## CS/ECE 374: Algorithms \& Models of Computation

## Regular Languages and Expressions <br> Lecture 2 <br> January 19, 2023

## Background

Fix some finite alphabet $\Sigma$.

- $\Sigma^{*}$ is the set of all strings over $\Sigma$
- A language over $\Sigma$ is a subset of strings. That is, $L \subseteq \Sigma^{*}$
- $\Sigma^{*}$ is countably infinite. Set of all languages $=\mathcal{P}\left(\Sigma^{*}\right)$ is uncountably infinite
- Each machine/program can be described by a string. Hence set of machines/programs is countably infinite
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Question: What languages are easy? What languages should we focus on? Can we classify them via various features?

## Languages

Study of languages motivated by (among many others)

- linguistics and natural language understanding
- programming languages and logic
- computation and machines

Intution: As ability of a language to express/model increases the more complex/computationally hard it becomes.

## Chomsky Hierarchy and Machines

Grammars
phrase structured
context sensitive
context free
regular expressions

All Languages


## Machines

Turing machine (TMss)
linear bounded automata (LBAs)
pushdown automata (PDAs)
finite state automata (DFAs)

## Part I

## Regular Languages

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Regular languages are closed under the operations of union, concatenation and Kleene star.

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Lemma
Every finite language $L$ is regular.
Examples: $L=\{a, a b a a b, a b a\} . L=\{w| | w \mid \leq 100\}$. Why?

## More Examples

- $\{w \mid w$ is a keyword in Python program $\}$
- $\{w \mid w$ is a valid date of the form mm/dd/yy $\}$
- $\{\boldsymbol{w} \mid \boldsymbol{w}$ describes a valid Roman numeral $\}$ $\{I, I I, I I I, I V, V, V I, V I I, V I I I, I X, X, X I, \ldots\}$.
- $\{w \mid w$ contains "CS374" as a substring $\}$.


## Regular Languages

- How expressive are these languages?
- What can we use them for?
- What are limitations? That is, what can be not express as regular languages?


## Part II

## Regular Expressions

## Regular Expressions

A way to denote regular languages

- simple patterns to describe related strings
- useful in
- text search (editors, Unix/grep, emacs)
- compilers: lexical analysis
- compact way to represent interesting/useful languages
- dates back to 50's: Stephen Kleene who has a star named after him.


## Inductive Definition

A regular expression $r$ over an alphabhe $\Sigma$ is one of the following: Base cases:

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Inductive cases: If $r_{1}$ and $r_{2}$ are regular expressions denoting languages $R_{1}$ and $R_{2}$ respectively then,

- $\left(r_{1}+r_{2}\right)$ denotes the language $R_{1} \cup R_{2}$
- $\left(r_{1} r_{2}\right)$ denotes the language $R_{1} \boldsymbol{R}_{2}$
- $\left(r_{1}\right)^{*}$ denotes the language $R_{1}^{*}$


## Regular Languages vs Regular Expressions

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Examples: $(0+1)^{*}, 010^{*}+(110)^{*},(10+110)^{*}(11+10)$

## Notation and Parenthesis

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- Other notation: $r+s, r \cup s, r \mid s$ all denote union. $r s$ is sometimes written as $r \bullet s$.


## Skills

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- Given a language $L$ "in mind" (say an English description) we would like to write a regular expression for $L$ (if possible)
- Given a regular expression $r$ we would like to "understand" $L(r)$ (say by giving an English description)


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- $(\epsilon+0)(1+10)^{*}$ : strings without two consecutive 0 s.


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- Hard: bitstrings with an odd number of 1 s and an odd number of 0 s .


## Regular expression identities

- $\boldsymbol{r}^{*} \boldsymbol{r}^{*}=\boldsymbol{r}^{*}$ meaning for any regular expression $\boldsymbol{r}$,
$L\left(r^{*} r^{*}\right)=L\left(r^{*}\right)$
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Question: How does on prove an identity? By induction. On what? Length of $r$ since $r$ is a string obtained from specific inductive rules.

## A non-regular language and other closure properties

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How do we prove it?
Other questions:

- Suppose $R_{1}$ is regular and $R_{2}$ is regular. Is $R_{1} \cap R_{2}$ regular?
- Suppose $R_{1}$ is regular is $\bar{R}_{1}$ (complement of $R_{1}$ ) regular?


## Summary and Skills

Regular languages and expressions defined inductively via simple base cases and three operations: union, concatenation, Kleene star

Skills:

- Given a laguage $L$ described in English, design a regular expression $r$ such that $L=L(r)$
- Given a regular expression $r$, give an English description of the language $L(r)$

Later:

- see equivalence with DFAs, NFAs
- technique to prove that languages are not regular

