# Strings and Regular Expressions 

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$\left[^{\wedge}\right]^{*} ? @\left[^{\wedge}\right]^{*} ? .\left[^{\wedge}\right]^{\star}$

## Alphabets, Strings, and the Empty String

An alphabet $\Sigma$ is a finite set of symbols.
Strings over $\Sigma$ are members of $\Sigma^{*}$, defined by


Judgments: $\quad c \in \Sigma$ "character in $\Sigma " \quad s \in \Sigma^{*}$ "sequence of zero or more characters" Variables: $c$ "character" $s$ "sequence"
Symbols: " " "start and end of a string"

$$
\text { If } \sum_{\text {"" }}=\{\mathrm{a}, \mathrm{~b}, \mathrm{c}, \ldots, \mathrm{z}\},
$$

$$
\overline{" " \in \Sigma^{*}} \text { epsilon }
$$

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Symbols: " " "start and end of a string"

$$
\begin{aligned}
& \text { If } \sum=\{a, b, c, \ldots, z\}, \\
& " " " \\
& " a "
\end{aligned}
$$

The empty string
The string consisting of just "a"

$$
\frac{\mathrm{a} \in \Sigma \overline{" " \in \Sigma^{*}}}{\text { "a" } \in \Sigma^{*}} \text { cpsilon } \text { char } \leftarrow \text { Choose } s \text { to be the empty sequence }
$$

## Alphabets, Strings, and the Empty String

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$$
\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
$$

Judgments: $\quad c \in \Sigma$ "character in $\Sigma " \quad s \in \Sigma^{*}$ "sequence of zero or more characters" Variables: $c$ "character" $s$ "sequence"
Symbols: " " "start and end of a string"

$$
\begin{aligned}
& \text { If } \sum=\{a, b, c, \ldots, z\}, \\
& \text { "" } \\
& \text { "a" } \\
& \text { "ba" }
\end{aligned}
$$

The string consisting of just "a"
The string consisting of " $b$ " followed by "a"

## Alphabets, Strings, and the Empty String

An alphabet $\Sigma$ is a finite set of symbols.
Strings over $\Sigma$ are members of $\Sigma^{*}$, defined by

$$
\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
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Judgments: $\quad c \in \Sigma$ "character in $\Sigma " \quad s \in \Sigma^{*}$ "sequence of zero or more characters" Variables: $c$ "character" $s$ "sequence"
Symbols: " " "start and end of a string"
If $\sum=\{a, b, c, \ldots, z\}$,
""
"a"
"ba"
"aba"
"abcd"
"sphinxofblackquartzjudgemyvow"

The empty string
The string consisting of just "a" The string consisting of " b " followed by " a " The string "a" followed by "b" followed by "a" The four-letter string "abcd"
A pangram with only a, o, and u repeated

Alphabets, Strings, and the Empty String
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Strings over $\Sigma$ are members of $\Sigma^{*}$, defined by

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$$

```
infixr 5 : -- Not legal Haskell a : b:c = a:(b:c)
data [a] = [] -- [] is the empty list "a" is a type variable
    | a : [a] -- : is the list "cons" or prepend operator
type String = [Char] -- In Haskell, strings are lists of characters
"Hello" -- shorthand for
'H' : 'e' : 'l' : 'l' : 'o' : []
```

A visualization of the Peano encoding of natural numbers $\epsilon=0$
$\mathrm{a}=$ successor


Alphabets, Strings, and the Empty String

$$
\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
$$

String Equality

$$
\overline{" "=}=\text { e" equal-epsilon }
$$

$$
\frac{c \in \Sigma " s_{1} "=" s_{2} "}{" c s_{1} "=" c s_{2} "} \text { equal }
$$

Judgments: " $s_{1} "=$ " $s_{2}$ " "Strings " $s_{1} "$ and " $s_{2}$ " are equal" Variables: $s_{1}, s_{2}$ "character sequence" $c$ "character"
Is "ab" = "ab"?
"ab" = "ab"

Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
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Judgments: " $s_{1} "=$ " $s_{2}$ " "Strings " $s_{1}$ " and " $s_{2}$ " are equal" Variables: $s_{1}, s_{2}$ "character sequence" $c$ "character"
Is "ab" = "ab"?
$\frac{a \in \sum \quad \text { "b" }=\text { "b" }}{\text { "ab" }=\text { "ab" }}$ equal

Alphabets, Strings, and the Empty String

$$
\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s^{\prime} \in \Sigma^{*}} \text { char }
$$

String Equality

$$
\overline{" "=}=\text { e" equal-epsilon }
$$

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\frac{c \in \Sigma " s_{1} "=" s_{2} "}{" c s_{1} "=" c s_{2} "} \text { equal }
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Judgments: " $s_{1} "=$ " $s_{2}$ " "Strings " $s_{1}$ " and " $s_{2}$ " are equal" Variables: $s_{1}, s_{2}$ "character sequence" $c$ "character"

Is "ab" = "ab"?
$\frac{a \in \Sigma \frac{b \in \Sigma " "=" "}{" b "=" b "} \text { equal }}{\text { "ab" }=" a b "}$ equal

Alphabets, Strings, and the Empty String

$$
\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
$$

String Equality

$$
\begin{aligned}
& \overline{" "}=\text { "" } \text { equal-epsilon } \\
& \frac{c \in \Sigma \quad " s_{1} "=" s_{2} "}{" c s_{1} "=" c s_{2} "} \text { equal }
\end{aligned}
$$

Judgments: " $s_{1} "=$ " $s_{2}$ " "Strings " $s_{1}$ " and " $s_{2}$ " are equal" Variables: $s_{1}, s_{2}$ "character sequence" $c$ "character"

Is "ab" = "ab"?
$\mathrm{b} \in \Sigma \quad \overline{" \prime}=" \overline{ }$ equal-epsilon
$a \in \Sigma \quad$ "b" = "b" equal "ab" = "ab"

Alphabets, Strings, and the Empty String

$$
\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
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Judgments: " $s_{1} "=$ " $s_{2}$ " "Strings " $s_{1}$ " and " $s_{2}$ " are equal" Variables: $s_{1}, s_{2}$ "character sequence" $c$ "character"
Is "ab" = "ac"?
"ab" = "ac"

Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
$$

String Equality

$$
\overline{" "=}=\text { ""equal-epsilon }
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\frac{c \in \Sigma " s_{1} "=" s_{2} "}{" c s_{1} "=" c s_{2} "} \text { equal }
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Judgments: " $s_{1} "=$ " $s_{2}$ " "Strings " $s_{1} "$ and " $s_{2}$ " are equal" Variables: $s_{1}, s_{2}$ "character sequence" $c$ "character"

Is "ab" = "ac"?
$\frac{a \in \sum " b "=" c "}{\text { "ab" }=\text { "ac" }}$ equal

Alphabets, Strings, and the Empty String

$$
\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
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String Equality

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\begin{aligned}
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\end{aligned}
$$

Judgments: " $s_{1} "=$ " $s_{2}$ " "Strings " $s_{1}$ " and " $s_{2}$ " are equal" Variables: $s_{1}, s_{2}$ "character sequence" $c$ "character"
Is "ab" = "ac"?
$a \in \Sigma \frac{?}{" \mathrm{~b} "=\text { "c"? }} \leftarrow$ We are stuck: the equal rule requires identical initial characters $\frac{a \in \sum \overline{" b "=}{ }^{\text {"c } "} \text { ? }}{\text { "ab" }=\text { "ac" }}$ equal

Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
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String Equality

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\end{aligned}
$$

Judgments: " $s_{1} "=$ " $s_{2}$ " "Strings " $s_{1}$ " and " $s_{2}$ " are equal" Variables: $s_{1}, s_{2}$ "character sequence" $c$ "character"

## Additional Theorems

Reflexive: For any $s \in \Sigma^{*}, s=s$
Symmetric: For any $s_{1}, s_{2} \in \Sigma^{*}$ with $s_{1}=s_{2}, s_{2}=s_{1}$.
Transitive: For any $s_{1}, s_{2}, s_{3} \in \Sigma^{*}$ with $s_{1}=s_{2}$ and $s_{2}=s_{3}, s_{1}=s_{3}$.

Alphabets, Strings, and the Empty String

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Judgments: " $s_{1} "=$ " $s_{2}$ " "Strings " $s_{1} "$ and " $s_{2}$ " are equal"
Variables: $s_{1}, s_{2}$ "character sequence" $c$ "character"

```
(==) :: [Char] -> [Char] -> Bool
    [] == [] = True -- equal-epsilon
c1 : s1 == c2 : s2 = c1 == c2 && s1 == s2
    _ == _ = False
data [a] = [] | a : [a] deriving (Eq, Ord) -- Default implementation of Eq
```

Alphabets, Strings, and the Empty String

$$
\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
$$

## String Concatenation

$$
\frac{" s " \in \sum^{*}}{" "++" s "=" s "} \text { concat-epsilon } \frac{c \in \sum{ }^{"} s_{1} "++" s_{2} "=" s_{3} "}{" c s_{1} "++" s_{2} "=" c s_{3} "} \text { concat }
$$

Judgments: " $s_{1} "++$ " $s_{2} "=$ " $s_{3}$ " "Concatenating strings " $s_{1} "$ and " $s_{2}$ " gives string " $s_{3} "$ " Variables: $s, s_{1}, s_{2}, s_{3}$ "character sequence" $c$ "character"

Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
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\frac{" s " \in \sum^{*}}{" "++" s "=" s "} \text { concat-epsilon } \frac{c \in \sum \quad " s_{1} "++" s_{2} "=" s_{3} "}{" c s_{1} "++" s_{2} "=" c s_{3} "} \text { concat }
$$

Is "ab" ++ "cde" = "abcde"?
"ab" ++ "cde" = "abcde"

Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
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## String Concatenation

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\frac{" s " \in \sum^{*}}{" "++" s "=" s "} \text { concat-epsilon } \frac{c \in \sum \quad " s_{1} "++" s_{2} "=" s_{3} "}{" c s_{1} "++" s_{2} "=" c s_{3} "} \text { concat }
$$

Is "ab" ++ "cde" = "abcde"?
$a \in \Sigma$

$$
\frac{\text { "b" ++ "cde" }=\text { "bcde" }}{\text { "ab" ++ "cde" }=\text { "abcde" }} \text { concat }
$$

Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
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## String Concatenation

$$
\frac{" s " \in \sum^{*}}{" "++" s "=" s "} \text { concat-epsilon } \frac{c \in \sum \quad " s_{1} "++" s_{2} "=" s_{3} "}{" c s_{1} "++" s_{2} "=" c s_{3} "} \text { concat }
$$

Is "ab" ++ "cde" = "abcde"?
$\mathrm{a} \in \Sigma \frac{\mathrm{b} \in \Sigma \quad \text { "" }++ \text { "cde" }=\quad \text { "cde" }}{\text { "b"++"cde" }=\text { "bcde" }}$ concat

Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
$$

## String Concatenation

$$
\frac{" s " \in \sum^{*}}{" "++" s "=" s "} \text { concat-epsilon } \frac{c \in \sum \quad " s_{1} "++" s_{2} "=" s_{3} "}{" c s_{1} "++" s_{2} "=" c s_{3} "} \text { concat }
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Is "ab" ++ "cde" = "abcde"?


Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
$$

## String Concatenation

$$
\frac{" s " \in \sum^{*}}{" "++" s "=" s "} \text { concat-epsilon } \frac{c \in \sum \quad " s_{1} "++" s_{2} "=" s_{3} "}{" c s_{1} "++" s_{2} "=" c s_{3} "} \text { concat }
$$

Is "ab" ++ "cde" = "abcde"?


Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
$$

## String Concatenation

$$
\frac{" s " \in \sum^{*}}{\overline{" "+} " s "=" s "} \text { concat-epsilon } \quad \frac{c \in \sum \quad " s_{1} "++" s_{2} "=" s_{3} "}{" c s_{1} "++" s_{2} "=" c s_{3} "} \text { concat }
$$

Theorem: "" is also a right identity for concatenation
Assume " $s$ " $\in \Sigma^{*}$. From the definition of $\Sigma^{*}$, $s$ must be of the form $c_{1} c_{2} \cdots c_{n}$ where $c_{i} \in \Sigma$.

$$
\begin{gathered}
\overline{" " \in \sum^{*}} \text { epsilon } \\
c_{n} \in \sum \overline{" "++" "=" "} \text { concat-epsilon } \\
" c_{n} "++" "=" c_{n} "
\end{gathered} \text { concat }
$$

$\frac{c_{1} \in \Sigma \quad " c_{2} \cdots c_{n} "++\dot{"}={ }^{"} c_{2} \cdots c_{n} "}{" c_{1} c_{2} \cdots c_{n} "++" "=" c_{1} c_{2} \cdots c_{n} "}$ concat

Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
$$

## String Concatenation

$$
\frac{" s " \in \sum^{*}}{" "++" s "=" s "} \text { concat-epsilon } \frac{c \in \sum \quad " s_{1} "++" s_{2} "=" s_{3} "}{" c s_{1} "++" s_{2} "=" c s_{3} "} \text { concat }
$$

Theorem: String concatenation is a function

$$
\text { If " } s_{1} "++" s_{2} "=" s_{3} " \text { and } " s_{1} "++" s_{2} "=" s_{4} " \text { then } " s_{3} "=" s_{4} " .
$$

Alphabets, Strings, and the Empty String

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\overline{" " \in \Sigma^{*}} \text { epsilon } \quad \frac{c \in \Sigma " s " \in \Sigma^{*}}{" c s " \in \Sigma^{*}} \text { char }
$$

String Concatenation

$$
\frac{" s " \in \sum^{*}}{\overline{" "+} " s "=" s "} \text { concat-epsilon } \quad \frac{c \in \sum \quad " s_{1} "++" s_{2} "=" s_{3} "}{" c s_{1} "++" s_{2} "=" c s_{3} "} \text { concat }
$$



## Regular Expressions

A character matches itself
Juxtaposition matches a sequence | indicates a choice * means "zero or more"
"a"~a "x"~x
"abc" ~ abc
"ab" ~ ab|bc "bc" $\sim a b \mid b c$
"", "a", "aa", "aaa", "aaaa", "aaaaa", ... ~ a*

## Regular Expressions

A character matches itself Juxtaposition matches a sequence $\overline{" "} \sim \epsilon^{\text {epsilon }} \quad \frac{c \in \Sigma}{" c " \sim c}$ char

$$
" a " \sim a \quad " x " \sim x
$$

"abc" ~ abc

$$
\frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \text { seq }
$$

Judgments: $\quad s \sim r$ "string $s$ matches regular expression $r$ "
Variables: $c$ character $r$ regular expression $s$ string Symbols: $\epsilon$ "" | * a b c d...

## Regular Expressions

A character matches itself
Juxtaposition matches a sequence $\overline{" "} \sim \epsilon^{\text {epsilon }} \quad \frac{c \in \Sigma}{" c " \sim c}$ char

$$
" a " \sim a \quad " x " \sim x
$$

"abc" ~ abc

$$
\frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \mathrm{seq}
$$

"abc" ~ abc?
"abc" ~ abc

## Regular Expressions

A character matches itself
Juxtaposition matches a sequence $\overline{" "} \sim \epsilon_{\text {epsilon }} \quad \frac{c \in \Sigma}{" c " \sim c}$ char

$$
" a " \sim a \quad " x " \sim x
$$

"abc" ~ abc

$$
\frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \mathrm{seq}
$$

"abc" ~ abc?
"a"~ a

$$
\frac{\text { "bc" ~ bc }}{\text { "abc" ~ abc }}
$$

"a" ++ "bc" = "abc" seq

## Regular Expressions

A character matches itself
Juxtaposition matches a sequence

$$
\overline{" " \sim \epsilon}^{\text {epsilon }} \quad \frac{c \in \Sigma}{" c " \sim c} \text { char }
$$

$$
" a " \sim a \quad " x " \sim x
$$

"abc" ~ abc

$$
\frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \mathrm{seq}
$$

"abc" ~ abc?

## Regular Expressions

A character matches itself
Juxtaposition matches a sequence

$$
\overline{\omega " \sim ~}^{\text {epsilon }} \quad \frac{c \in \Sigma}{" c " \sim c} \text { char }
$$

$$
" a " \sim a \quad " x " \sim x
$$

"abc" ~ abc

$$
\frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \mathrm{seq}
$$

"abc" ~ abc?


## Regular Expressions

A character matches itself
Juxtaposition matches a sequence

$$
\overline{\omega " \sim ~}^{\text {epsilon }} \quad \frac{c \in \Sigma}{" c " \sim c} \text { char }
$$

$$
" a " \sim a \quad " x " \sim x
$$

"abc" ~ abc

$$
\frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \text { seq }
$$

"abc" ~ abc? What should we do about ambiguity?
$\frac{a \in \Sigma}{\text { "a" } \sim \mathrm{a}} \operatorname{char} \frac{\frac{b \in \Sigma}{\mathrm{cb} " \sim \mathrm{~b}} \operatorname{char} \frac{c \in \Sigma}{" \mathrm{c} " \sim \mathrm{c}} \operatorname{char} \frac{\vdots}{\text { "b" }++ \text { "c" }=\text { "bc" }} \text { concat }}{\text { seq } \frac{\mathrm{bc} " \sim \mathrm{bc}}{\text { "a" }++ \text { "bc" }=" \mathrm{abc} "} \text { sencat }}$ seq


Regular Expressions
$\overline{" " \sim \epsilon}$ epsilon $\frac{c \in \sum}{" c " \sim c}$ char $\quad \frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}}$ seq $\quad \frac{s \sim r}{s \sim(r)}$ paren
Judgments: $\quad s \sim r$ "string $s$ matches regular expression $r$ "
Variables: $c$ character $\quad r$ regular expression $\quad s$ string
Symbols: $\epsilon$ "" | * ( )
"abc" ~ a(bc)?
$\frac{a \in \Sigma}{" a " \sim a}$ char

$$
\frac{" b c " \sim(b c)}{" a b c " \sim a(b c)}
$$

$$
\frac{\vdots}{" \mathrm{a} "++ \text { "bc" }=\text { "abc" }} \text { seq } \text { seq }
$$

Regular Expressions
$\overline{" " \sim \epsilon}$ epsilon $\frac{c \in \sum}{" c " \sim c}$ char $\quad \frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}}$ seq $\quad \frac{s \sim r}{s \sim(r)}$ paren
Judgments: $\quad s \sim r \quad$ "string $s$ matches regular expression $r$ "
Variables: $c$ character $\quad r$ regular expression $\quad s$ string
Symbols: $\epsilon$
"" | * ( )

$$
" a b c " \sim a(b c) ?
$$



Regular Expressions
$\overline{" " \sim \epsilon}$ epsilon $\quad \frac{c \in \sum}{" c " \sim c}$ char $\quad \frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}}$ seq $\quad \frac{s \sim r}{s \sim(r)}$ paren
Judgments: $\quad s \sim r$ "string $s$ matches regular expression $r$ "
Variables: $c$ character $\quad r$ regular expression $\quad s$ string
Symbols: $\epsilon$
"" | * ( )

$$
\begin{aligned}
& \text { "abc" ~ a(bc)? } \\
& \frac{b \in \Sigma}{\text { "b" } \sim \mathrm{b}} \operatorname{char} \frac{c \in \Sigma}{\text { "c" } \sim \mathrm{c}} \operatorname{char} \frac{\vdots}{\text { "b" }++ \text { "c" }=\text { "bc" }} \text { concat } \\
& \frac{a \in \Sigma}{\text { "a" } \sim a} \text { a } \operatorname{char} \\
& \text { "bc" } \sim \text { bc } \quad \text { paren } \\
& \text { "abc" ~ a(bc) }
\end{aligned}
$$

Regular Expressions
$\overline{" " \sim \epsilon}$ epsilon
$\frac{c \in \Sigma}{" c " \sim c}$ char
$\frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}}$ seq

```
-- An algebraic data type resolves ambiguity in RE structure (parentheses unneeded)
data RE = Epsilon -- Epsilon/empty string
| Ch Char -- Single Character
| Seq RE RE -- Sequence, e.g., \(r_{1} r_{2}\)
infix 5 ~~ -- Regular expression match operator (Haskell already uses ~)
(~~) :: String -> RE -> Bool
"" ~~ Epsilon = True -- epsilon
[c1] ~~ Ch c2 = c1 == c2 -- char
s3 ~~ Seq r1 r2 = -- What to do for seq? How do we choose \(s_{1}, s_{2}\) ?
~~
= False -- default
```

Regular Expressions

$$
\overline{" " \sim \epsilon} \text { epsilon } \quad \frac{c \in \Sigma}{" c " \sim c} \text { char } \quad \frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \text { seq }
$$

```
ghci> import Data.List (inits, tails)
ghci> inits "abc" -- All prefixes, shortest first
["", "a", "ab", "abc"]
ghci> tails "abc" -- All suffixes, longest first
["abc","bc", "c",""]
ghci> :t zipWith -- zipWith f[a, , a , ...][\mp@subsup{b}{1}{},\mp@subsup{b}{2}{},\ldots..]=[f a }\mp@subsup{a}{1}{}\mp@subsup{b}{1}{},f\mp@subsup{a}{2}{}\mp@subsup{b}{2}{},\ldots..
zipWith :: (a -> b -> c) -> [a] -> [b] -> [c]
ghci> :t or -- Logical OR of a list of Booleans
or :: Foldable t => t Bool -> Bool
```

Regular Expressions
$\overline{* " \sim \epsilon}$ epsilon
$\frac{c \in \Sigma}{" c " \sim c}$ char
$\frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}}$ seq

```
import Data.List (inits, tails)
data RE = Epsilon | Ch Char | Seq RE RE
infix 5 ~~
(~~) :: String -> RE -> Bool
"" ~~ Epsilon = True -- epsilon
[c1] ~~ Ch c2 = c1 == c2 -- char
s3 ~~ Seq r1 r2 = or $ zipWith testSplit (inits s3) (tails s3) -- seq
where testSplit s1 s2 = s1 ~~ r1 && s2 ~~ r2
= False -- default
```

Regular Expressions

$$
\begin{array}{lll} 
& c \in \sum \\
\text { epsilon } & \frac{c \in \sum}{" \prime \prime \sim} \text { char } & \begin{array}{ll}
s_{1} \sim r_{1} & s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3} \\
\text { seq } \\
s_{3} \sim r_{1} r_{2} \\
\frac{s \sim r_{1}}{s \sim r_{1} \mid r_{2}} \text { alt-1 } & \frac{s \sim r_{2}}{s \sim r_{1} \mid r_{2}} \text { alt-r }
\end{array}
\end{array}
$$

Regular Expressions

$$
\begin{array}{lll} 
\\
\overline{" " \sim} \text { epsilon } & \frac{c \in \Sigma}{" c " \sim c} \text { char } & \begin{array}{ll}
s_{1} \sim r_{1} & s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3} \\
\text { seq } \\
s_{3} \sim r_{1} r_{2} \\
s \sim r_{1} \\
s \sim r_{1} \mid r_{2} & \text { alt-1 }
\end{array} \\
& \frac{s \sim r_{2}}{s \sim r_{1} \mid r_{2}} \text { alt-r } &
\end{array}
$$

```
data RE = Epsilon | Ch Char | Seq RE RE | Alt RE RE
(~~) :: String -> RE -> Bool
"" ~~ Epsilon = True
[c1] ~~ Ch c2 = c1 == c2 -- char
s3 ~~ Seq r1 r2 = or $ zipWith testSplit (inits s3) (tails s3) -- seq
        where testSplit s1 s2 = s1 ~~ r1 && s2 ~~ r2
s ~~ Alt r1 r2 = s ~~ r1 || s ~~ r2 -- alt-l and alt-r
    ~ _ = False
    -- default
```

Regular Expressions

$$
\begin{array}{cccc} 
\\
\overline{" " \sim} \text { epsilon } & \frac{c \in \sum}{" c " \sim c} \text { char } & \frac{s_{1} \sim r_{1}}{} s_{2} \sim r_{2} & s_{1}++s_{2}=s_{3} \\
& s_{3} \sim r_{1} r_{2} \\
\text { seq } \\
\frac{s \sim r_{1}}{s \sim r_{1} \mid r_{2}} \text { alt-1 } & \frac{s \sim r_{2}}{s \sim r_{1} \mid r_{2}} \text { alt-r } & \overline{" " \sim r^{*}} \text { star-0 } & \frac{s_{1} \sim r}{} s_{2} \sim r^{\star} \quad s_{1}++s_{2}=s_{3} \\
\text { star-1 }
\end{array}
$$

Regular Expressions

$$
\begin{array}{ccc} 
\\
\hline " \# \sim \epsilon & \text { epsilon } & \frac{c \in \sum}{" c " \sim c} \text { char } \\
\frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{} \text { seq } \\
s_{3} \sim r_{1} r_{2} \\
\frac{s \sim r_{1}}{s \sim r_{1} \mid r_{2}} \text { alt-1 } & \frac{s \sim r_{2}}{s \sim r_{1} \mid r_{2}} \text { alt-r } & \overline{" " \sim r \star} \operatorname{star-0} \quad \frac{s_{1} \sim r}{} \quad s_{2} \sim r \star \quad s_{1}++s_{2}=s_{3} \\
\text { star-1 }
\end{array}
$$

```
data RE = Epsilon | Ch Char | Seq RE RE | Alt RE RE | Star RE
(~~) :: String -> RE -> Bool -- HANGS TESTING "b" ~ \epsilon*
"" ~~ Epsilon = True -- epsilon
[c1] ~~ Ch c2 = c1 == c2 -- char
s3 ~~ Seq r1 r2 = or $ zipWith testSplit (inits s3) (tails s3)
where testSplit s1 s2 = s1 ~~ r1 && s2 ~~ r2
s ~~ Alt r1 r2 = s ~~ r1 || s ~~ r2 -- alt-l and alt-r
"" ~~ Star _ = True -- star-0
s3 ~~ Star r = or $ zipWith testSplit (inits s3) (tails s3)
    where testSplit s1 s2 = s1 ~~ r && s2 ~~ (Star r)
    = False -- default
```

Regular Expressions

$$
\begin{array}{ccc} 
\\
\hline " \# \sim \epsilon & \text { epsilon } & \frac{c \in \sum}{" c " \sim c} \text { char } \\
\frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{} \text { seq } \\
s_{3} \sim r_{1} r_{2} \\
\frac{s \sim r_{1}}{s \sim r_{1} \mid r_{2}} \text { alt-1 } & \frac{s \sim r_{2}}{s \sim r_{1} \mid r_{2}} \text { alt-r } & \overline{" " \sim r \star} \operatorname{star-0} \quad \frac{s_{1} \sim r}{} \quad s_{2} \sim r \star \quad s_{1}++s_{2}=s_{3} \\
\text { star-1 }
\end{array}
$$

```
data RE = Epsilon | Ch Char | Seq RE RE | Alt RE RE | Star RE
(~~) :: String -> RE -> Bool -- STILL HANGS ON "b" ~ \epsilon*
"" ~~ Epsilon = True
[c1] ~~ Ch c2 = c1 == c2 -- char
s3 ~~ Seq r1 r2 = or $ zipWith testSplit (inits s3) (tails s3)
where testSplit s1 s2 = s1 ~~ r1 && s2 ~~ r2
s ~~ Alt r1 r2 = s ~~ r1 || s ~~ r2 -- alt-l and alt-r
"" ~~ Star _ = True -- star-0
s3 ~~ Star r = or $ zipWith testSplit (inits s3) (tails s3)
    where testSplit s1 s2 = s2 ~~ (Star r) && s1 ~~ r
    = False -- default
```

Regular Expressions

$$
\begin{aligned}
& \overline{" \# \sim \epsilon} \text { epsilon } \quad \frac{c \in \Sigma}{" c " \sim c} \text { char } \quad \begin{array}{ll}
s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3} \\
s_{3} \sim r_{1} r_{2} \\
\text { seq }
\end{array} \\
& \frac{s \sim r_{1}}{s \sim r_{1} \mid r_{2}} \text { alt-1 } \frac{s \sim r_{2}}{s \sim r_{1} \mid r_{2}} \text { alt-r } \frac{}{\omega " \sim r^{\star}} \text { star-0 } \frac{s_{1} \sim r s_{2} \sim r^{\star} s_{1}++s_{2}=s_{3}}{s_{3} \sim r^{\star}} \text { star-1 }
\end{aligned}
$$

"b"~ $\epsilon *$ ?

$$
\text { "b" } \sim \epsilon *
$$

Regular Expressions

$$
\begin{aligned}
& \overline{" " \sim \epsilon} \text { epsilon } \frac{c \in \sum}{" c " \sim c} \text { char } \quad \frac{s_{1} \sim r_{1} s_{2} \sim r_{2} s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \mathrm{seq} \\
& \frac{s \sim r_{1}}{s \sim r_{1} \mid r_{2}} \text { alt-1 } \frac{s \sim r_{2}}{s \sim r_{1} \mid r_{2}} \text { alt-r } \frac{s_{1} \sim \pi \sim r^{\star}}{\operatorname{star}-0} \frac{s_{2} \sim r^{\star} \sim s_{1}++s_{2}=s_{3}}{s t a r-1} \text { star }
\end{aligned}
$$

"b"~ $\epsilon * ?$
$\frac{" " \sim \epsilon \quad \text { "b"~ } \epsilon^{*} \quad \text { "" }++" b "=" b "}{" b " \sim \epsilon \star} \operatorname{star}-1$

$$
s_{1}=" " \quad s_{2}=" \mathrm{~b} "
$$

Regular Expressions

$$
\text { "b" } \sim \epsilon * ?
$$

$\overline{" " \sim \epsilon}$ epsilon

$$
\frac{" b " \sim \epsilon \star \quad " \quad " "++" b "=" b "}{\text { "b"~ } \sim \star} \text { star-1 }
$$

$$
s_{1}=، ">\quad s_{2}=" \mathrm{~b} "
$$

$$
\begin{aligned}
& \overline{" " \sim \epsilon} \text { epsilon } \frac{c \in \sum}{" c " \sim c} \text { char } \quad \frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \text { seq } \\
& \frac{s \sim r_{1}}{s \sim r_{1} \mid r_{2}} \text { alt-1 } \frac{s \sim r_{2}}{s \sim r_{1} \mid r_{2}} \text { alt-r } \frac{s^{\prime} \sim r^{\star}}{\operatorname{star}-0} \frac{s_{1} \sim r}{s_{2} \sim r^{*} s_{1}++s_{2}=s_{3}} \text { star-1 }
\end{aligned}
$$

## Regular Expressions

$$
\text { "b" } \sim \epsilon * ?
$$

$\overline{" " \sim \epsilon}$ epsilon

$$
\text { "" }++" b "=" b "
$$

$$
s_{1}=" " \quad s_{2}=" \mathrm{~b} "
$$

$$
\begin{aligned}
& \overline{" " \sim \epsilon} \text { epsilon } \frac{c \in \sum}{" c " \sim c} \text { char } \quad \frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \text { seq } \\
& \frac{s \sim r_{1}}{s \sim r_{1} \mid r_{2}} \text { alt-1 } \frac{s \sim r_{2}}{s \sim r_{1} \mid r_{2}} \text { alt-r } \frac{s^{\prime} \sim r^{\star}}{\operatorname{star}-0} \frac{s_{1} \sim r}{s_{2} \sim r^{\star} s_{1}++s_{2}=s_{3}} \text { star-1 }
\end{aligned}
$$

Regular Expressions

$$
\begin{aligned}
& \overline{" " \sim \epsilon} \text { epsilon } \frac{c \in \sum}{" c " \sim c} \text { char } \quad \frac{s_{1} \sim r_{1} \quad s_{2} \sim r_{2} \quad s_{1}++s_{2}=s_{3}}{s_{3} \sim r_{1} r_{2}} \text { seq } \\
& \frac{s \sim r_{1}}{s \sim r_{1} \mid r_{2}} \text { alt-1 } \frac{s \sim r_{2}}{s \sim r_{1} \mid r_{2}} \text { alt-r } \frac{s^{*} \sim r^{\star}}{\operatorname{ltar}-0} \frac{s_{1} \sim r}{s_{2} \sim r \star s_{1}++s_{2}=s_{3} \quad s_{1} \neq " "} \text { star-1 }
\end{aligned}
$$



## Backtracking sucks

This is a backtracking algorithm that tries everything until it works
What does this do on "aaaaaaabb" $\sim(a a a) * b *$ ?

```
(~~) :: String -> RE -> Bool
"" ~~ Epsilon
    = True -- epsilon
[c1] ~~ Ch c2 = c1 == c2
    -- char
s3 ~~ Seq r1 r2 = or $ zipWith testSplit (inits s3) (tails s3)
    where testSplit s1 s2 = s1 ~~ r1 && s2 ~~ r2
s ~~ Alt r1 r2 = s ~~ r1 || s ~~ r2 -- alt-l and alt-r
"" ~~ Star _ = True -- star-0
s3 ~~ Star r = or $ zipWith testSplit (inits s3) (tails s3)
    where testSplit [] _ = False
        testSplit s1 s2 = s1 ~~ r && s2 ~~ (Star r)
    = False
    -- default
```


## A Better Way: Thompson's Algorithm

Regular Expressions

Thompson's Construction
Nondeterministic Finite Automata
Subset Construction
Deterministic Finite Automata



$$
r_{1} r_{2}
$$




Ken Thompson. Programming techniques: Regular expression search algorithm. Communications of the ACM, 11(6):419-422, June 1968.







## Brzozowski derivatives

$\partial_{s} R$ is the derivative of regular expression $R$ w.r.t. the string $s$
"Every string that can follow $s$ to match $R$ "
$\partial_{s_{1}} R=\left\{s_{2} \mid s_{1} s_{2} \in L(R)\right\}$, where $L(R)$ is the language of $R$

Janusz A. Brzozowski. Derivatives of regular expressions.
Fournal of the Association for Computing Machinery, 11(4):481-494, October 1964.

## Brzozowski derivatives

$\partial_{s} R$ is the derivative of regular expression $R$ w.r.t. the string $s$
"Every string that can follow $s$ to match $R$ "
$\partial_{s_{1}} R=\left\{s_{2} \mid s_{1} s_{2} \in L(R)\right\}$, where $L(R)$ is the language of $R$
$\partial_{\mathrm{a}} \mathrm{a}=\epsilon \quad \partial_{\mathrm{a}} \mathrm{aa}=\mathrm{a} \quad \partial_{\mathrm{a}} \mathrm{abc}=\mathrm{bc} \quad \partial_{\mathrm{b}} \mathrm{abc}=\varnothing \quad \partial_{\mathrm{a}} \mathrm{ab} \mid \mathrm{cd}=\mathrm{b}$
$\partial_{\mathrm{a}} \mathrm{abc}|\mathrm{acd}=\mathrm{bc}| \mathrm{cd} \quad \partial_{\mathrm{a}} \mathrm{a} * \mathrm{bc}=\mathrm{a} * \mathrm{bc} \quad \partial_{\mathrm{a}} \mathrm{a} * \mathrm{ac}=\mathrm{a} * \mathrm{ac} \mid \mathrm{c}$

Janusz A. Brzozowski. Derivatives of regular expressions.
Journal of the Association for Computing Machinery, 11(4):481-494, October 1964.

## Brzozowski derivatives

$\partial_{s} R$ is the derivative of regular expression $R$ w.r.t. the string $s$
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$\partial_{\mathrm{a}} \mathrm{abc}|\mathrm{acd}=\mathrm{bc}| c \mathrm{~cd} \quad \partial_{\mathrm{a}} \mathrm{a} * \mathrm{bc}=\mathrm{a} * \mathrm{bc} \quad \partial_{\mathrm{a}} \mathrm{a} * \mathrm{ac}=\mathrm{a} * \mathrm{ac} \mid \mathrm{c}$
Theorem: the derivative of a regular expression is a regular expression (including $\varnothing$ )
Some subtlety when "" $\sim R$, rules otherwise look like those for polynomials

Janusz A. Brzozowski. Derivatives of regular expressions.
fournal of the Association for Computing Machinery, 11(4):481-494, October 1964.

## Brzozowski derivatives

$\partial_{s} R$ is the derivative of regular expression $R$ w.r.t. the string $s$
"Every string that can follow $s$ to match $R$ "
$\partial_{s_{1}} R=\left\{s_{2} \mid s_{1} s_{2} \in L(R)\right\}$, where $L(R)$ is the language of $R$
$\partial_{\mathrm{a}} \mathrm{a}=\epsilon \quad \partial_{\mathrm{a}} \mathrm{aa}=\mathrm{a} \quad \partial_{\mathrm{a}} \mathrm{abc}=\mathrm{bc} \quad \partial_{\mathrm{b}} \mathrm{abc}=\varnothing \quad \partial_{\mathrm{a}} \mathrm{ab} \mid \mathrm{cd}=\mathrm{b}$
$\partial_{\mathrm{a}} \mathrm{abc}|\mathrm{acd}=\mathrm{bc}| \mathrm{cd} \quad \partial_{\mathrm{a}} \mathrm{a} * \mathrm{bc}=\mathrm{a} * \mathrm{bc} \quad \partial_{\mathrm{a}} \mathrm{a} * \mathrm{ac}=\mathrm{a} * \mathrm{ac} \mid \mathrm{c}$
Theorem: the derivative of a regular expression is a regular expression (including $\varnothing$ )
Some subtlety when "" $\sim R$, rules otherwise look like those for polynomials
Use "subset construction" to build a DFA: label states with regular expression derivatives

Janusz A. Brzozowski. Derivatives of regular expressions.
Journal of the Association for Computing Machinery, 11(4):481-494, October 1964.
Scott Owens, John Reppy, and Aaron Turon. Regular-expression derivatives re-examined.
Journal of Functional Programming, 19(2):173-190, March 2009.

