

Languages and machines

The meaning of language and limits of computation

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April 11, 2019

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Goals

1. Give you an overview of language classes and machine types
2. Don't just think about computable/non-computable; Think about computable *with what*
3. Subsets of Turing Complete; next week, supersets

Concatenation

Mathy Definitions

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Language over alphabet $\Sigma :=$ subset of Σ^*

The strings are considered 'valid words' of the language.

Definitions

Formal Grammar $:=$

- ▶ finite set of terminals (convention: lowercase)
- ▶ finite set of nonterminals (convention: uppercase)
- ▶ start symbol (convention: S)
- ▶ finite set of rules (pair of strings)

Grammars generate languages.

Abstract Machine $:=$?

Machines can decide if a string is in a language.

Grammar semantics

- ▶ $G := (a-z, A-Z, S, \text{the following rules})$
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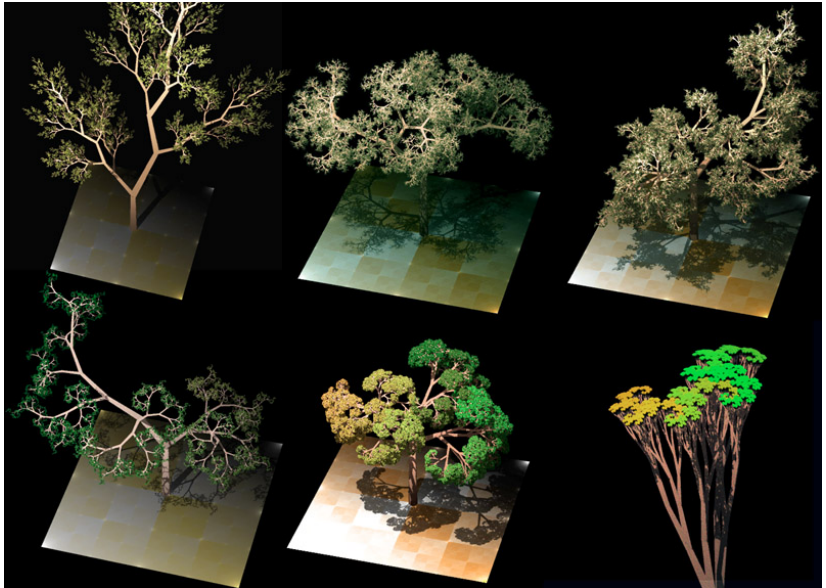
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- ▶ The language generated by G is $\{a^n b^n \mid n \in \mathbb{N}\}$.

Lindenmayer system



Lindenmayer system



Grammar \iff machine

Grammar generates string in the language

Machine recognizes a string that is in the language

Language relates to computing

- ▶ Consider language L consisting of factorials $\{ "1", "1", "2", "6", "24", \dots \}$

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- ▶ Consider language L consisting of factorials $\{ "1", "1", "2", "6", "24", \dots \}$
- ▶ A generator/recognizer would have to compute the factorial.

Language hierarchy

simple languages, quick machines \Rightarrow complex
languages, slow machines

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Chomsky Hierarchy (1956):

Language class	Grammar	Type of machine
Regular	$A \rightarrow Yz$	deterministic finite-state automata
Context-free	$A \rightarrow \gamma$	deterministic pushdown automata
Context-sensitive	$\alpha A \beta \rightarrow \alpha \gamma \beta$	linear-bounded non-deterministic Turing machine
Recursively Enumerable	$\alpha \rightarrow \beta$	Turing machine

where α, β, γ : strings of terminals and non-terminals

Language hierarchy

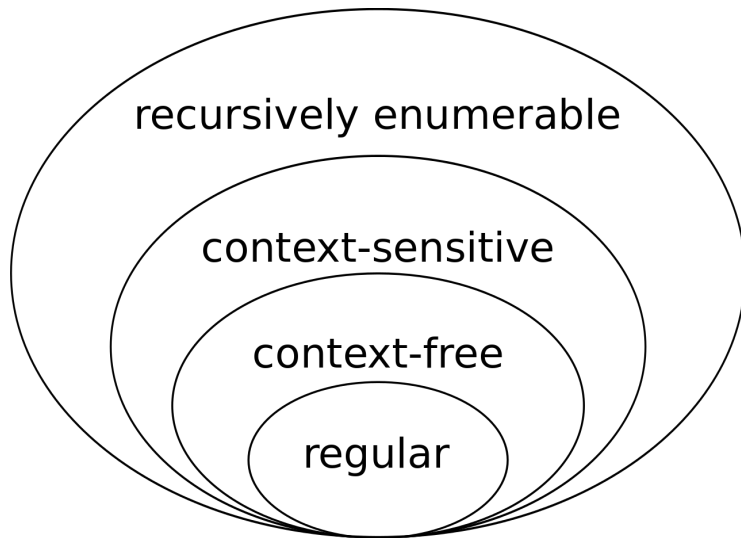


Figure from [WikiMedia](#)

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Example language: Multiples of 3 in binary notation

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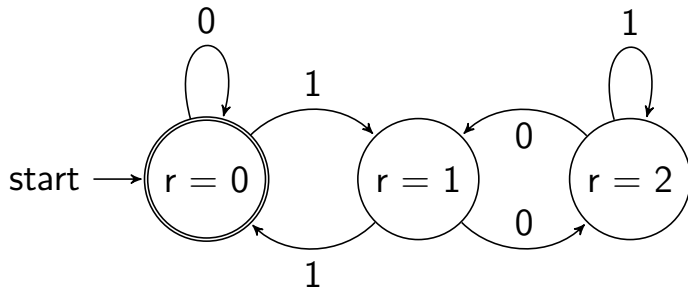
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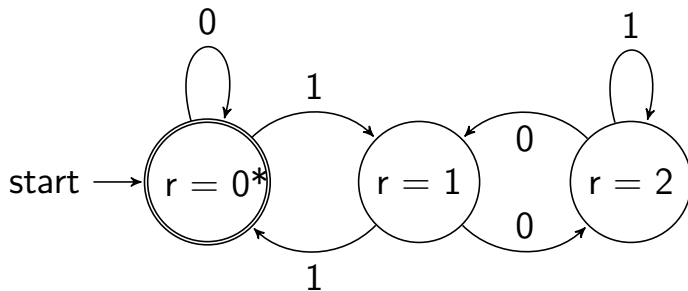
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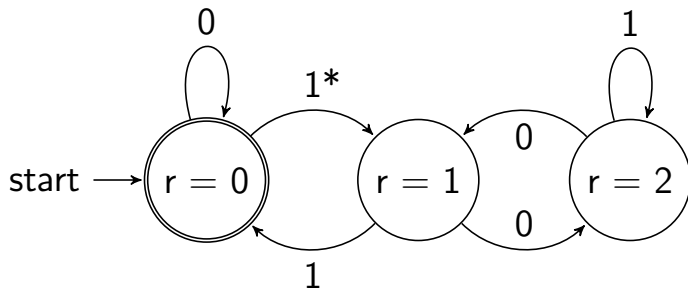


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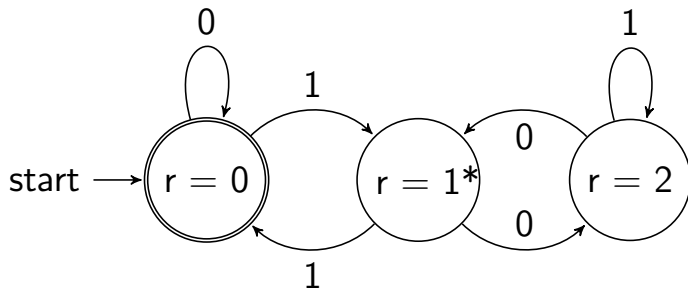
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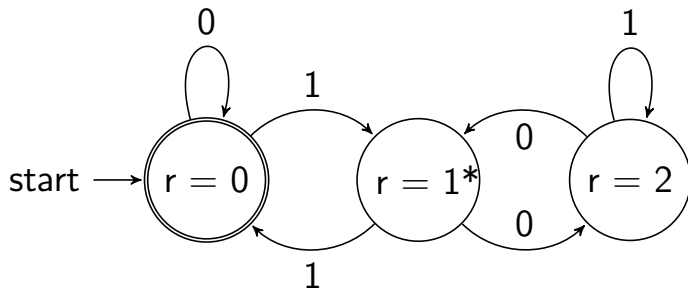
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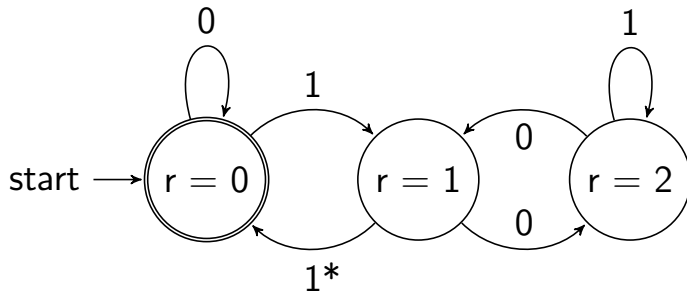
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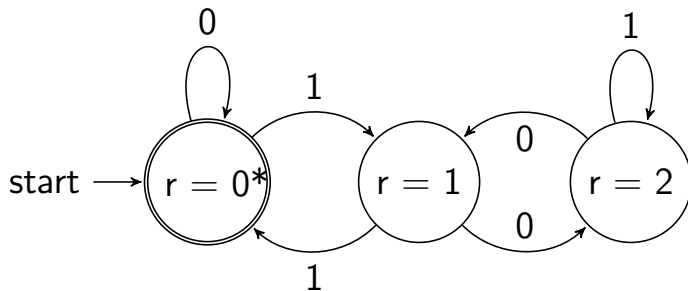
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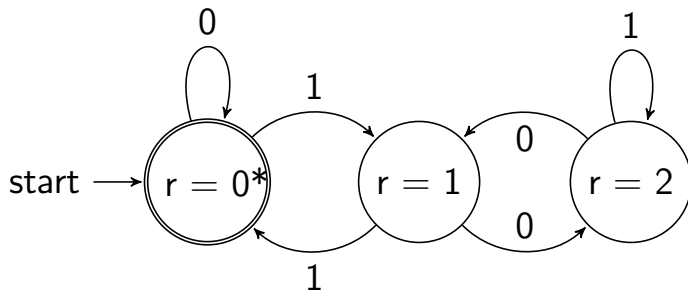
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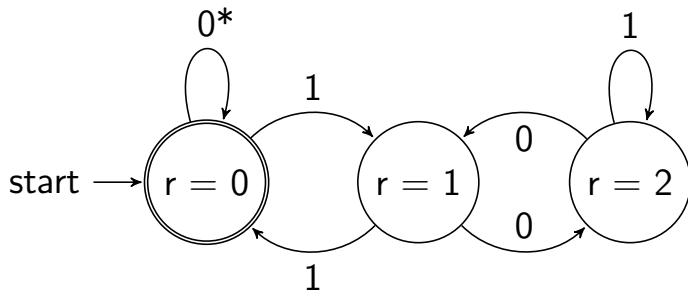
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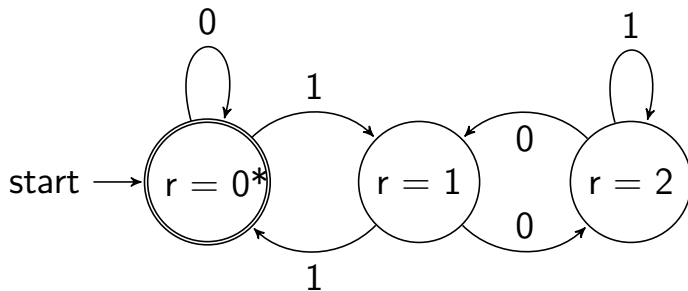
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Deterministic Finite-state Automata

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- ▶ $f : S \times \Sigma \rightarrow S$: state-transition function

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NFA

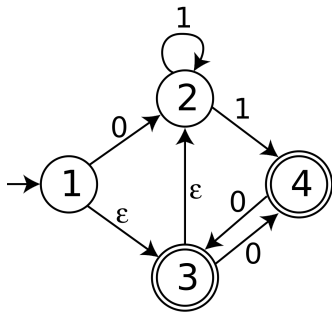
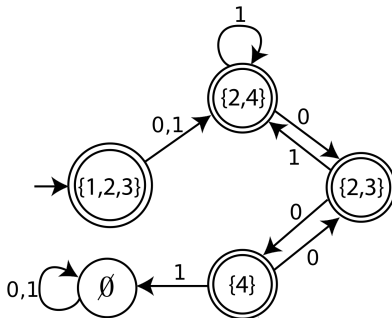
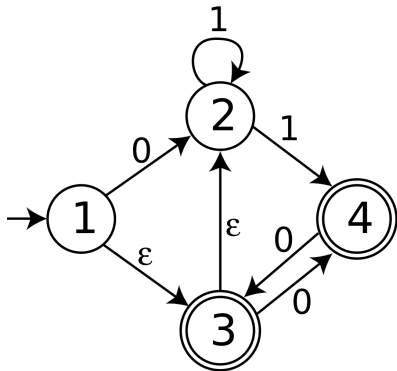
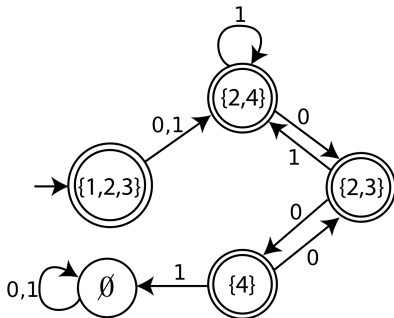
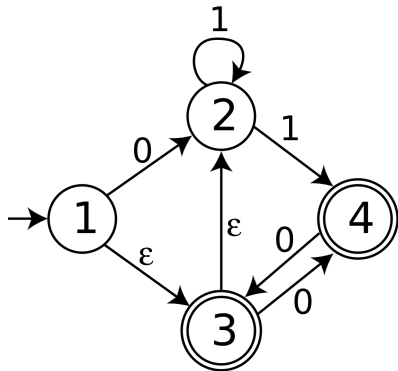


Figure from [WikiMedia](#)

NFA \iff DFA



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possibly n states $\rightarrow 2^n$ states, worst-case.

Figure 1 from [WikiMedia](#)

Figure 2 from [WikiMedia](#)

Regular grammar

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Likewise $A \rightarrow a_1a_2 \cdots a_nB$ by $A \rightarrow a_1A_1$,
 $A_1 \rightarrow a_2A_2, \cdots, A_n \rightarrow a_nB$.

Regular Grammar example

Example language: Multiples of 3 in binary notation

remainder $x \pmod{3}$	after appending 0 $x.0 \pmod{3}$	after appending 1 $x.1 \pmod{3}$
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$A \rightarrow 0A$

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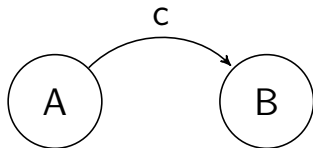
$C \rightarrow 1C$

$A \rightarrow \varepsilon$

$S \rightarrow A$

TODO: redraw DFA

NFA \iff Regular Grammar



Transition, $A \rightarrow cB$, corresponds to rule,

Start state = starting symbol, ending states $\rightarrow \epsilon$

Useful for proofs.

Properties of Regular Languages

Languages with arbitrary repetition and optional elements.

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Algorithm to minimize (1979)

always halts; linear time

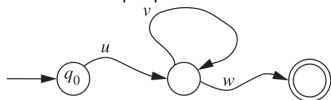
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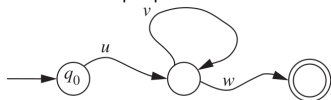
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Now x can be decomposed into uvw where v can be repeated, so $uv^i w \in L$ also.

Note that v is non-empty and $|uv| \leq n$.

Figure from "Introduction to Languages and the Theory of Computation" by John C. Martin

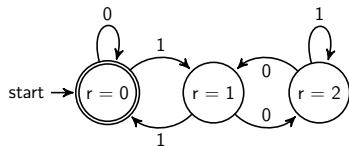
Pumping lemma (1969)

Given a regular language, L ,

There exists $n \in \mathbb{N}$ such that

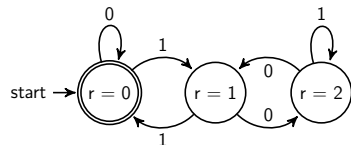
- ▶ For all $x \in L$ and $|x| > n$
 - ▶ There exists u, v, w where
 1. $x = uvw$
 2. $v \neq \varepsilon$
 3. $|uv| \leq n$
 4. $uv^i w \in L$ for all $i \in \mathbb{N}$

Pumping lemma example



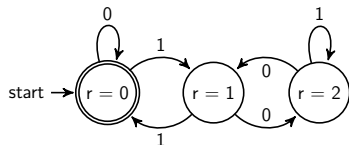
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- ▶ We can pump the double-zeros. $1(00)^n1$ is divisible by three.
- ▶ Indeed $1 + 2^{1+2n} \pmod{3} = 1 + (-1) = 0$.

More difficult languages

► $L = \{a^n b^n : n \in \mathbb{N}\}.$

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For every n , no less than n -long substring of $a^n b^n$ can be pumped up.
- ▶ Language where length of strings is not “eventually linear”
- ▶ Challenge: L is not regular, but L^2 is.

Pushdown Automata

Definition

Non-/Deterministic pushdown automata $:=$

- ▶ S : a finite set of states
- ▶ $A \subseteq S$: a set of accepting states
- ▶ $S_0 \in S$: an initial state
- ▶ Σ : a finite alphabet for words
- ▶ Γ : a stack alphabet
- ▶ Γ_0 : an initial stack symbol
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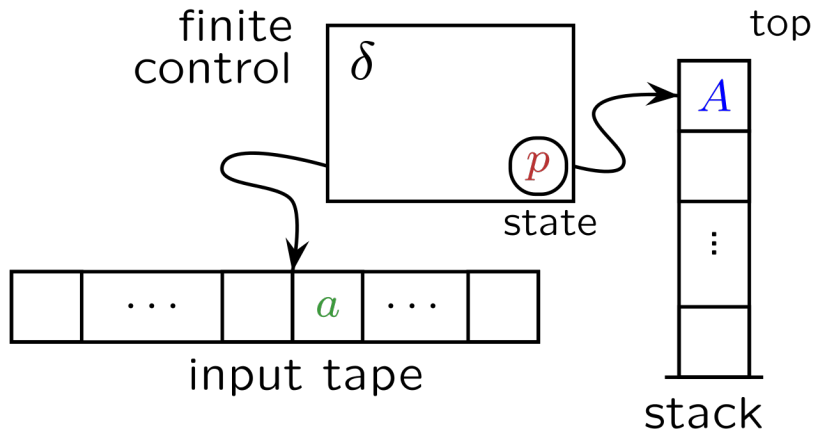
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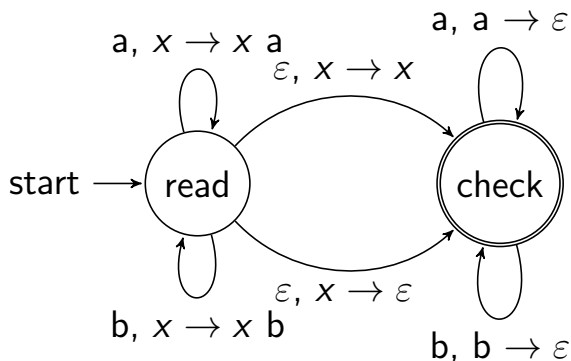
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Accept by empty stack

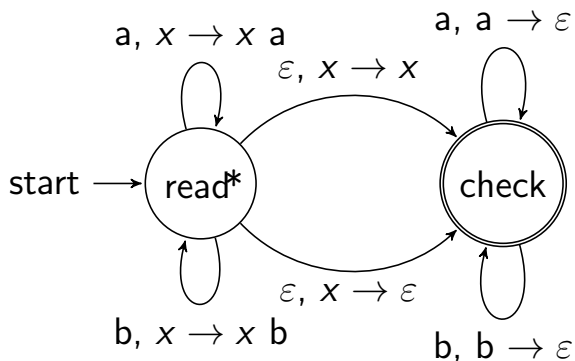
Pushdown Automata



Pushdown Automata Example



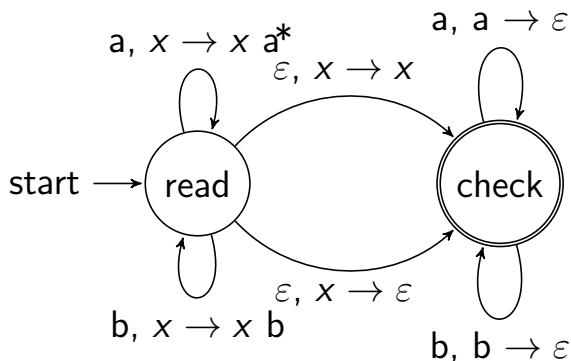
Pushdown Automata Example



Input: **a**bbba

Stack: H

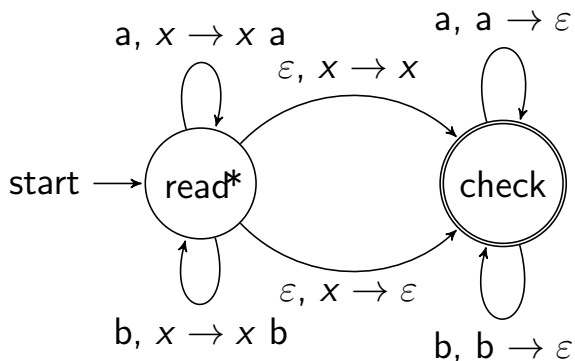
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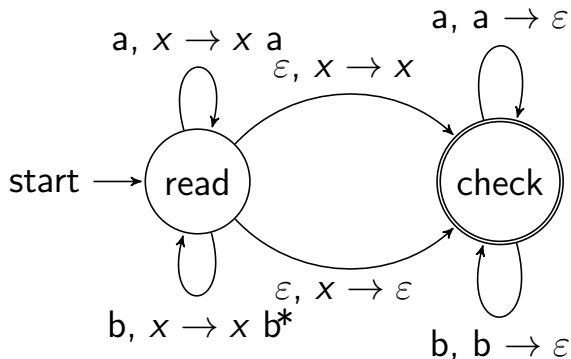
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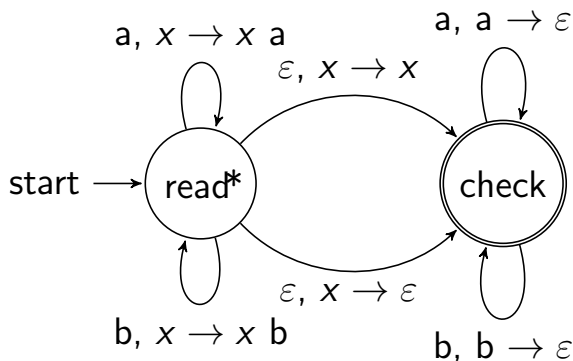
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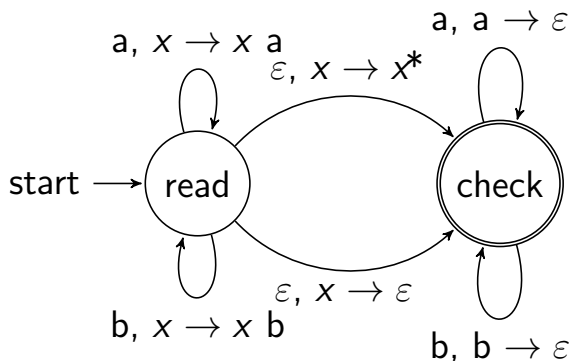
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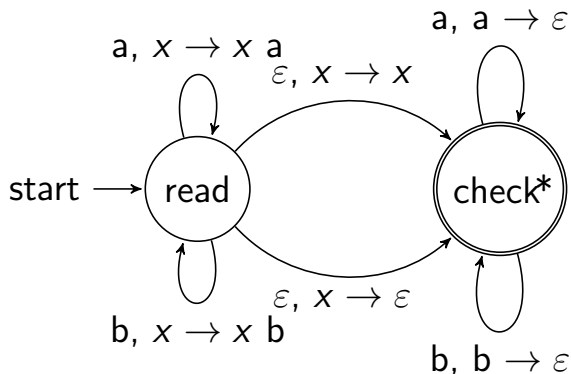
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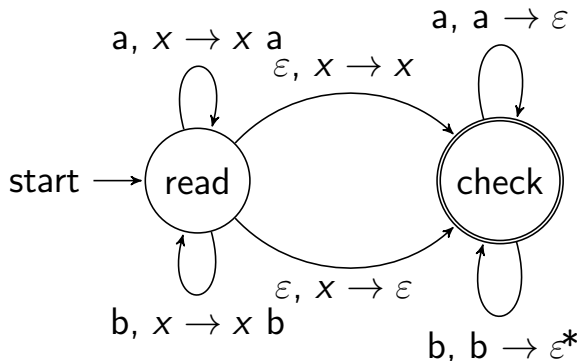
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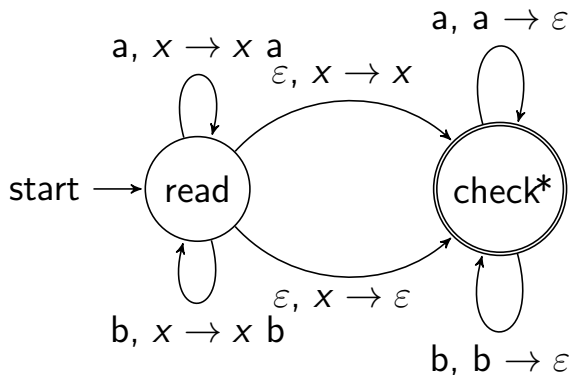
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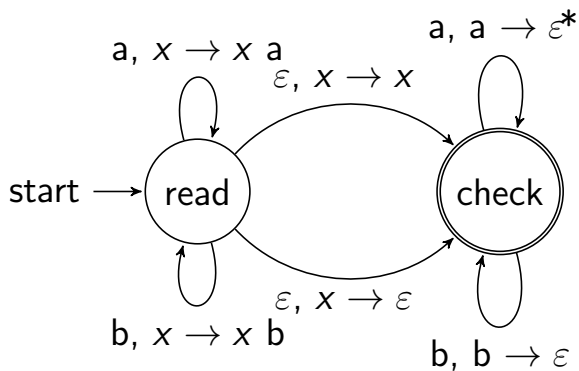
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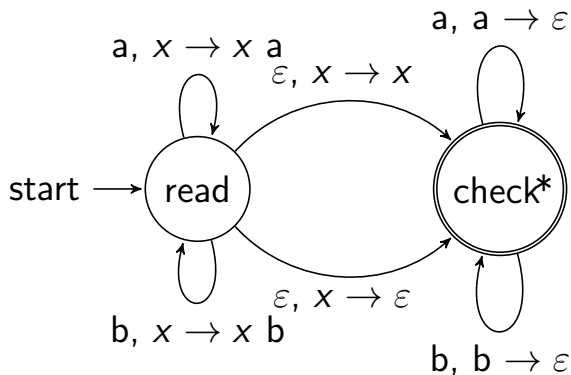
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Input: abb**a**

Stack: Ha

Pushdown Automata Example



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Stack: H

Examples

Matched named brackets

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Matched named brackets

State: If left bracket, push bracket-type to stack. If right bracket and correct bracket-type on stack, pop from stack.

Definition

Context-free grammar := Grammar where all rules are of the form $A \rightarrow \alpha$, where $\alpha \in (\Sigma \cup \Gamma)^*$.

Encodes everything a regular grammar can
(repetition, optionals) + “arbitrary nestedness”

- Matched-brackets

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► Palindromes similar

CFGs in the wild

Named brackets

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Named brackets

```
<html>  
  <body>  
    <h1>This is the tile</h1>  
    <p>This is a paragraph.</p>  
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Programming languages

95% of natural languages

Parse trees

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$[[]]$

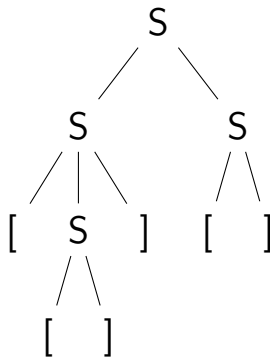
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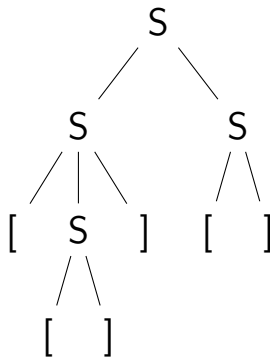
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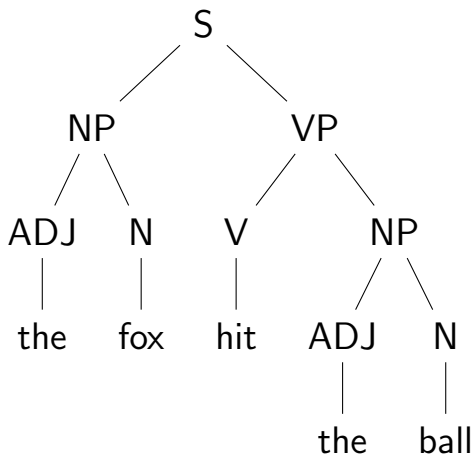
$[[]]$



Parse trees for regular languages?

Ex. Natural language

- ▶ $S \rightarrow NP VP$
- ▶ $NP \rightarrow ADJ N$
- ▶ $VP \rightarrow V$
- ▶ $VP \rightarrow V NP$



Ambiguity

Example

$\text{EXPR} \rightarrow \text{EXPR} + \text{EXPR}$

$\text{EXPR} \rightarrow \text{EXPR} * \text{EXPR}$

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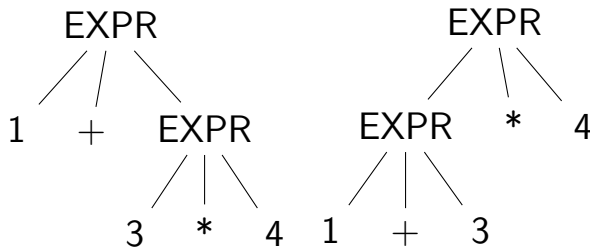
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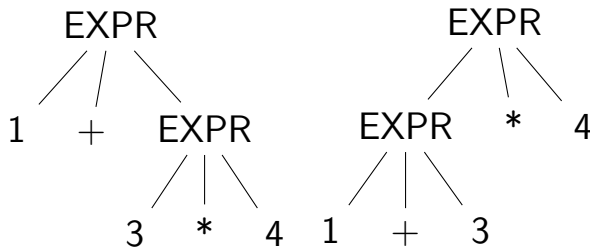
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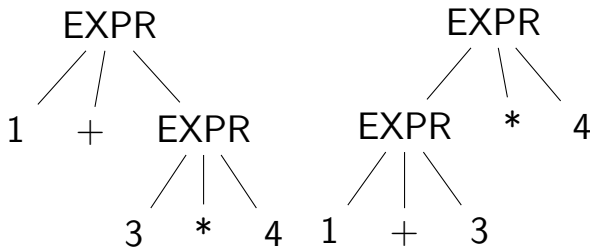
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Resolution: order rules, order tokens, **don't**.

Ambiguity

Example

SUM \rightarrow SUM + PROD

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PROD \rightarrow PROD * NUMBER

PROD \rightarrow NUMBER

Ambiguity

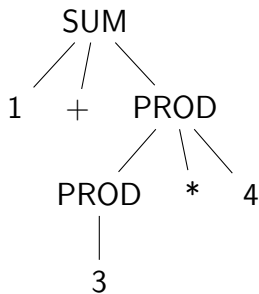
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Ambiguity

Is a CFG ambiguous?

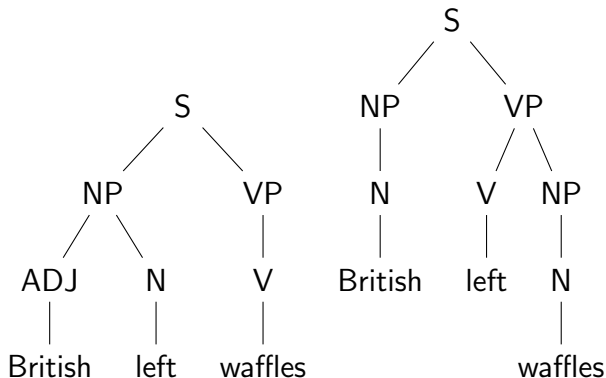
Ambiguity

Is a CFG ambiguous? **Undecidable**

It happens in the wild all the time!

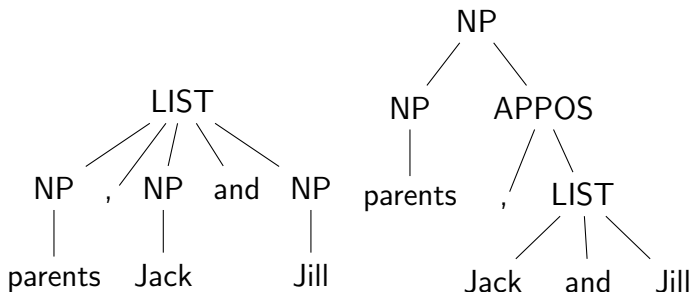
Ambiguity in natural language

British left waffles on Falklands



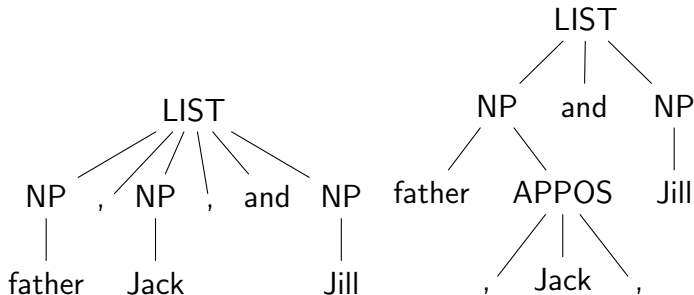
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“My parents, Jack and Jill” refers to 2 or 4 people.



Ambiguity in natural language

“My father, Jack, and Jill” refers to 2 or 3 people.



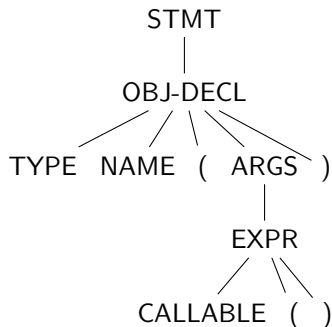
Lojban

Ambiguity in constructed languages

```
class1 obj (class2 ());
```

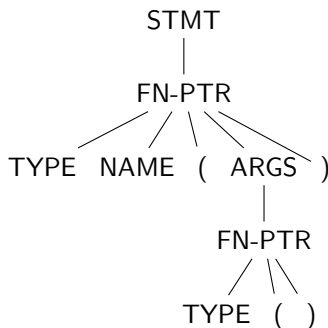
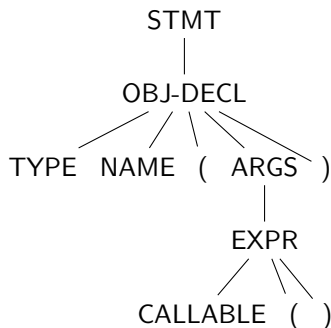
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Ambiguity in constructed languages

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Public Service Announcement

```
// class1 constructed from class2  
class1 obj ((class2 ()));  
class1 obj {class2 {}}; // C++11  
  
// Function pointer  
class1 obj (class2 name ());
```

Bottom-up parsing

$S \rightarrow (S)$

$S \rightarrow \varepsilon$

Stack:

Input: $(())()$

Bottom-up parsing

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CFG = named-bracket \cap regular

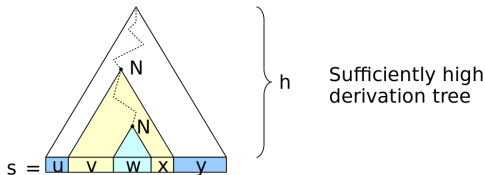
Pumping lemma for CFG

For all $s \in L$ and
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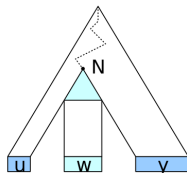
- ▶ $s = uvwxy$
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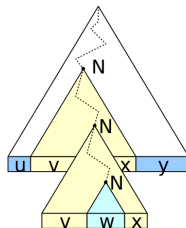
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Generating uv^0wx^0y



Generating uv^2wx^2y

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- ▶ Programming language with no undefined terms

Turing Machine

Definition

Non-/Deterministic Turing Machine :=

- ▶ S : set of states
- ▶ $S_0 \in S$: initial state
- ▶ $S_r, S_a \in S$: halt reject, halt accept state
- ▶ Γ : tape alphabet
- ▶ $b \in \Gamma$: blank symbol
- ▶ $\Sigma \subseteq \Gamma \setminus \{b\}$: input alphabet
- ▶ $f : S \times \Sigma \rightarrow S \times \Sigma \times \{R, L\}$: deterministic transition function
- ▶ $f : S \times (\Sigma \cup \{\varepsilon\}) \rightarrow \mathcal{P}(S \times \Sigma \times \{R, L\})$: non-deterministic transition function

Turing Machine

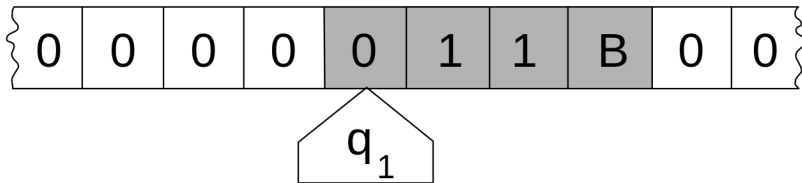


Figure from [WikiMedia](#)

Linear Bounded Turing Machine (LBTM)

Count possible 'complete-states' $|Q||n||\Sigma|^{k|n|}$.

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Nobody knows if $\text{LBNTM} \iff \text{LB(D)TM}$

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Note: Non-decreasing

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Suppose $\alpha \rightarrow \beta$ in a CSL with terminals Σ and non-terminals Γ .

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CSL's are non-decreasing, so linear bounded.

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Construct CSG for given LBNTM:

Let configuration $\coloneqq x_0x_1 \cdots x_{n-1}S_jx_n \cdots x_k$

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We can work 'backwards' to starting-tapes that the machine would accept!

We will start with a rule that generates arbitrary finishing-tapes: $b \rightarrow x_ib$ for $x_i \in \Gamma$, in an accepting state $S \rightarrow S_ab$.

CSL equivalents

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None of these are guaranteed to halt!

$$P = NP$$

Deterministic TM **P**olynomial-time algorithm \iff
Non-deterministic TM **P**olynomial-time algorithm?

$$P \neq NP$$

Deterministic TM **P**olynomial-time algorithm \nleftrightarrow
Non-deterministic TM **P**olynomial-time algorithm?

Universal Turing Program

Turing Machine takes encoding of a machine and its input, separated by a marker symbol.
Decides if machine accepts given input.

Unrestricted Grammars

$$\alpha \rightarrow \beta$$

α and β can be anything in $(\Gamma \cup \Sigma)^*$!

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Task: construct NTM that recognizes strings generated by an unrestricted grammar

$x_0x_1 \cdots x_n$ on tape.

Append $\#S$.

Start simulating a derivation, replacing α with β according to grammar. Result is unbounded, but so is tape.

If string before $\#$ matches that after, accept.

Could take forever

Unrestricted Grammars \iff NTM

$$x_0x_1 \cdots x_n$$

Unrestricted Grammars \iff NTM

$x_0x_1 \cdots x_n$

$x_0x_1 \cdots x_n\#S$

Unrestricted Grammars \iff NTM

$x_0x_1 \cdots x_n$

$x_0x_1 \cdots x_n\#S$

$x_0x_1 \cdots x_n\#\alpha\gamma$

Unrestricted Grammars \iff NTM

$x_0x_1 \cdots x_n$

$x_0x_1 \cdots x_n\#S$

$x_0x_1 \cdots x_n\#\alpha\gamma$

$x_0x_1 \cdots x_n\#\beta\theta\gamma\alpha$

Unrestricted Grammars \iff NTM

$x_0x_1 \cdots x_n$

$x_0x_1 \cdots x_n\#S$

$x_0x_1 \cdots x_n\#\alpha\gamma$

$x_0x_1 \cdots x_n\#\beta\theta\gamma\alpha$

\vdots

Unrestricted Grammars \iff NTM

$x_0x_1 \cdots x_n$

$x_0x_1 \cdots x_n\#S$

$x_0x_1 \cdots x_n\#\alpha\gamma$

$x_0x_1 \cdots x_n\#\beta\theta\gamma\alpha$

\vdots

$x_0x_1 \cdots x_n\#x_1x_2 \cdots x_n$

Unrestricted Grammars \iff NTM

$x_0x_1 \cdots x_n$

$x_0x_1 \cdots x_n\#S$

$x_0x_1 \cdots x_n\#\alpha\gamma$

$x_0x_1 \cdots x_n\#\beta\theta\gamma\alpha$

\vdots

$x_0x_1 \cdots x_n\#x_1x_2 \cdots x_n$

accept

Unrestricted Grammars \iff NTM

Suppose $(S'_i, x'_n, L) \in f(S_i, x_n)$,
then $S'_i x_{n-1} x'_n \rightarrow x_{n-1} S_i x_n$.