Abstract

Traditional parser generation technologies are incapable of handling the demands of modern programmers. In this paper, we present the design and theory of a new parsing engine, YAKKER, capable of handling the requirements of modern applications including (1) full scannerless context-free grammars with (2) regular expressions as right-hand sides for defining nonterminals. YAKKER also includes (3) facilities for binding variables to intermediate parse results and (4) using such bindings within arbitrary constraints to control parsing. These facilities allow the kind of data-dependent parsing commonly needed in systems applications, particularly those that operate over binary data. In addition, (5) nonterminals may be parameterized by arbitrary values, which gives the system good modularity and abstraction properties in the presence of data-dependent parsing. Finally, (6) legacy parsing libraries, such as sophisticated libraries for dates and times, may be directly incorporated into parser specifications. We illustrate the importance and utility of this rich format specification language by presenting its use on examples ranging from difficult programming languages circles may have gone out of vogue is that widely-used YACC and its relatives are largely solved problem. To be honest, using the word "parser" for abandoning the constraints of LR [23] is a bit of a dicey move. Another highly-visible project, HTML 5.0 [13], has abandoned the grammar formulation of previous versions and is essentially specifying the syntax by an imperative program! Hence, in order to serve programming language researchers better, and, more importantly, the legions of other programmers who actually write most of the parser code in the world, we need substantial improvements in the power and flexibility of parser generation technology.

1. Introduction

The study of parsing is one of the oldest and most intellectually satisfying areas of programming languages, stretching back decades to the dawn of computer science. The best work in this field has nearly universal practical application and yet is based around remarkably elegant and general automaton theories. More recently, however, the study of parsing has come to be viewed as a somewhat boring, largely solved problem. To be honest, using the word "parsability" in the introduction of a POPL paper is a bit of a dicey move.

Perhaps one reason the study of parsing in programming languages circles may have gone out of vogue is that widely-used tools such as YACC [16] hit a sweet spot in the expressiveness-performance tradeoff space in the 1970s. YACC and its relatives were based around the LR fragment of context-free grammars and hence were powerful enough to express the syntax of many programming languages (with only the occasional egregious hack), and yet also gave linear-time performance. Consequently, in an era when computational resources were less plentiful than in modern times, programmer convenience and expressiveness were sacrificed for performance. Since then, for the most part, PL researchers have hung on to legacy tools because they are well-known, well-supported, taught in school and universally available, rather than because they are optimally designed.

On the other hand, programmers outside the miniscule world of PL implementors almost never use parser generators. Despite the fact that they are constantly writing parsers—for data formats, networking protocols, configuration files, web scraping and small domain-specific languages—they do most of it by hand, often using regular expression libraries that support context-sensitive features like backreferencing and POSIX anchors. This is not because they are unaware of PL tools, but rather because these tools do not solve their problems. For example, when Rescorla implemented the SSL message data format, he "attempted to write a grammar-driven parser (using YACC) for the language with the aim of mechanically generating a decoder, but abandoned the project in frustration" [27, p. 68]. Another highly-visible project, HTML 5.0 [13], has abandoned the grammar formulation of previous versions and is essentially specifying the syntax by an imperative program!

Hence, in order to serve programming language researchers better, and, more importantly, the legions of other programmers who actually write most of the parser code in the world, we need substantial improvements in the power and flexibility of parser generation technology.

1.1 Towards full context-free grammars

There have been a number of recent efforts to build parser generators that support unrestricted context-free grammars [24, 32, 30, 6]. In particular, McPeak has made a number of convincing arguments for abandoning the constraints of LR [23]. From a theoretical perspective, one central problem with LR is that it has poor compositionality properties. One cannot necessarily define a first sublanguage A, then a second sublanguage B and take their union: \( S = A \cup B \). If A and B overlap then S is ambiguous and is not LR. Moreover, in order to create a new language N containing all of A and B, one must take the union of A with the asymmetric difference B/A (or vice versa: take B with the asymmetric difference A/B). Unfortunately, LR is not closed under set difference [24] so unifying the two languages by finding the difference could be impossible! Even when the set difference remains LR, finding the appropriate way to express it requires digging in to and adjusting the definitions of A and/or B—these sublanguages cannot be developed independently in a modular fashion.

In practice, working within the constraints of LR can be very difficult, as anyone who has attempted to debug a shift-reduce or shift-shift error can attest. Debugging such errors is not only difficult for the initial programmer, but the resulting solutions often involve grammars that are harder to read, understand and maintain. As such, these grammars lose a great deal of their benefit as documentation. Moreover, not all practical grammars are amenable to such techniques. For instance, C and C++ contain a number of in-
herent ambiguities in their grammars. One troublesome example is that there is no way to determine whether \((a \& b)\) is a bit-wise conjunction or if it is a cast of \((b)\) to the type \((a)\), without knowing whether \(a\) is a variable name or a type name. Hence, attempting to parse C using an LR-based parser is only possible by stepping completely outside the grammar specification mechanism and having the parser communicate dynamic information about new type names back to the lexer. In a full context-free grammar specification mechanism, such hacks can elegantly be avoided simply by allowing ambiguities at parse time and disambiguating during semantic analysis [23].

1.2 Beyond context-free grammars
A robust parser generator for full context-free grammars may serve programming languages researchers well, but if we look beyond our community, there is a huge market for substantially more sophisticated parsing technology.

For example, in the web space, there is no more common task than matching identical XML or HTML tags, but, of course, this is not a context-free task. In binary formats, it is extremely common to use data fields that specify the lengths or sizes of other data fields, another non-context free feature. In addition, the specifications of many systems data formats are made simpler by the presence of constraints, such as bounds on integer ranges, expressed as arbitrary predicates over parsed data. In summary, without moving aggressively beyond the bounds of context-free grammars, parser generators are nearly useless to systems developers, networking engineers and web programmers.

One final limiting factor of standard parser generators is the inability to incorporate useful legacy code and libraries into parser definitions. For instance, there are over a hundred commonly used date and time formats and consequently programmers have developed sophisticated libraries for dealing with them. It is extremely useful for programmers to be able to incorporate such libraries directly into their parser specifications—after all handling dates and times correctly might well be the most difficult element of parsing some server log. If programmers cannot incorporate their favourite libraries, they may well just reject the parser specification mechanism altogether.

1.3 YAKKER: A general solution to modern parsing problems
In this paper, we present the theory and design of a new, general-purpose parsing engine called YAKKER. YAKKER is designed to be general enough to solve the parsing problems of the modern world, both inside and outside the programming languages community. In particular, it combines all of the following key elements in one universal platform:

- **Full, scannerless context-free grammars.** Full context-freedom allows easy expression of complex programming language grammars such as those for C++. Scannerless parsers reduce the burden on both parser-generator users and implementors by avoiding the need for a separate lexing tool and description language [28], and they make it easier for users to combine sub-languages with different tokens or whitespace conventions [1].

- **Regular right sides.** YAKKER uses regular expressions over terminals and nonterminals for the right-hand sides of nonterminal definitions. Regular right sides allow for very concise definitions in many situations. YAKKER handles regular right sides directly, rather than desugaring them into a more restricted form (an inefficient translation).

- **Variable binding.** Our grammar formalism allows variables to be bound to data read earlier in the parse and used to direct parsing that comes later.

- **Data-dependent constraints.** Our grammar formalism allows programmers to include arbitrary predicates over parsed data. When combined with our variable binding functionality, this feature allows for easy expression of length fields and other data-dependent parsing idioms.

- **Parameterized nonterminals.** Parameterized nonterminals allow users to create libraries of convenient abstractions that are easily customized and highly reusable.

- **Inclusion of parser libraries.** Allowing arbitrary parser libraries to be included in grammar specifications as black boxes enables reuse of legacy parser libraries.

The central technical contribution of this paper is a comprehensive theory that explains how to combine this powerful set of features into a single grammar formalism and to implement that grammar formalism correctly. The implementation strategy is carried out by translating our grammars into a new kind of automaton, the data-dependent automaton (DDA). We give a direct, nondeterministic operational semantics to the data-dependent automaton and prove that it implements our grammars correctly. Like its brethren, the finite automaton and the pushdown automaton, our new automaton is an elegant, powerful abstraction in its own right and a useful implementation-level tool amenable to formal analysis, transformation and optimization. The last piece of our theory is to show how to implement the nondeterministic semantics efficiently by extending the traditional Earley parsing algorithm [5]. We prove our final parsing algorithm correct with respect to the nondeterministic automaton semantics. By transitivity, we have a proof it implements our high-level grammar specifications correctly as well.

In addition to these theoretical contributions, we illustrate the importance, utility and generality of our new design with example grammar fragments that specify a number of different sorts of language paradigms. These paradigms are drawn from a wide variety of domains ranging from complex programming language syntax to widely-used systems logs to networking protocols. We have also implemented a prototype of our system which is able to compile and run all of these examples.

The rest of the paper is structured as follows. In Section 2, we introduce the features of YAKKER by example. Then, in Sections 3 and 4, we present the syntax and semantics of grammars and data-dependent automata, respectively. Section 5 contains a proof that an automaton soundly and completely implements a grammar, assuming that a small set of conditions relating the grammar and automaton are met. The section concludes with a straightforward compilation of grammars into automata along with a proof that the resulting automata satisfy the specified conditions (thus guaranteeing the correctness of the compilation). Then, in Section 6, we present an Earley-style algorithm for parsing with data-dependent automata and prove its correctness. In Section 7 we discuss related work, and then conclude in Section 8.

2. YAKKER by example
We now illustrate the key features of YAKKER through examples.

**Regular right sides** In YAKKER, nonterminals are defined by regular expressions over the terminals and nonterminals of the grammar. For example, here we define two nonterminals:

\[
\text{digit} = \{1 \mid 2 \mid 3 \mid 4 \mid 5 \mid 6 \mid 7 \mid 8 \mid 9\}
\]

\[
\text{number} = \text{digit} \text{ digit}^{*}
\]

The first nonterminal, digit, is defined as an alternation of terminals (in bold), and it denotes the set of ASCII numerical characters. The second, number, is defined in terms of digit using concatenation and Kleene-closure. This familiar notation is standard for lexer generators, but uncommon in parser generators. We allow it for all language constructs. Thus a list of expressions can be written
Parser generators that do not support regular right sides force programmers to define the list as a separate nonterminal, as in this excerpt from the OCAML implementation [20]:

```
expr_comma_list : expr_comma_list COMMA expr | expr COMMA expr
```

This is more verbose and less readable than the equivalent regular right side, a fact emphasized by the use of regular right sides to describe OCAML syntax in the user manual.

When implemented properly, regular right sides are also efficient. Any grammar with regular right sides can be transformed into a grammar without them, however, this will add many nonterminals to the language, and thus a great deal of extra structure to parse. Regular expressions are highly ambiguous, e.g., the expression \((x^+)(x^*)\) can be matched against an input of length \(n\) in \(n + 1\) ways. Compiling away regular right sides therefore results in highly ambiguous grammars, which are more expensive to parse. YAKKER handles regular right sides directly and efficiently, ignoring their ambiguities via determinization, as is traditional with regular expressions (cf Section 4).

### Full context-free grammars

We support context-free grammars without restriction, including ambiguous grammars. For example, the problem with C’s syntax mentioned in the introduction can be avoided simply by using an ambiguous grammar:

```
typename = identifier
expr = & expr ; address-of
   | expr & expr ; bitwise conjunction
   | ( typename ) expr ; cast
   | ( expr )
   | identifier
   | ...
```

(The grammar is ambiguous because types and identifiers are identical.) Of course, ambiguities must be resolved at some point. One way would be to resolve them during the typechecking phase of the compiler, when all type names are available [23]; we give another way later in this section.

Outside of programming languages, ambiguous grammars are often used as documentation. For example, many network protocol message formats are specified using grammars (in IETF Request For Comments, or RFCs), and we have found that these grammars are almost invariably ambiguous.

### Attribute-directed parsing

Nonterminals can capture input substrings which the programmer can use to direct the parser’s behaviour on the remainder of the input. This is commonly needed for these formats. For example, we have found that many of the formats defined in RFCs using grammars require context-dependent tokenization.

Scannerless parsers are often also useful in parsing programming languages. One example is Javascript, which sometimes allows semicolons to be omitted at the end of a line, e.g., after a void statement. Here is a simplification that illustrates how we can handle this in YAKKER:

```
statement = return (SP | TAB)* (NL | ; | identifier )
```

Another example is the use of indentation for block structure, as in Python and Haskell. This is context-dependent whitespace: it must be handled specially by the lexer if it is at the beginning of a line within a block, and the block structure is only known by the parser. This forces the lexer and parser to be mutually recursive.

For a final example, consider a template language like PHP, which mixes the syntax of two languages, HTML and the PHP constructs and  value binding (assignments in braces) to express the RFC’s side condition on the length directly in the grammar.

One way to implement this specification would be to evaluate these bindings and constraints in a semantic analysis following parsing, as we suggested for the C example, above. However, this would be very inefficient—our parser would have to treat the length abstractly, potentially promoting all possible lengths to its output. Instead, we evaluate constraints during parsing to prune ambiguities as soon as possible. We call this attribute-directed parsing, following Watt [33]. Notably, attribute-directed parsing subsumes backreferences, which are commonly used in hand-written parsers based on regular expression libraries.

### Parameterized Nonterminals

The length+data idiom of IMAP literals is used in many systems formats. We have parameterized nonterminals to support modular reuse of such idioms. For example, we could define a fixed-width string nonterminal:

```
stringFW(n) = ([n > 0] CHAR8 \{ n - 1 \})^* \{ n = 0 \}
```

This is an imperative definition, relying on the assignment \( n = n - 1 \). We could alternatively use a functional style:

```
stringFW(n) = \{ n = 0 \} | \{ n > 0 \} \{ \text{CHAR8} \text{stringFW}(n-1) \}
```

(The \{ n = 0 \} case parses the empty string.) Our formalism, in principle, would allow an optimizing parser generator to convert tail calls of this form into Kleene-closures of the previous form.

Parameters can be used to thread parsing state through a parse to aid attribute-directed parsing. For example, ambiguities in the C grammar can be pruned at parse time by passing a table of type identifiers to the expr nonterminal:

```
decls(s) = typedefs x=identifier
   decls(insert(s.types,x))
   |
   typedecl(s) = x=identifier \{ member(s.types,x) \}
   expr(s) = & expr(s) ; address-of
   | ( expr(s) ) ; bitwise conjunction
   | ( typename(s) ) expr(s) ; cast
   | ( expr(s) )
   | x=identifier \{ not(member(s.types,x)) \}
   |
```

```
literal8 = ""(" number ("=" ) ")" CRLF +OCTET
   ; A string that might contain NULLs.
   ; \{number\} represents the number of OCTETs
   ; in the response string.
   Here number is an ASCII representation of the length of the data,
   CRLF is a carriage return and linefeed, and OCTET is any 8-bit
   value. We can express the syntax of an IMAP literal directly using
   bindings and constraints:
   literal8 = "\{ x=number (+ | e) \} \{ n=string2int(x) \} CRLF
   \{ n > 0 \} OCTET \{ n = n - 1 \}^* \{ n = 0 \}
   Here we bind the string parsed by number to a variable x, convert
   x to a number n and use constraints (expressions within square
Languages have different keywords and comment syntax, which again leads to context-dependent lexing.

**Blackbox parsers** Support for the full range of context free grammars (and beyond) allows us to seamlessly integrate support for foreign parsers, or blackboxes, into our formalism, which can be essential for parsing real-world languages and data formats. For example, consider these two sample lines from a web server log, which include a complex date field (the lines are broken with a “\n” to fit).

```
"GET /tk/p.txt HTTP/1.0" 200 30
```
"POST /scpt/ddgrp.org/confirm HTTP/1.0" 200 941

Here is a grammar fragment describing this data, where the date field is described with a blackbox nonterminal, bbdate. SP is a nonterminal defined as the space character; we omit the definitions of the other nonterminals.

```
blackbox bbdate
entry = client SP auth-id SP auth-id SP [ bbdate ]
SP request SP response SP length
```

In our formalism, blackbox nonterminals come from a different namespace than other nonterminals. We indicate this here with the “blackbox bbdate” declaration.

**Compositionality** Our grammars are closed under union, concatenation, and Kleene closure. We learned about the importance of these compositionality properties from our experience with the PADS family of languages [7, 8, 22]. PADS is a domain-specific language that interprets specialized type declarations as grammars. These type declarations can be used to generate parsers and printers as well as a variety of useful end-to-end data processing tools. PADS grammars are superficially similar to the grammars presented in this paper—they contain regular expressions, variable binding, constraints, parameterized definitions and black-box parsers. However, PADS grammars have a different semantics that makes them easy and efficient to implement using a top-down, recursive descent parsing algorithm with limited backtracking. In particular, if, when parsing the union (A + B), PADS succeeds in parsing an A, it will commit to that choice and never backtrack, even when downstream errors arise that could be avoided if the input was interpreted as a B. PEGS, another related grammar specification language analyzed by Ford [10, 11], and implemented efficiently by Grimm [12], has similar expressive power and semantics.

Unfortunately, the PADS semantics has undesirable consequences in certain applications because it causes closure under union and concatenation to fail:

- \( L(A + B) \neq L(A) \cup L(B) \)
- \( L(AB) \neq L(A) L(B) \)

Both of these principles are required for the correct functioning of divide-and-conquer grammar induction algorithms, including algorithms designed to infer PADS descriptions [9]. The PADS grammar induction algorithms attempt to avoid learning incorrect grammars by using various heuristics, but the heuristics are not always successful — the algorithms do fail occasionally on real data sources.

More generally, these principles are essential for modular grammar design. If they hold, programmers can develop sublanguages A and B in isolation and then, without further modification, perform natural operations such as union or concatenation and receive the expected resulting semantics.

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3. **Grammars and languages**

We now specify the formal syntax and semantics of grammars. Grammars refer to a simple, untyped language of expressions (e) that includes variables (x, y, z, etc.), booleans (true, false), unit values () and strings of terminal symbols w. An environment \( E ::= \cdot | E[x = v] \) is a finite partial map from variables to values. We write \( E, E' \) for the concatenation of two environments. Bindings to the right take precedence over bindings to the left (an update semantics). We write \([e]E\) to denote the value \( v \) that results from evaluating \( e \) in environment \( E \).

**Definition 1**

A grammar \( G \) is a tuple \((\Sigma, \Delta, \Phi, A_0, R)\) where:

- \( \Sigma \) is a finite set of terminals;
- \( \Delta \) is a finite set of nonterminals;
- \( \Phi \) is a finite set of blackboxes;
- \( A_0 \in \Delta \) is the start nonterminal; and
- \( R \) maps nonterminals to parameterized right-hand sides.

We use \( A, B, C \) to range over nonterminals, a, b, c to range over terminals and \( \beta \) to range over blackbox parsers. The empty sequence is written \( \epsilon \). Let \( \text{meta}-\text{variable} r \) range over the **rules**, which are defined below.

\[
\begin{align*}
\text{r} & ::= \epsilon | c & \text{the empty string, terminals} \\
\text{x} & ::= A(\epsilon) & \text{nonterminal} \\
\text{x} & ::= e & \text{binding} \\
\text{r.r} & ::= r + r & \text{sequence, alternation} \\
\text{r*} & ::= \text{Kleene-closure} \\
\text{[e]} & ::= \text{constraint} \\
\beta(e) & ::= \text{blackboxes (foreign functions)} \\
\text{empty} & ::= \text{the empty language}
\end{align*}
\]

A parameterized right-hand side is a function from values to rules: \( \lambda y_0.r \). We reserve the variable \( y_0 \) for use as the rule parameter—other bound variables (i.e., the \( x \) in \( x = A(\epsilon) \) or in \( x = e \)) may not be \( y_0 \). When \( x \) does not appear elsewhere in a right-hand side we write \( A(\epsilon) \) in place of \( x = A(\epsilon) \). When \( y_0 \) does not appear in \( A \)'s rule, we write \( A \) in place of \( A(\epsilon) \) and call \( A \) an unparameterized nonterminal. The start nonterminal is always unparameterized.

Figure 1 defines the judgment \( E \vdash w \in r \rightarrow E' \), which says that string \( w \) belongs to the language of a rule \( r \) in environment \( E \), and produces new bindings \( E' \). One of the simpler rules is \( \text{GL-TERM} \), which states that the character \( c \) is in the language of the rule \( c \) in any environment \( E \) and produces no new bindings. A somewhat more interesting rule is \( \text{GL-A} \), which states that \( w \) is in the language of \( x = A(\epsilon) \) provided that \( e \) evaluates to \( v \) and \( w \) is in the right-hand side of \( A \) applied to \( v \). This rule also produces the binding \( [x=w] \). Rule GL-SEQ shows how to process a concatenation expression—notice the way it threads environments through the rule from one part to the next.

The language of a nonterminal \( A \) is then defined as follows.

\[
L_A = \lambda y_0.\{w \mid [y_0 = y] \vdash w \in r \Rightarrow E, R(A) = \lambda y_0.r\}
\]

The language of a grammar \( G \) is just the language of its start nonterminal: \( L_G = L_{A_0} \). Then our grammars have the desired compositionality properties:

**Theorem 1 (Compositionality Properties)**

Let \( G_1 \) and \( G_2 \) be grammars with disjoint variables and nonterminals and let \( A_{01} \) and \( A_{02} \) be the start nonterminals of \( G_1 \) and \( G_2 \). It is possible to construct three new grammars with the following properties.

i. If \( G' \) is the union of \( G_1 \) and \( G_2 \) with a new start nonterminal defined as \( A_{01} + A_{02} \) then \( L(G') = L(G_1) \cup L(G_2) \).
If $G$ is the union of $G_1$ and $G_2$ with a new start nonterminal defined as $A_{0,1}A_{0,2}$ then $L(G') = L(G_1) + L(G_2)$. 

3. If $G'$ is $G_1$ with a new start nonterminal defined as $A_{0,1}$ then $L(G') = L(G_1)^*$. 

The compositionality properties follow immediately from the rules of Figure 1. The following corollary is a direct consequence.

**Corollary 2 (Closure Properties)**

If $L_1$ and $L_2$ are languages of grammars, then $(L_1 \cup L_2)$, $(L_1L_2)$, and $L_1^*$ are languages of grammars.

## 4. Data-dependent Automata

One of the beauties of parsing theory is that high-level grammatical concepts can often be implemented in terms of lower-level automata, which are themselves useful abstractions for programmers and compiler implementers. In this section, we present a new kind of automaton that can implement our data-dependent grammars.

Our new automaton is technically transducers -- that is, they do not only recognize an input, but also produce outputs, although only from final states. They extend the transducers of Jim and Mandelbaum [15], which were created to parse context-free grammars with regular right-hand sides. Jim and Mandelbaum’s idea was to encode regular right sides as subautomata within the transducer, to explicitly label calls from one nonterminal’s automaton to another’s, and to explicitly label final states with the name of the nonterminal being completed. Constructing transducers in this way gives them three essential characteristics. First, they allow for left-factoring of grammar alternatives, which makes it possible to reduce the nondeterminism that will arise during parsing. Second, they allow for direct implementation of regular expressions as traditional automata, rather than through desugaring into a more restricted form of context-free grammar. Such a direct implementation has a significant impact on parsing efficiency by reducing stack activity. Third, the transducers support left-recursion—programmers are not forced to write their grammars with repetition operators, as is the case for PEGs [11] and many parser combinator implementations [14].

In this section, we extend the core ideas found in Jim and Mandelbaum’s work by showing how to add support for binding, dependency, constraints, parameters and black boxes. We give a nondeterministic operational semantics for transducers containing this rich set of features. While this semantics could be used to implement the transducer directly with a backtracking, depth-first parser, we do not do so — Section 6 presents a breadth-first algorithm based on ideas drawn from Earley’s parsers for context-free grammars [5]. However, before presenting any of these technical details, we explain the high-level ideas through the use of several simple examples.

### 4.1 Transducers by example

Figure 4.1 shows three example transducers along with their source grammars. Figure 4.1 (a) defines a fixed-width integer, with the width specified as a parameter to the nonterminal named int. In this picture, some edges (such as the edge between states 2 and 3) are labelled with terminal symbols. These edges can be interpreted in the ordinary way: a transition is enabled when the current input symbol may be found on the edge. There are also predicate-labelled edges (square brackets enclose predicate edges). The edge between states 1 and 2 is an example of a predicate edge. A transition is enabled along a predicate edge when the predicate in question evaluates to true in the current environment. The edges enclosed in curly braces are assignment edges — traversing the edge from 3 to 1 assigns $n-1$ to $n$. Lastly, notice that the final state for this automaton (final states are marked by double-circles) is labelled with the nonterminal int. Final states may, in general, be labelled with many nonterminals — arrival at such a state signals simultaneous completion of multiple nonterminal definitions.

Figure 4.1 (b) contains a grammar and transducer for the same language as Figure 4.1 (a), expressed in a functional style. Whereas the previous example made no use of the stack, this example will build a stack of depth equal to the value of the argument of the nonterminal int. Stack frames are pushed (saving the current environment and calling state) at each call transition. Stack frames are popped upon arrival at final states. For instance, imagine the transducer takes the call transition between states 2 and 5 and then reads a digit to arrive at the state labelled dig. At this point, control will return to state 2, pop the stack (reinstalling the saved environment) and take the transition between states 2 and 3. The 2-3 transition is taken because it is labelled $\text{dig}$ — the same nonterminal as is found in the final state the transducer is returning from. A slightly more sophisticated call pattern occurs between states 3 and 1. In this case a parameter is passed to the callee. Notice that the 3-1 edge is matched by another edge leading from 3 labelled “int$(n-1)$.” The “int” part of the label indicates this edge supports returns from states labelled with nonterminal int. The “$n-1$” part of the label indicates it also requires that the parameter passed to the call from which a return is made is equal to $n-1$.

Finally, Figure 4.1 (c) demonstrates the ability to represent left factoring efficiently and the utility of final states labelled with multiple nonterminals. In this transducer, the call transition from states 1 to 4 is coupled with two return transitions from 1. One return transition is labelled with nonterminal B and one with nontermi-
Our transducer semantics specifies the construction of parse trees,
\[4.2\] Trees

Our transducer semantics specifies the construction of parse trees, so we define them here.

**Definition 2 (Parse Trees)**
A tree \( T \) is a sequence of
- terminals \( c \),
- bindings \( \{ x = v \} \),
- blackbox strings \( \langle w \rangle \), or
- four-tuples \( x : A(v)(T) \) representing subtrees for nonterminals \( A \) applied to \( v \) with leaves bound to \( x \).

**Definition 3 (Subtrees)**
\( T_1 \) is a subtree of \( T \) at depth \( n \) iff
1. \( T = T_0 T_1 T_2 \) and \( n = 1 \), or
2. \( T = T_0 x : A(v)(T') \) \( T_2 \), and \( T_1 \) is a subtree of \( T' \) at depth \( n - 1 \).

Let \( m \) range over \( \{ c | \{ x = v \} \} \) for each \( w \). We define an erasure function \( |m| \), from strings \( m \) to strings \( w \) as:

\[|c| = c, \quad |cm| = c|m| \]
\[|(x = v)|_m = |m| \quad |(w)|_m = w|m|\]

**Definition 4 (Roots and Leaves)**
We define two functions on trees, \( \text{roots}(T) \) and \( \text{leaves}(T) \).
- \( \text{roots}(m) = m \) and \( \text{roots}(x : A(v)(T)) = x : A(v) \).
- \( \text{leaves}(m) = |m| \) and \( \text{leaves}(x : A(v)(T)) = \text{leaves}(T) \).

When a tree is a sequence of length \( \geq 1 \), we define \( \text{roots}(T) \) and \( \text{leaves}(T) \) in the obvious way.

Finally, we let \( W \) range over the range of the \( \text{roots} \) function, \( \{ c | \{ x = v \} \} \) \( \{ w | x : A(v) \} \), and refer to strings \( W \) as abstract strings. We will discuss abstract strings further in Section 5.

### Figure 2
Transducers for (a) an imperative specification of a fixed-width integer, (b) a functional specification of a fixed-width integer, and (c) a (very) simple expression language demonstrating left-factoring. Final states are labeled with nonterminals, rather than state numbers.

\[(q, E, T, r) : tl \Rightarrow (q', E', T', r') : tl'\]

\[S-TERM \quad r \to \alpha \to s \quad (q, E, T, r) : tl \Rightarrow (q, E, T, s) : tl \]

\[S-PRED \quad r \to \alpha \to s \quad [eE = \text{true}] \quad (q, E, T, r) : tl \Rightarrow (q, E, T, s) : tl \]

\[S-BIND \quad r \to [\beta(c)] \to s \quad [eE = v \quad w \in \Phi(\beta(v))] \quad (q, E, T, r) : tl \Rightarrow (q, E, T, s) : tl \]

\[S-CALL \quad r \to \alpha(c) \to s \quad [eE = v] \quad (q, E, T, r) : tl \Rightarrow (s, \gamma_0 = v, \epsilon, s) : (q, E, T, r) : tl \]

\[S-RETURN \quad \gamma \to A \quad r \to A \to s \quad [eE' = v] \quad \gamma(\gamma_0) \quad (q, E, T, r) : tl' \Rightarrow (q', E'[x = \text{leaves}(T)], T' : A(v)(T), s) : tl \]

### Figure 3
The stack evaluation relation.

### 4.3 Semantics
A parsing transducer \( T \) is a tuple \((\Sigma, \Delta, Q, \Phi, A_0, q_0, \to, \epsilon, \alpha, \beta, \gamma)\) where
- \( \Sigma \) is a finite set of terminals;
- \( \Delta \) is a finite set of nonterminals;
- \( \Phi \) is a finite set of blackboxes;
- \( Q \) is a finite set of states;
- \( A_0 \in \Delta \) is the start nonterminal;
- \( q_0 \in Q \) is the initial state;
- \( \to \) is the transition relation with one of the following forms:
  - \( \to \) (terminal), \( \to \) (constraint), \( \to \) (binding), \( \to \) (black-box), \( \to \) (nonterminal);
- \( \epsilon \) \( \subseteq Q \times \Omega \times Q \) is the call relation; and
- \( \to \subseteq Q \times \Delta \) is the output relation from final states to nonterminals.

We use \( q, r, s, t, u \) to range over states and \( \alpha, \beta, \gamma \) to range over sequences of states. A configuration is a 5-tuple \((q, E, T, r) : tl\) where \( tl \) acts as a stack that grows to the left. The first element of the tuple \( q \) is the callee at which the parse of the current nonterminal \( s \) began. While the callee does not influence the parsing pro-
cess, its inclusion simplifies the task of proving that the Earley-style parsing algorithm in Section 6 preserves the semantics of transducers. The next element of the tuple \((E)\) is the current environment. It is followed by the parse tree \((T)\) under construction. The last element of the tuple \((v)\) is the current state.

Figure 3 defines \(\Rightarrow\), a single-step evaluation relation for configurations. One of the simpler rules is \(\text{S-INPUT}\), which extends the current tree with a terminal based on a transition on that terminal appearing in the transducer. Of greater complexity are rules \(\text{S-CALL}\) and \(\text{S-RETURN}\), which manage the stack. Rule \(\text{S-CALL}\) transitions to another state much like a function call. A new stack tuple is pushed with the callee as the current state, an empty tree, and an environment that contains only the call argument bound to \(y_0\). To guarantee access to the call argument at any point during evaluation, we ensure that \(y_0\) is not updated with the side condition \(x \neq y_0\) on rules \(\text{S-BOUNDING}\) and \(\text{S-RETURN}\).

Rule \(\text{S-RETURN}\) is invoked whenever a final state is reached. The stack is popped and any transition \(x = A(e)\) from the previous current-state \(S'\) can be followed, as long as \(e\) evaluates to the call argument of the current tuple. Also, the string parsed by \(A(e)\), \(\text{leaves}(T)\), is bound to \(x\) in the environment.

The multi-step evaluation relation, \(\Rightarrow^*\), is defined as usual. Notice that the multi-step evaluation relation defines a nondeterministic algorithm for parsing with the transducer.

We complete this section by noting just as we can talk about nonterminal languages in the grammar, we can describe nonterminal languages in the transducer. However, given that the transducer might have multiple callee states for any given nonterminal, we describe the nonterminal languages with respect to a particular callee.

**Definition 5**
We characterize \(L_A(q)\), the language of \(A\) at \(q\), as
\[
L_A(q) = A_y \cdot \{x : (q, y_0 = y, e, q) \Rightarrow^* (q, E, T, r), \quad r \leftarrow w, w = \text{leaves}(T)\}
\]
and the language of the transducer \(L_T = L_{A_0}(y_0)\).

### 5. Grammars and Transducers

Before we present our Earley-style parsing algorithm, we will prove that data-dependent automata are powerful enough to parse the languages of data-dependent grammars. We do so in two steps. First, we identify sufficient conditions for a given transducer to parse the language of a given grammar. Then, we present a translation from grammars to transducers that satisfies the conditions.

#### 5.1 Abstract Languages

Our strategy for relating grammars to transducers is to reduce the problem to one of independently comparing subautomata within the transducer with right-hand sides in the grammar, without reference to the remainder of the grammar and transducer. In Section 4.2, we defined abstract strings \(W\), which contain symbolic elements, like nonterminals, in addition to terminals. Here, we define abstract languages – sets of abstract strings – for grammar nonterminals and transducer callees. We then compare subautomata with right-hand sides via their respective abstract languages and show how equivalence of these abstract languages implies equivalence between a grammar and transducer.

In essence, abstract languages are defined by symbolic comparison of abstract strings with right-hand sides and transducers. Yet, there’s a catch: if some \(x = A(v)\) appears in an abstract string \(W\), then symbolically evaluating \(W\) requires a value to be bound to \(x\) for use in evaluating the remainder of \(W\). Moreover, that value must be a valid member of the language of \(A(v)\), which would seem to break our goal of abstracting over the languages of nonterminals. Therefore, in order to recover modularity, we parameterize our judgments by language-representative maps, \(Z : A \times V \rightarrow \mathcal{P}(\Sigma^*)\), which contain representative sets for each nonterminal in the grammar. That is, \(Z\) maps a pair of a nonterminal \((A)\) and a value \(v\) to a set of strings that will represent the language \(A(v)\). Each lemma, theorem, etc. chooses a particular \(Z\) appropriate to its setting. We will discuss our choice of \(Z\) as they arise. The following is a particular \(Z\) – parameterized by a tree \(T\) – which comes into play frequently in the remainder of this section:

**Definition 6 (Tree-specific Language-representative Map)**
\[
Z_T = \lambda (A, y). \{\text{leaves}(T) \mid T = T_0 \cdot y \cdot \text{A}(y) \cdot (T') \cdot T_1\}
\]

Also, we can define an inclusion relation on \(Z\)s (needed later in this section):

**Definition 7 (Language-representative Map Inclusion)**
\[
Z_1 \subseteq Z_2 \text{ if } \forall A, v \in \text{dom}(Z_1), Z_1(A, v) \subseteq Z_2(A, v).
\]

In Figure 4, we define the abstract-string inclusion judgment for grammars. We then define the abstract language of nonterminal \(A\), given \(Z\), as
\[
G^Z_A = \lambda y. \{W \mid Z; [y_0 = y] \vdash W \in r \Rightarrow E, \mathcal{R}(A) = \lambda y_0, r\}
\]

In Figure 5, we present a judgment relating abstract strings \(W\) to paths through the transducer. We also define its reflexive and transitive closure in the expected way. We can now define the abstract language of nonterminal \(A\), given \(Z\), at callee \(q\) as
\[
T^Z_A(q) = \lambda y. \{W \mid Z; [y_0 = y] \vdash W : q \Rightarrow^* s; E \text{ and } s \Rightarrow A\}
\]
Figure 5. Abstract string inclusion for transducers and its reflexive and transitive closure.

5.2 Transducer Conditions

Perhaps the key element of the proof that transducers implement grammars properly is the definition of the set of conditions (T0), (T1), (T2) and (T3) that relates the language of a grammar $G$ to the language implemented by a transducer $T$. The intuition for the conditions is as follows.

- **(T0)** states that the language of the transducer starting at $q_0$ (the start state) and finishing at a final state for $A_0$ (the start nonterminal) must be the same as the language of $A_0$ in the grammar. In a nutshell, this condition states that the transducer implements the start nonterminal correctly.
- An $A(e)$-edge is any edge with the form $s \xrightarrow{x=A(e)} s$. With this in mind, (T1) states that any $A(e)$-edge from a state $r$ must be coupled with a call edge from $r$ with parameter $e$. Moreover, that call edge must transition to a state $q$ that implements the language of non-terminal $A$. In a nutshell, this condition states that the transducer contains some call that implements each $A(e)$-edge correctly.
- A callee is either the start state $q_0$ or any other state that has a call edge leading to it. Hence, (T2) states that for each nonterminal $A$, the language of $A$ at every callee is a subset of the language of $A$ in the grammar. In a nutshell, the transducer contains no calls that put extra garbage into the language of any non-terminal.
- **(T3)** states that the transducer passes parameters in environment variable $y_0$, but does not otherwise use it. Consequently, return actions, which check this variable, will be implemented correctly. (That’s it, in a nutshell.)

Formally, these conditions are specified as follows.

**Definition 8**

$T$ is a transducer for $G$ iff

(T0) $T_A^G(q_0) = G_A^G(\cdot)$, for all $Z$.

(T1) If $r \xrightarrow{s=A(e)} s$ then $r \xrightarrow{eA(h)} q$, for some $q$ with $T_A^Z(q) = G_A^Z(\cdot)$, for all $Z, v$.

(T2) If $q$ is a callee, then $T_A^q(q)(\cdot) \subseteq G_A^q(\cdot)$, for all $Z, A, v$.

(T3) For all transitions of the form $x \xrightarrow{e=A(e)} x \neq y_0$.

5.3 Grammar-Transducer Correspondence

We start with some basic properties that relate abstract languages based on a relationship between their $Z$ parameters.

**Lemma 1**

a. If $Z_1 \subseteq Z_2$ and $Z_1 \vdash W \in r \Rightarrow E'$ then $Z_2 \vdash W \in r \Rightarrow E''$.

b. If $Z_1 \subseteq Z_2$ and $Z_1 \vdash W : q \rightarrow^* r; E'$ then $Z_2 \vdash W : q \rightarrow^* r; E''$.

**Corollary 2** (Weakening)

a. If $Z_1 \subseteq Z_2$ then $\forall A, v, G_A^Z(v) \subseteq G_A^{Z_2}(v)$.

b. If $q$ is a callee and $Z_1 \subseteq Z_2$ then $\forall A, v, T_A^{Z_1}(q)(\cdot) \subseteq T_A^{Z_2}(q)(\cdot)$.

In the next few lemmas, we investigate some properties of stack executions. The Prefix Lemma, below, shows that trees grow monotonically, and, therefore, cannot be arbitrarily transformed during parsing.

**Lemma 3** (The Prefix Lemma)

If $(q, E_0, \epsilon, q) \Rightarrow^* (q, E, T_1, T_2, r)$, then $\exists s, E', (q, E_0, \epsilon, q) \Rightarrow^* (q, E', T_1, s)$ and $\text{dom}(E') \subseteq \text{dom}(E)$.

Proof: by induction on $\Rightarrow^*$ derivation.

Our next lemma allows results about stack evaluations in one context to be applied in other contexts. It also provides intuition as to the key element of the proof that transducers implement grammars. In the Roots Lemma below, we demonstrate that the trees constructed by a stack evaluation correspond to strings in the abstract language of the transducer. Notice that we choose $Z_T$ for our language-representative map, where $T$ is the tree constructed by the stack evaluation of interest.

**Lemma 4** (Context Independence)

If $(q, E, T, r) : tl \Rightarrow^* (q, E_1, T_1, r_1) : tl$ then $\forall tl'. (q, E, T, r) : tl' \Rightarrow^* (q, E_1, T_1, r_1) : tl'$.

Proof: by induction on $\Rightarrow^*$ derivation.

Now, we may begin the task of relating the languages of grammars and transducers. In the Roots Lemma below, we demonstrate that the trees constructed by a stack evaluation correspond to strings in the abstract language of the transducer. Notice that we choose $Z_T$ for our language-representative map, where $T$ is the tree constructed by the stack evaluation of interest.

**Lemma 5** (The Roots Lemma)

If $q$ is a callee, $(q, [y_0=\epsilon], r, q) \Rightarrow^* (q, E, T, r)$ and $r \rightarrow A$, then $\text{roots}(T) \in T_A^{Z_T}(q)(\cdot)$.

The proof of Lemma 5 is carried out by strengthening the induction hypothesis and then performing induction on the $\Rightarrow^*$ relation.

With this result, together with condition (T2), we can now relate trees constructed in a stack evaluation directly to the grammar.
Lemma 6 (The Roots-Grammar Lemma) 
If $T$ is a transducer for $G$, $q$ is a callee, $(q, [y_0=v], \varepsilon, q) \Rightarrow^* (q, E, r, T)$, and $r \rightarrow \rightarrow A$, then $\text{roots}(T) \in G(A)(\tilde{v})$.

The following lemma completes the statement of correspondence between trees and stack evaluations. In essence, it states that every subtree within the tree produced by an evaluation has some corresponding sub-evaluation.

Lemma 7 (The Subtree Lemma) 
If $T$ is a transducer for $G$, $q$ is a callee, $E_0(y_0) = v$, $(q, E, r, T)$, and $A(v_1)(T_1)$ is a subtree of $T$ at depth $n$, then there exists a stack $t_1$, callee $s$ and state $t \rightarrow \rightarrow A$ such that $(s, [y_0=v_1], \varepsilon, s) : t \Rightarrow^* (s, E_2, T_1) : t_1$.

Proof: by induction on the depth of $T_1$.

At this point, we are ready to prove our final result, namely, that the language of a transducer will match the language of a grammar, assuming our conditions are met. We prove language equality in two steps, by proving mutual inclusion of the two languages. The Leaves Lemma will show that the transducer’s language is included in the grammar’s, and the Callee Correctness Lemma will show the reverse.

Lemma 8 (The Leaves Lemma) 
If $T$ is a transducer for $G$, $q$ is a callee, $(q, [y_0=v], \varepsilon, q) \Rightarrow^* (q, E, r, T)$, and $r \rightarrow \rightarrow A$, then leaves$(T) \in L_A(v)$.

Proof: by induction on height of the tree $T$.

Lemma 9 (Callee Correctness) 
If $T$ is a transducer for $G$, $q$ is a callee, and $G_A^T(v) = T_A^Z(q)(v)$, for all $Z$, then $L_A(v) \subseteq L_A(q)(v)$.

Proof: by induction on definition of $L_A(v)$ using condition (T1) before applying the induction hypothesis and condition (T3) for the bind and nonterminal cases.

Theorem 10 (Transducer for Grammar Correctness) 
If $T$ is a transducer for $G$ then $L_T = L_G$.

Proof: with the above lemmas and the definitions of $L_T$ and $L_G$, we can directly show that $L_T \subseteq L_G$ and $L_G \subseteq L_T$, respectively, with the latter result relying on condition (T0).

5.4 Translation from Grammars to Transducers

The translation from data dependent grammars to transducers, presented in Figure 6, is an extension of the Thompson translation of regular expressions into automata. The first judgment, $S \Rightarrow r \rightarrow (s, F, T)$, states that right-hand side $r$ is translated into transducer graph $\mathcal{T}^s$ with start state $s$ and final state $F$. $S$ is a finite partial map from nonterminals to the start states for the automata implementing them. The second judgment, $G \Rightarrow T$, uses the first judgment to build transducer graphs for all right-hand sides of nonterminals in grammar $G$ and puts the results together to construct a complete transducer $T$. These judgments use the following notation.

- $[s \Rightarrow r \rightarrow t]$ is a transducer graph with a single arc of sort $z$ from states $s$ to $t$.
- $[s \Rightarrow r \rightarrow t]$ is a transducer graph with a single epsilon transition from states $s$ to $t$. An epsilon transition is an abbreviation for the predicate transition $s \Rightarrow t$.

In a slight abuse of notation, we have overloaded meta-variable $T$ so it represents both transducer graphs (the set of nodes and edges making up the transducer relations) and full transducers (the graphs plus auxiliary information such as the black boxes, terminal alphabet, etc.).

- $T_1; T_2$ is the transducer graph built by taking the union of nodes and edges from graphs $T_1$ and $T_2$.
- $[s \Rightarrow r \rightarrow t]$ is the transducer graph with disconnected states $s$ and $t$.
- Given a transducer graph $T$, $[\Sigma, \Delta, \Phi, A_0, s_{A_0}, T]$ builds the transducer with graph $T$ and other components specified by $\Sigma, \Delta, \Phi, A_0$ and $s_{A_0}$.

We are able to prove the following lemma establishing the correctness of the right-hand side translation.

Lemma 11 (Rule Translation Correctness)

i. If $S \vdash r \rightarrow (s, F, T)$ then the following are true of transducer graph $T$:
   a. There are no final states in $T$.
   b. If $r \Rightarrow^* s$ then $s = S(A)$ in $T$.
   c. If $r \Rightarrow^*$ then $s = S(A)$ for some $A$.
   d. For all transitions of the form $s \Rightarrow^*$ and $\varepsilon \Rightarrow^*$, $x \neq y_0$.
ii. If $Z; E \Rightarrow r \rightarrow (s, F, T)$ then $Z; E \Rightarrow r \rightarrow (s, F, T)$.

Proof: Each part is proven independently, by induction on height of the first derivation. Intuitively, parts (ii) and (iv) help establish (T2) (no extra garbage in the language). Part (ii) helps establish (T1) (all $A(c)$ edges are implemented). Part (iii) helps establish (T3). Parts (ii) and (iii) help establish the language equivalence conditions specified in (T0), (T1), and (T2).

The Rule Translation Correctness Lemma, together with the definition of the grammar translation and Definition 8 is sufficient to prove that a transducer produced by the translation implements its grammar correctly.

Theorem 12 (Grammar Translation Correctness) 
If $G \Rightarrow T$ then $T$ is a transducer for $G$.

6. An Earley-style Parsing Algorithm

The stack evaluation relation, while informative as a semantics of the transducer, does not lend itself to efficient direct implementation. The nondeterministic nature of the relation could result in an exponential time bounds for parsing even relatively simple grammars, and nontermination for grammars with left-recursion. Therefore, in this section, we provide an alternative, Earley-style parsing algorithm that matches the transducer semantics, while (often) improving execution behavior.

6.1 The Algorithm

The traditional Earley algorithm proceeds by computing a set of Earley items for each position in the input. These items are computed from left to right: First the Earley set for input position 1 is computed, then the set for input position 2, etc. Each item contains information about what grammar rule is being parsed and how much of that grammar rule has been parsed as well as the position in the input where the parse for that rule started. A key aspect of the algorithm is that the Earley sets act like a memoization table — rather than re-parsing portions of the input multiple times like an exponential-time back-tracking algorithm would do, Earley saves work by reusing items from Earley sets. In Earley’s case, the algorithm works because context-free grammars are, well, context-free. Intuitively, in our case, an extension of the algorithm
\[
S \vdash r \leadsto (s, F, T)
\]

\[
\text{T-EPS} \quad S \vdash \epsilon \leadsto (s, F, [s \to F])
\]

\[
\text{T-TERM} \quad S \vdash c \leadsto (s, F, [s \to F])
\]

\[
\text{T-PRED} \quad S \vdash [e] \leadsto (s, F, [s \to F])
\]

\[
\text{T-BINDING} \quad S \vdash x = y \leadsto (s, F, [s \to F])
\]

\[
\text{T-BLACKBOX} \quad S \vdash \beta(e) \leadsto (s, F, [s \to F])
\]

\[
\text{T-A} \quad S \vdash x = A(e) \leadsto (s, F, [s \to F])
\]

\[
\text{T-SEQ} \quad S \vdash r_1 \leadsto (s_1, F_1, T_1) \quad S \vdash r_2 \leadsto (s_2, F_2, T_2)
\]

\[
T_3 = [s_1 \to s_1]; [s_2 \to s_2]; [F_1 \to F_1]; [F_2 \to F_2]
\]

\[
S \vdash r_1, r_2 \leadsto (s, F, T_1; T_2; T_3)
\]

\[
\text{T-ALT} \quad S \vdash r_1 \leadsto (s_1, F_1, T_1) \quad S \vdash r_2 \leadsto (s_2, F_2, T_2)
\]

\[
T_3 = [s_1 \to s_1]; [s_2 \to s_2]; [F_1 \to F_1]; [F_2 \to F_2]
\]

\[
S \vdash r_1, r_2 \leadsto (s, F, T_1; T_2; T_3)
\]

\[
\text{T-*} \quad T_2 = [s \to s_1]; [F_1 \to F_1]; [s \to s_1]
\]

\[
S \vdash r_1, s \leadsto (s, F, T_1; T_2)
\]

\[
\text{T-EMPTY} \quad S \vdash \text{empty} \leadsto (s, F, [s \not\to F])
\]

\[
\text{G} \leadsto T
\]

\[
R = [A_0 = \lambda y_0.r_{A_0}, \ldots, A_k = \lambda y_0.r_{A_k}]
\]

\[
s_{A_0}, \ldots, s_{A_k}, \text{ fresh}
\]

\[
S = [A_0 = s_{A_0}, \ldots, A_k = s_{A_k}]
\]

\[
S \vdash r_{A_i} \leadsto (s_i, F_i, T_i) \quad (i = 0, \ldots, k)
\]

\[
T_{\text{init}} = [s_{A_0} \to s_0]; \ldots; [s_{A_k} \to s_k]
\]

\[
T_{\text{final}} = [F_0 \leftarrow A_0]; \ldots; [F_k \leftarrow A_k]
\]

\[
T = T_0; \ldots; T_k; T_{\text{init}}; T_{\text{final}}
\]

\[
(\Sigma, \Delta, \Phi, A_0, R) \leadsto (\Sigma, \Delta, \Phi, A_0, s_{A_0}, T)
\]

**Figure 6.** Translation from grammars to transducers.

ET-INIT \quad \epsilon \in \text{tree}(0, 0, q_0, [y_0()]), q_0

ET-TERM \quad T \in \text{tree}(i, j, q, E, r) \quad r \xrightarrow{+} s
\]

\[
T_{c_j} \text{ in } \text{tree}(i, j, q, E, s)
\]

ET-PRED \quad T \in \text{tree}(i, j, q, E, r) \quad r \xrightarrow{-} s
\]

\[
[e]E = \text{true}
\]

\[
T \in \text{tree}(i, j, q, E, s)
\]

ET-BIND \quad \epsilon \in \text{tree}(i, j, q, E, s)
\]

\[
[s, F, \beta(e)]
\]

ET-BLACKBOX \quad [e]E = v
\]

\[
T(c_k, c_j) \in \text{tree}(i, j, q, E, s)
\]

ET-CALL \quad T \in \text{tree}(i, j, q, E, r) \quad r \xrightarrow{\text{call}(e)} s
\]

\[
[e]E = v
\]

\[
T \in \text{tree}(i, j, q, E, s)
\]

ET-RETURN \quad T \in \text{tree}(i, k, q, E, r) \quad T_2 \in \text{tree}(i, k, q, E, s)
\]

\[
T_2.x: A(v)(T_1) \in \text{tree}(i, j, s, E_2[x=\text{leaves}(T_1)], u)
\]

**Figure 7.** The Earley Sets

will work because we include the local context \(E\) in our modified Earley sets and, crucially, because, as stated by the Context Independence Lemma (Lemma 4), parsing a particular grammar rule only depends upon that local context, not on the tail of the stack.

With that background in mind, we present our modified Earley algorithm. The Earley sets involved in our algorithm are indexed sets of parse trees (forests). A tree \(T\) belongs to the set \(\text{tree}(i, j, q, E, r)\) when that tree is constructed by parsing the input from position \(i+1\) to position \(j\). The parse of this subexpression must have begun with the transducer in callee state \(q\) and ended with the transducer in state \(r\). Environment \(E\) is the environment that was built during the course of the parse.

Figure 7 gives a declarative presentation of our early algorithm by specifying the trees that belong to each earley set. The first five rules define tree construction when no subtrees are involved and are quite similar to their counterparts (by name) in the definition of the stack evaluation relation. Rule ET-TERM refers to character \(c_j\) — the \(j^{th}\) symbol in the input string.

Rules ET-CALL and ET-RETURN control the construction of subtrees. ET-CALL adds an empty tree to the forest whose start index matches the current index of the caller and whose callee is related to the current state via a call edge. \(^5\) ET-RETURN finds a parse tree for some nonterminal \(A\) (that is, the tree is a member of a forest whose state is a final state for \(A\)) and looks at all the potential parents of that tree. They are found via the following criteria: their current position is \(k\), their current state calls the callee state, they transition on \(A\), and the value of \(A\’s\ argument in the

\(^5\) The latter criterion is characteristic of Earley’s algorithm in that it ensures that a subparse is only attempted if it is “predicted” by the grammar (transducer).
context of the parent tree’s forest must match the value of the
calling argument recorded in the context of the subtree’s forest.

Based on the tree sets defined in Figure 7, we define Earley
parsing as follows:

Definition 9 (Earley Parsing)
If \( T \in \text{tree}(0, j, q_0, E, r) \) and \( r \mapsto A_0 \) then Earley(\( c_1 \ldots c_j \)) =
\[ \text{tree}(0, j, q_0, E, r). \]

Therefore, we can say that an entire string \( w = c_1 \ldots c_n \) is suc-
cessfully parsed if Earley(\( w \)) = \( S \neq \emptyset \). Moreover, \( S \) contains all
possible parse trees for \( w \).

We note that our declarative rules do not specify the order
in which to construct the Earley sets, and many different orders
are possible. The simplest order to use is to build the parse trees
in a breadth-first fashion, moving left to right through the input:
initialize \( \text{tree}(0, 0, q_0, [y_0=()], q_0) \) to \( \epsilon \) (as specified by rule ET-
INIT) and then, for each index \( j \) from 0 to the size of the input,
apply all rules which add a tree to some forest whose second
index is \( j \), until those forests stop changing. There are a number
of potential optimizations one could apply to this algorithm, but
exploring them is beyond the scope of this paper.

6.2 Correctness
We would like to be sure that our algorithm matches the transducer
semantics defined earlier. We therefore show that for every tree
derivable in one schema, a corresponding tree is derivable in the
other schema. We first show that the Earley algorithm is sound with
respect to the stack semantics.

Theorem 13 (Earley Soundness)
If \( T \in \text{tree}(i, j, q, E, r) \) then there exists \( x \) such that
\( \langle q_0, [y_0=()], \epsilon, q_0 \rangle \Rightarrow^\star \langle q, E, T, r \rangle :: x \).

Proof: by induction on the derivation that \( T \in \text{tree}(i, j, q, E, r) \).

Next, we show that the Earley algorithm is complete. First,
though, we extend the definition of \( \text{leaves}(\cdot) \) to stacks:
\[ \text{leaves}(q, E, T, r) ::= \text{leaves}(tl) \text{leaves}(\text{T}) \]

Theorem 14 (Earley Completeness)
If \( \langle q_0, [y_0=()], \epsilon, q_0 \rangle \Rightarrow^\star \langle q, E, T, r \rangle :: tl \), \( \text{leaves}(tl) = c_1 \ldots c_i \),
\( \text{leaves}(T) = c_{i+1} \ldots c_j \), then \( T \in \text{tree}(i, j, q, E, r) \).

Proof: by induction on height of \( \Rightarrow^\star \) derivation.

Corollary 15 (Earley Parsing Simulates Transducer Execution)
\( T \in \text{Earley}(w) \) iff \( \langle q_0, [y_0=()], \epsilon, q_0 \rangle \Rightarrow^\star \langle q_0, E, T, r \rangle \) and \( r \mapsto A_0 \).

6.3 Running Time
We now turn to the issue of the running time and termination of
an algorithm implementing the rules of Figure 7, assuming that
such an algorithm does not needlessly revisit elements for which
all possible rules have already been applied. Given an input string
of length \( n \), Earley showed a time bound of \( O(n^3) \) for his original
algorithm\(^6\) [5]. Our extension enjoys a \( \text{pay-as-you-go} \) property, with
the following consequences:

1. In the case that a context-free grammar is specified, we re-
tain the \( O(n^3) \) bound, given an efficient representation of tree
sets (for example, the binarised Shared Packed Parse Forests
(SPPFS) used by Scott [29]).

2. In the case that the full features of our system are used, the
algorithm is guaranteed to terminate on all inputs, if (a) all
expressions within the grammar terminate, (b) the size of values
in environments is bounded, (c) all blackboxes terminate, (d)
the size of tree attributes is bounded and (e) tree sets have a
finite representation.

3. In the case that one or more of the above conditions are violated,
no guarantees can be made. Note, though, that those are suffi-
cient, but not necessary conditions, because exact behaviour of
the algorithm will usually depend upon the particular input.

7. Related Work
Throughout the paper, we have mentioned a number of important
related systems — we will not reiterate all of the points of com-
parison with those systems here. However, please recall the major
differences between our system and systems for Generalized LR
(GLR) include our support for direct compilation of regular-right
sides, attribute-directed parsing and blackboxes. Regarding Parsing
Expression Grammars (PEGs), we are additionally distinguished
by the compositionality properties of our formalism. These com-
positionality properties also distinguish us from the various data
description languages such as PADS [7, 22] and the Data Description
Calculus formalism [8].

Attribute grammars (AGs) are a very powerful extension of
context-free grammars originally proposed by Knuth for defin-
ing the semantics of programming languages [18]. Much work in
AGs has been devoted to finding tractable and efficient restrictions,
such as those based on LR or LL grammars [17, 26]. Within at-
tribute grammars, our calculus corresponds most closely to the L-
attributed grammars [21]; our nonterminal parameters correspond
to inherited attributes, and our environments and bindings overlap
with synthesized attributes. Watt introduced the idea of directed
parsing [33], and applied it to the LR fragment of context-free lan-
guages. Correa [3] and Tokuda and Watanabe [31] have extended
Earley’s algorithm to L-attributed grammars, though omitting fea-
tures such as our environments, regular right sides, and blackboxes;
Correa implemented attribute-directed parsing.

Woods’ augmented-transition networks (ATNs) [34] are an au-
tomaton formalism closely related to our data-dependent automata.
They support all context-free languages, regular right-hand sides
and attribute-directed parsing. Moreover, Chou and Fu describe an
Earley-style algorithm capable of parsing with ATNs [2]. However,
they differ in a number of subtle, yet important, details. First, ATNs
are lower-level than our transducers (for example, requiring explicit
stack manipulation to handle call arguments and return values) and
are specified directly, rather than with a grammar which can be
compiled into an ATN. Woods does not present any such high-level
grammar formalism, nor state or prove any correspondence to some
existing grammar formalism, as we have. In addition, ATNs do not
support merging the automata of multiple nonterminals, because
final states are not labeled with their corresponding nonterminal.
ATNs do not support blackboxes, although they could be extended
to do so in the same way as we have done in our formalism. Finally,
to the best of our knowledge, the literature on ATNs does not in-
clude proofs of correctness of the Earley algorithm with respect to
a transducer semantics.

Finally, as we have mentioned before in the paper, this pa-
per builds on our previous work on Earley parsing for context-
free grammars with regular right sides [15], extending it to handle
attribute-directed parsing and blackboxes. Also new in this paper is
the presentation of a comprehensive meta-theoretic framework in
which we show how to prove the correspondence between gram-
mars, transducers and Earley parsing.
8. Conclusion
Modern programmers require modern parser generators. Parsing is still very much an essential element of software systems in nearly every area of software development, yet the technology underlying the most common tools is outdated and the tools, therefore, largely irrelevant. Promising advances are still being made in support of full context-free grammars, most notably surrounding the GLR algorithm. Yet, we believe, and have attempted to demonstrate with a number of examples, that even support for all context-free grammars is not enough for many mundane parsing tasks, particularly in the area of systems programming. Features like scannerless parsing, data-dependence, and blackbox support are crucial to meet the many and varied demands of modern programmers.

We have presented a concise formalism which incorporates all of these features into one framework. We have demonstrated the utility and necessity of its features with a variety of examples and formalized its syntax and semantics. We have also presented and formalized the novel data-dependent automata, which are capable of parsing the languages of data-dependent grammars. We have specified sufficient conditions under which an automaton can be said to implement a grammar, proven that under those conditions the language of the automaton matches the language of the grammar, and presented an example compilation from grammars to automata that satisfies the sufficient conditions. Finally, we have presented and proven correct an (often) efficient algorithm for parsing with data-dependent automata based on Earley’s classic algorithm for parsing the full range of context-free grammars.

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