages. Since the background knowledge of a specification comprises clauses, the use of clauses as computation states facilitates insightful understanding of the relationships between D-rule programs and specifications, and simplifies the difficulty of program synthesis. For example, as illustrated in Section 6.2, from a set of definite clauses representing background knowledge, ET rules [3] for equivalent transformation of clauses can be derived and they provide high-level intermediate artifacts for constructing a D-rule program. A method for systematically generating ET rules from a set of definite clauses, called the squeeze method, was presented in [10].

8. Conclusions. In this paper, we have formulated a class of deterministic programs, called deterministic-rule (D-rule) programs. D-rule programs have been extensively used as part of an ET-based language called ETI. Many applications and experimental systems have been constructed using the ETI language. A D-rule program is similar to a nondeterministic-rule (N-rule) program in that (i) they are both defined with specialization parameters, (ii) they employ clauses as components of their computation states, thereby narrowing the gaps between them and declarative descriptions of QA problems, and (iii) they can be generated based on ET rules. Compared to nondeterministic computation by N-rule programs, D-rule programs can represent deterministic computation precisely and provide richer expressive power through their recursive conditional state-transition structures. Taking these features into account, we have formalized a procedural semantics of D-rule programs, called the clause-model semantics. This semantics is the only existing semantics that can clearly determine the correctness of a D-rule program with respect to a specification. It provides a basis for developing practical methods for synthesis of many deterministic programs from declarative specifications.

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