# Algorithms & Models of Computation

CS/ECE 374, Spring 2019

# **Context Free Languages and Grammars**

Lecture 7 Tuesday, February 5, 2019

LATEXed: December 27, 2018 08:25

## What stack got to do with it?

What's a stack but a second hand memory?

- DFA/NFA/Regular expressions.
   = constant memory computation.
- 2 Turing machines  $\frac{DFA}{NFA}$  + unbounded memory.  $\equiv$  a standard computer/program.

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## What stack got to do with it?

What's a stack but a second hand memory?

- DFA/NFA/Regular expressions.≡ constant memory computation.
- NFA + stack≡ context free grammars (CFG).
- Turing machines DFA/NFA + unbounded memory.
  - $\equiv$  a standard computer/program.
  - $\equiv$  NFA with two stacks.

## Context Free Languages and Grammars

- Programming Language Specification
- Parsing
- Natural language understanding
- Generative model giving structure
- . . .

## Programming Languages

```
<relational-expression> ::= <shift-expression>
                           <relational-expression> < <shift-expression>
                           <relational-expression> > <shift-expression>
                           <relational-expression> <= <shift-expression>
                           <relational-expression> >= <shift-expression>
<shift-expression> ::= <additive-expression>
                      <shift-expression> << <additive-expression>
                      <shift-expression> >> <additive-expression>
<additive-expression> ::= <multiplicative-expression>
                         <additive-expression> + <multiplicative-expression>
                         <additive-expression> - <multiplicative-expression>
<multiplicative-expression> ::= <cast-expression>
                               <multiplicative-expression> * <cast-expression>
                               <multiplicative-expression> / <cast-expression>
                               <multiplicative-expression> % <cast-expression>
<cast-expression> ::= <unary-expression>
                   ( <type-name> ) <cast-expression>
<unary-expression> ::= <postfix-expression>
                      ++ <unary-expression>
                      -- <unary-expression>
                      <unary-operator> <cast-expression>
                      sizeof <unary-expression>
                      sizeof <type-name>
<postfix-expression> ::= <primary-expression>
                        <postfix-expression> [ <expression> ]
                        <postfix-expression> ( {<assignment-expression>}* )
                        <postfix-expression> . <identifier>
                        <postfix-expression> ++
                        <postfix-expression> --
```

## Natural Language Processing

#### English sentences can be described as

```
 \begin{split} \langle S \rangle &\rightarrow \langle NP \rangle \langle VP \rangle \\ \langle NP \rangle &\rightarrow \langle CN \rangle \mid \langle CN \rangle \langle PP \rangle \\ \langle VP \rangle &\rightarrow \langle CV \rangle \mid \langle CV \rangle \langle PP \rangle \\ \langle PP \rangle &\rightarrow \langle P \rangle \langle CN \rangle \\ \langle CN \rangle &\rightarrow \langle 4 \rangle \langle N \rangle \\ \langle CV \rangle &\rightarrow \langle V \rangle \mid \langle V \rangle \langle NP \rangle \\ \langle 4 \rangle &\rightarrow a \mid \text{the} \\ \langle N \rangle &\rightarrow \text{boy} \mid \text{girl} \mid \text{flower} \\ \langle V \rangle &\rightarrow \text{touches} \mid \text{likes} \mid \text{sees} \\ \langle P \rangle &\rightarrow \text{with} \end{split}
```

#### English Sentences Examples

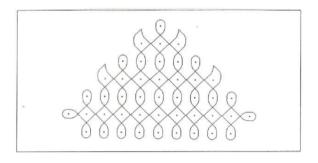
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## Models of Growth

- *L*-systems
- http://www.kevs3d.co.uk/dev/lsystems/



## Kolam drawing generated by grammar



#### **Definition**

- V is a finite set of non-terminal symbols
- T is a finite set of terminal symbols (alphabet)
- P is a finite set of productions, each of the form  $A \to \alpha$  where  $A \in V$  and  $\alpha$  is a string in  $(V \cup T)^*$ . Formally,  $P \subset V \times (V \cup T)^*$ .
- $S \in V$  is a start symbol

$$G = ($$
 Variables, Terminals, Productions, Start var  $)$ 

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- $V = \{S\}$
- $T = \{a, b\}$
- $P = \{S \rightarrow \epsilon \mid a \mid b \mid aSa \mid bSb\}$ (abbrev. for  $S \rightarrow \epsilon, S \rightarrow a, S \rightarrow b, S \rightarrow aSa, S \rightarrow bSb)$

What strings can **S** generate like this?

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## Example formally...

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ight\} \quad S \quad 
ight)$$

#### **Palindromes**

- Madam in Eden I'm Adam
- Dog doo? Good God!
- Dogma: I am God.
- A man, a plan, a canal, Panama
- Are we not drawn onward, we few, drawn onward to new era?
- Doc, note: I dissent. A fast never prevents a fatness. I diet on cod.
- http://www.palindromelist.net

$$L = \{0^n 1^n \mid n \geq 0\}$$

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$$\mathcal{S} 
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#### Notation and Convention

Let G = (V, T, P, S) then

- $a, b, c, d, \ldots$ , in T (terminals)
- $A, B, C, D, \ldots$ , in V (non-terminals)
- u, v, w, x, y, ... in  $T^*$  for strings of terminals
- $\alpha, \beta, \gamma, \ldots$  in  $(V \cup T)^*$
- $\bullet$  X, Y, X in  $V \cup T$

## "Derives" relation

Formalism for how strings are derived/generated

#### Definition

Let G = (V, T, P, S) be a CFG. For strings  $\alpha_1, \alpha_2 \in (V \cup T)^*$  we say  $\alpha_1$  derives  $\alpha_2$  denoted by  $\alpha_1 \leadsto_G \alpha_2$  if there exist strings  $\beta, \gamma, \delta$  in  $(V \cup T)^*$  such that

- $\alpha_1 = \beta A \delta$
- $\alpha_2 = \beta \gamma \delta$
- $A \rightarrow \gamma$  is in P.

Examples:  $S \rightsquigarrow \epsilon$ ,  $S \rightsquigarrow 0S1$ ,  $0S1 \rightsquigarrow 00S11$ ,  $0S1 \rightsquigarrow 01$ .

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## "Derives" relation continued

#### Definition

For integer  $k \geq 0$ ,  $\alpha_1 \rightsquigarrow^k \alpha_2$  inductive defined:

- $\bullet \ \alpha_1 \leadsto^0 \alpha_2 \text{ if } \alpha_1 = \alpha_2$
- $\bullet$   $\alpha_1 \rightsquigarrow^k \alpha_2$  if  $\alpha_1 \rightsquigarrow \beta_1$  and  $\beta_1 \rightsquigarrow^{k-1} \alpha_2$ .
- ullet Alternative definition:  $lpha_1 \leadsto^k lpha_2$  if  $lpha_1 \leadsto^{k-1} eta_1$  and  $eta_1 \leadsto lpha_2$

√\* is the reflexive and transitive closure of √→.

 $\alpha_1 \rightsquigarrow^* \alpha_2$  if  $\alpha_1 \rightsquigarrow^k \alpha_2$  for some k.

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## Context Free Languages

#### **Definition**

The language generated by CFG G = (V, T, P, S) is denoted by L(G) where  $L(G) = \{w \in T^* \mid S \rightsquigarrow^* w\}$ .

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$$L = \{0^n 1^m \mid m > n\}$$

$$L = \{w \in \{(,)\}^* \mid w \text{ is properly nested string of parenthesis}\}$$

 $G_1 = (V_1, T, P_1, S_1)$  and  $G_2 = (V_2, T, P_2, S_2)$ Assumption:  $V_1 \cap V_2 = \emptyset$ , that is, non-terminals are not shared

#### Theorem

CFLs are closed under union.  $L_1, L_2$  CFLs implies  $L_1 \cup L_2$  is a CFL.

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CFLs are closed under concatenation.  $L_1$ ,  $L_2$  CFLs implies  $L_1 \cdot L_2$  is a CFL.

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If **L** is a CFL  $\implies$  **L**\* is a CFL.

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Stardom (i.e, Kleene star)

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#### Exercise

- Prove that every regular language is context-free using previous closure properties.
- ullet Prove the set of regular expressions over an alphabet  $oldsymbol{\Sigma}$  forms a non-regular language which is context-free.

## Closure Properties of CFLs continued

#### Theorem

CFLs are not closed under complement or intersection.

#### **Theorem**

If  $L_1$  is a CFL and  $L_2$  is regular then  $L_1 \cap L_2$  is a CFL.

### Canonical non- $\operatorname{CFL}$

#### Theorem

 $L = \{a^n b^n c^n \mid n \ge 0\}$  is not context-free.

Proof based on pumping lemma for CFLs. Technical and outside the scope of this class.

## Parse Trees or Derivation Trees

A tree to represent the derivation  $S \rightsquigarrow^* w$ .

- Rooted tree with root labeled S
- Non-terminals at each internal node of tree
- Terminals at leaves
- Children of internal node indicate how non-terminal was expanded using a production rule

A picture is worth a thousand words

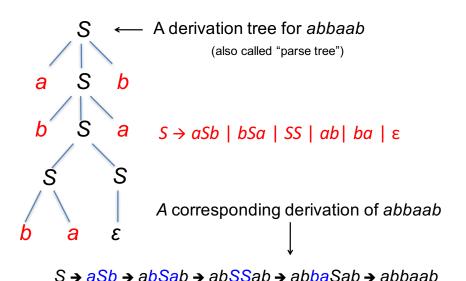
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# Example

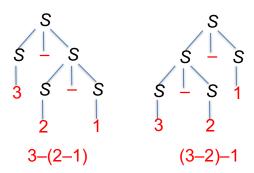


# Ambiguity in CFLs

## Definition |

A CFG G is ambiguous if there is a string  $w \in L(G)$  with two different parse trees. If there is no such string then G is unambiguous.

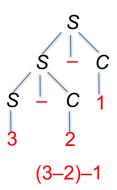
Example:  $S \rightarrow S - S \mid 1 \mid 2 \mid 3$ 



# Ambiguity in CFLs

- Original grammar:  $S \rightarrow S S \mid 1 \mid 2 \mid 3$
- Unambiguous grammar:

$$S \to S - C \mid 1 \mid 2 \mid 3$$
  
 $C \to 1 \mid 2 \mid 3$ 



The grammar forces a parse corresponding to left-to-right evaluation.

# Inherently ambiguous languages

## **Definition**

A CFL L is inherently ambiguous if there is no unambiguous CFG G such that L = L(G).

- There exist inherently ambiguous CFLs. **Example:**  $L = \{a^n b^m c^k \mid n = m \text{ or } m = k\}$
- Given a grammar **G** it is undecidable to check whether **L**(**G**) is inherently ambiguous. No algorithm!

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# Inductive proofs for CFGs

**Question:** How do we formally prove that a CFG L(G) = L?

Example:  $S \rightarrow \epsilon \mid a \mid b \mid aSa \mid bSb$ 

#### Theorem

$$L(G) = \{palindromes\} = \{w \mid w = w^R\}$$

Two directions:

- $L(G) \subseteq L$ , that is,  $S \rightsquigarrow^* w$  then  $w = w^R$
- $L \subseteq L(G)$ , that is,  $w = w^R$  then  $S \rightsquigarrow^* w$

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# $L(G) \subseteq L$

Show that if  $S \rightsquigarrow^* w$  then  $w = w^R$ 

By induction on length of derivation, meaning For all  $k \ge 1$ ,  $S \rightsquigarrow^{*k} w$  implies  $w = w^R$ .

- If  $S \rightsquigarrow^1 w$  then  $w = \epsilon$  or w = a or w = b. Each case  $w = w^R$ .
- Assume that for all k < n, that if  $S \rightarrow^k w$  then  $w = w^R$
- Let  $S \rightsquigarrow^n w$  (with n > 1). Wlog w begin with a.
  - Then  $S \to aSa \leadsto^{k-1} aua$  where w = aua.
  - And  $S \rightsquigarrow^{n-1} u$  and hence IH,  $u = u^R$ .
  - Therefore  $w^r = (aua)^R = (ua)^R a = au^R a = aua = w$ .

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# $L \subseteq L(G)$

Show that if  $w = w^R$  then  $S \rightsquigarrow^* w$ .

By induction on |w|That is, for all  $k \ge 0$ , |w| = k and  $w = w^R$  implies  $S \rightsquigarrow^* w$ .

**Exercise:** Fill in proof.

## Mutual Induction

Situation is more complicated with grammars that have multiple non-terminals.

See Section 5.3.2 of the notes for an example proof.

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Advantage: Simpler/more convenient algorithms and proofs

Two standard normal forms for CFGs

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- Greibach normal form

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- Productions are all of the form  $A \to BC$  or  $A \to a$ . If  $\epsilon \in L$  then  $S \to \epsilon$  is also allowed.
- ullet Every CFG  $oldsymbol{G}$  can be converted into CNF form via an efficient algorithm
- Advantage: parse tree of constant degree.

#### Greibach Normal Form:

- ullet Only productions of the form A o aeta are allowed.
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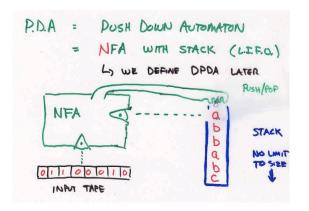
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# Things to know: Pushdown Automata

PDA: a NFA coupled with a stack



PDAs and CFGs are equivalent: both generate exactly CFLs. PDA is a machine-centric view of CFLs.