15-150

Principles of Functional Programming

Slides for Lecture 14

Regular Expressions

March 11, 2025

Michael Erdmann

Lessons:

- Regular Expressions
- Regular Languages
- Matcher
- Correctness
 - Proof-Directed Debugging
 - Termination
 - Soundness and Completeness

Language Hierarchy

Class of Languages	Recognizers	Applications
Unrestricted	Turing Machines	General Computation
Context-Sensitive	Linear-bounded e automata	Some simple type-checking
Context-Free	Nondeterministic automata with one stack	Syntax checking
	with one stack	

Finite Automata

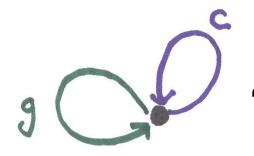
Tokenization

Regular

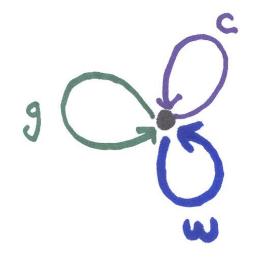
(home)



"c" means "go to CMU, then go home"



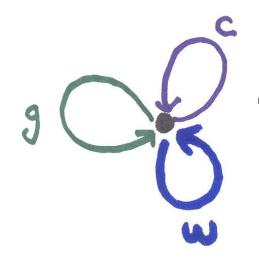
"c" means "go to CMU, then go home"
"g" means "get groceries, then go home"



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"w" means "go for a walk, then home"



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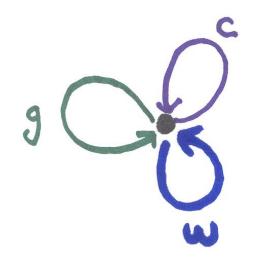
"w" means "go for a walk, then home"

Description of excursions in a given week:

c (go to CMU once) cc (go to CMU twice) ccc (go to CMU 3 times)

c* (go to CMU zero or more times)

cgc (go to CMU, then get groceries, then go to CMU)



"c" means "go to CMU, then go home"

"g" means "get groceries, then go home"

"w" means "go for a walk, then home"

Description of excursions in a given week:

g + w

(get groceries **OR** go for a walk)

 $(g + w)^*$

(zero or more times do one of the following: get groceries **OR** go for a walk)

 $(g + w)^*c$

(zero or more times do one of the following: get groceries **OR** go for a walk; after that go to CMU once)

Notation and Definitions

```
\Sigma is an alphabet of characters. (nonempty, finite) For example, \Sigma = \{a,b\}. (Using SML , #"a" : char.)
```

 Σ^* means the set of all finite-length strings over alphabet Σ, i.e., with characters in Σ. For example, aabba is in {a,b}*. (Using SML, "aabba": string.)

E is the *empty string*, containing no characters.

```
\varepsilon is in \Sigma^*. (Using SML, "" : string.)
```

Notation and Definitions

A language over Σ is a subset of Σ^* .

(In other words, a language is a set of finite-length strings with characters in Σ . A language may contain infinitely many strings.)

We are here interested in a particular class of languages called *regular languages*. The languages may have infinite size, but we will describe them via a finite representation called *regular expressions*, much like in the excursion example.

Assume we have been given some alphabet Σ .

Assume we have been given some alphabet Σ . A regular expression over Σ is any of the following:

a for every character $a \in \Sigma$,

set symbol meaning "is in"

(don't confuse with the empty string ε)

Assume we have been given some alphabet Σ .

- a for every character $a \in \Sigma$,
- 0 (a special symbol),

Assume we have been given some alphabet Σ .

```
a for every character a \in \Sigma,
```

- 0 (a special symbol),
- 1 (another special symbol),

Assume we have been given some alphabet Σ .

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0 (a special symbol),

1 (another special symbol),

r_1 + r_2 with r_1 and r_2 regular expressions (called alternation),
```

Assume we have been given some alphabet Σ .

```
    a for every character a ∈ Σ,
    0 (a special symbol),
    1 (another special symbol),
    r₁ + r₂ with r₁ and r₂ regular expressions (called alternation),
    r₁r₂ with r₁ and r₂ regular expressions (called concatenation),
```

Assume we have been given some alphabet Σ .

```
for every character a \in \Sigma,
  a
               (a special symbol),
               (another special symbol),
              with r<sub>1</sub> and r<sub>2</sub> regular expressions
r_1 + r_2
                 (called alternation),
               with r<sub>1</sub> and r<sub>2</sub> regular expressions
  r_1r_2
                 (called concatenation),
   r*
               with r a regular expression
                  (called Kleene star).
```

Assume we have been given some alphabet Σ .

A regular expression over Σ is any of the following:

(And use parentheses as needed.)

```
    r<sub>1</sub> + r<sub>2</sub> with r<sub>1</sub> and r<sub>2</sub> regular expressions (called alternation),
    r<sub>1</sub>r<sub>2</sub> with r<sub>1</sub> and r<sub>2</sub> regular expressions (called concatenation),
    r* with r a regular expression (called Kleene star).
```

Regular Languages

Given regular expression \mathbf{r} we define language $\mathbf{L}(\mathbf{r})$:

```
L(a) = \{a\} (singleton set) for every character a \in \Sigma,
L(0) = { } (the empty language, no strings),
L(1) = \{\epsilon\} (the language consisting of the empty string),
L(r_1 + r_2) = \{ s \mid s \in L(r_1) \text{ or } s \in L(r_2) \} \text{ (not exclusive)},
L(r_1r_2) = \{ s_1s_2 \mid s_1 \in L(r_1) \text{ and } s_2 \in L(r_2) \},
L(r^*) = \{ s \mid s = s_1 s_2 \cdots s_n, \text{ some } n \ge 0, \text{ with each } s_i \in L(r) \}
                (here we mean s = \varepsilon when n=0).
```

So: $\varepsilon \in L(r^*)$ for all regular expressions r.

Regular Languages

Let Σ be a given alphabet and L a subset of Σ^* .

We say that language L is regular if L = L(r) for some regular expression r.

(Fact: The class of regular languages over Σ is the minimal class containing the empty set and all singleton subsets of Σ , and that is closed under union, concatenation, and Kleene star.)

(The class is also closed under complement: L is regular iff $\Sigma^* \setminus L$ is regular.)

$$L(a) = \{a\}$$
 (singleton set consisting of the string a)

$$L((a + b)^*) = \Sigma^*$$
 (all finite-length strings with as and bs)

L((a + b)*aa(a + b)*) = all strings in
$$\Sigma$$
* containing at least two consecutive as.

$$L((a + 1)(b + ba)^*) = ?????$$

$$L(a) = \{a\}$$
 (singleton set consisting of the string a)

$$L((a + b)^*) = \Sigma^*$$
 (all finite-length strings with **a**s and **b**s)

L(
$$(a + b)*aa(a + b)*$$
) = all strings in $\Sigma*$ containing at least two consecutive **a**s.

$$L((a + 1)(b + ba)^*) =$$
all strings in Σ^* that do *not* contain two consecutive **a**s.

Comment: Different regular expressions can give rise to the same regular language.

For instance:

```
L(ab + b*ab)
= L((1 + b*)ab)
= L(b*ab)
= L(b*ab + 0)
= all strings in Σ* consisting of zero or more bs followed by ab (and nothing thereafter).
```

Comment: Different regular expressions can give rise to the same regular language.

For instance:

```
L(ab + b*ab)
= L((1 + b*)ab)
= L((1 + bb*)ab)
= L(b*ab)
= L(b*ab + 0)
```

In particular, for any reg exp r:

$$L(r^*) = L(1 + rr^*)$$

= all strings in Σ^* consisting of zero or more **b**s followed by **ab** (and nothing thereafter).

An Acceptor

We would like to implement a function that decides whether a given string **s** is in the language **L(r)** of a given regular expression **r**.

(Still need to define the regexp type.)

Suppose r = (a + ab)(a + b).

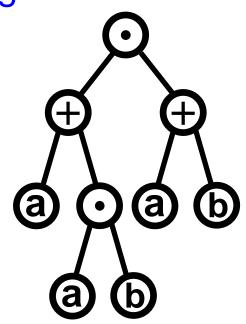
Then $L(r) = \{aa, ab, aba, abb\}.$

How does the acceptor recognize that $aba \in L(r)$?

By backtracking search.

View r as a tree.

Use up characters in **aba** matching tree operations determined by **r**.



Suppose r = (a + ab)(a + b).

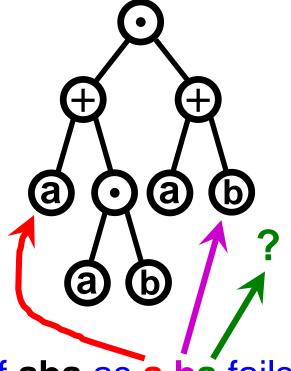
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First split of **aba** as **a ba** fails on last character.

Suppose r = (a + ab)(a + b).

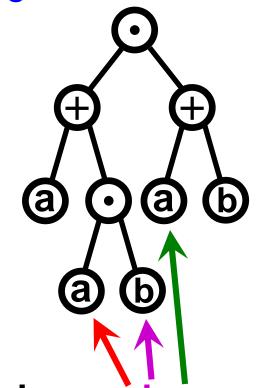
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How does the acceptor recognize that $aba \in L(r)$?

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View r as a tree.

Use up characters in **aba** matching tree operations determined by **r**.



Second split of aba as ab a succeeds.

Suppose r = (a + ab)(a + b). Then $L(r) = \{aa, ab, aba, abb\}$.

How does the acceptor recognize that **aba ∈ L(r)**? By backtracking search.

Tonight, do an evaluation trace on this example of the code we are about to write.

(Check yourself using today's lecture page.)

A Matcher

We will implement the backtracking search using a Boolean-specific continuation.

```
(* match : regexp -> char list ->
                     (char list -> bool) -> bool
  REQUIRES: k is total (aside: weaker condition
                  simplifies termination proof).
  ENSURES: (match r cs k) returns true if
              cs can be split as cs≅p@s, with
              p representing a string in L(r)
              and k(s) evaluating to true;
          (match r cs k) returns false, otherwise.
```

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               and k(s) evaluating to true;
          (match r cs k) returns false, otherwise.
*)
```

We use character lists instead of strings here for simplicity. In discussions/proofs we sometimes treat them as identical.

Acceptor Based on Matcher Specs

```
(* match : regexp -> char list ->
                       (char list -> bool) -> bool
   REQUIRES: k is total.
   ENSURES: (match r cs k) \cong true if
               cs \cong p@s, with p \in L(r) \& k(s) \cong true;
             (match r cs k) \cong false, otherwise.
   accept : regexp -> string -> bool
   REQUIRES: true
   ENSURES: (accept r s) \cong true if s \in L(r);
             (accept r s) \cong false otherwise.
*)
   fun accept r s =
          match r (String.explode s) List.null
```

Acceptor Based on Matcher Specs

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(* match : regexp -> char list ->
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   accept : regexp -> string -> bool
   REQUIRES: true
   ENSURES: (accept r s) \cong true if s \in L(r);
             (accept r s) \cong false otherwise.
*)
                           turns a string into a char list
   fun accept r s =
          match r (String.explode s) List.null
List.null: 'a list -> bool decides whether a list is empty.
```

Implementation

We will define a datatype that mirrors the mathematical definition of regular expressions.

We will implement a matcher that mirrors the definition of a regular expression's language.

Implementation

```
datatype regexp =
             Char of char
             Zero
             One
           | Plus of regexp * regexp
           | Times of regexp * regexp
           | Star of regexp
```

fun match

```
fun match (Char a) cs k =
```

```
fun match (Char a) cs k =
    (case cs of
    [] => ?????
    | c::cs' => )
```

Recall:

```
(match r cs k) \cong true if cs \cong p@s, with p \in L(r) & k(s) \cong true
```

$$L(a) = \{a\}$$

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fun match (Char a) cs k =
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$$L(a) = \{a\}$$

```
fun match (Char a) cs k =
        (case cs of
        [] => false
        | c::cs' => (a=c) andalso (k cs'))
```

Recall:

```
(match r cs k) \cong true if cs \cong p@s, with p \in L(r) & k(s) \cong true
```

$$L(0) = \{ \}$$

```
fun match (Char a) cs k =
        (case cs of
        [] => false
        | c::cs' => (a=c) andalso (k cs'))
        | match Zero _ _ = false
```

Recall:

```
(match r cs k) \cong true if cs \cong p@s, with p \in L(r) & k(s) \cong true
```

$$L(1) = \{\epsilon\}$$

```
fun match (Char a) cs k =
        (case cs of
        [] => false
        | c::cs' => (a=c) andalso (k cs'))
        | match Zero _ _ = false
        | match One cs k = k cs
```

```
fun match (Char a) cs k =
     (case cs of
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  | match Zero = false
  | match One cs k = k cs
  | match (Plus(r_1, r_2)) cs k =
```

```
(match r cs k) \cong true
if cs \cong p@s, With p \in L(r) \& k(s) \cong true
```

$$L(r_1 + r_2) = \{ s \mid s \in L(r_1) \text{ or } s \in L(r_2) \}$$

```
| match (Plus(r_1, r_2)) cs k = (match r_1 cs k) ?????
```

```
fun match (Char a) cs k =
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  | match Zero = false
  | match One cs k = k cs
  | match (Plus(r_1, r_2)) cs k =
      (match r<sub>1</sub> cs k) orelse (match r<sub>2</sub> cs k)
```

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  | match (Plus(r_1, r_2)) cs k =
      (match r<sub>1</sub> cs k) orelse (match r<sub>2</sub> cs k)
  | match (Times (r_1, r_2)) cs k =
```

```
(match r cs k) \cong true
if cs \cong p@s, With p \in L(r) \& k(s) \cong true
```

$$L(r_1r_2) = \{ s_1s_2 \mid s_1 \in L(r_1) \text{ and } s_2 \in L(r_2) \}$$

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| match (Times(r_1, r_2)) cs k = match r_1 cs (fn cs' => ?????
```

```
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  | match Zero = false
  | match One cs k = k cs
  | match (Plus(r_1, r_2)) cs k =
      (match r<sub>1</sub> cs k) orelse (match r<sub>2</sub> cs k)
  | match (Times (r_1, r_2)) cs k =
     match r_1 cs (fn cs' => match r_2 cs'
```

```
| match (Star r) cs k =
```

$$|$$
 match (Star r) cs $k =$

Recall: $L(r^*) = L(1 + rr^*)$

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```
| match (Star r) cs k =
  k cs orelse
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```
Recall: L(r^*) = L(1 + rr^*)
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```
| match (Star r) cs k =
   k cs orelse
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        match (Star r) cs' k)
```

Recall: $L(r^*) = L(1 + rr^*)$

There is a potential bug.

```
| match (Star r) cs k =
  (k cs) orelse (match r cs (fn cs' => match (Star r) cs' k))
```

```
| match (Star r) cs k =
  (k cs) orelse (match r cs (fn cs' => match (Star r) cs' k))
```

Imagine trying to prove that (match (Star r) cs k) reduces to a value as part of some larger induction proof that match always terminates (returns a value) when given input satisfying the specs.

In the Induction Hypothesis we may assume that (match r cs k) reduces to a value whenever k is total. So we need to establish that (fn cs' => match (Star r) cs' k) is total. Now we are in a circular argument!

```
| match (Star r) cs k =
  (k cs) orelse (match r cs (fn cs' => match (Star r) cs' k))
A possible way out: We don't really need to establish that
       (fn cs' => match (Star r) cs' k)
is total, merely that it returns values when called on suffixes cs'
of the given cs. Maybe a second induction on cs will help.
```

If we could show that cs' is a *proper suffix* of cs, we could perhaps establish eventual termination.

```
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```

If we could show that cs' is a *proper suffix* of cs, we could perhaps establish eventual termination.

ALAS, that need not be true:

```
match (Star One) [#"a"] List.null
```

will loop forever since List.null [#"a"] \cong false and since match One cs k' will pass all of cs to k'.

```
| match (Star r) cs k =
    (k cs) orelse (match r cs (fn cs' => match (Star r) cs' k))
```

This issue arises when the empty string is in L(r).

If we could show that cs' is a *proper suffix* of cs, we could perhaps establish eventual termination.

ALAS, that need not be true:

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will loop forever since List.null [#"a"] \cong false and since match One cs k' will pass all of cs to k'.

1. Change the specs:

- Require regular expressions to be in *standard form* (definition shortly).

2. Change the code:

 Explicitly check that cs' is a proper suffix of cs.

1. Change the specs

Definition:

A regular expression r is in standard form iff for any subexpression Star(r') of r, L(r') does not contain the empty string ϵ .

Fact: It is possible to convert any regular expression \mathbf{r} into a regular expression \mathbf{q} that is in standard form such that $\mathbf{L}(\mathbf{r}) = \mathbf{L}(\mathbf{q})$.

Consequently, if we **REQUIRE** regular expressions to be in standard form we avoid infinite loops without losing any regular languages. (Preprocess **r** into standard form, then call **match**.)

2. Change the code

2. Change the code

The code checks that cs' is a proper suffix of cs.

Sketch of a Proof of Correctness

1. Prove Termination

Show that (match r cs k) returns a value for all arguments r, cs, k satisfying REQUIRES specs. (This proof is surprisingly difficult. We assume it here.)

2. Prove Soundness and Completeness

Given termination, we can simplify the **ENSURES** specs in a convenient way, then perform structural induction. (We will write out one of the recursive cases here.)

Soundness & Completeness, Assuming Termination

Here are the given ENSURES specs for match:

```
(match r cs k) \cong true if cs\congp@s, with p\inL(r) and k(s)\cong true; (match r cs k) \cong false, otherwise.
```

Given termination, we can rephrase the specs as:

```
(match r cs k) \cong true if and only if there exist p and s such that cs \cong p@s, p \in L(r), and k(s) \cong true.
```

That is the theorem we must prove.

The "if" part is sometimes called "completeness".

The "only if" part is sometimes called "soundness".

For all values

```
\label{eq:regexp} \textbf{r}: \texttt{regexp}, \; \textbf{CS}: \texttt{char list}, \; \textbf{k}: \texttt{char list} -> \texttt{bool}, \; \texttt{with} \; \textbf{k} \; \texttt{total}, \\ \\ (\texttt{match} \; \; \textbf{r} \; \; \textbf{cs} \; \; \textbf{k}) \; \cong \; \textbf{true} \\ \\ & \text{if and only if} \\ \\
```

there exist p and s such that $cs \cong p@s$, $p \in L(r)$, and $k(s) \cong true$.

For all values

there exist p and s such that $cs \cong p@s$, $p \in L(r)$, and $k(s) \cong true$.

(We are assuming termination as a lemma.)

For all values

```
r: regexp, CS: charlist, k: charlist -> bool, with k total,  (\text{match r cs } k) \cong \text{true}  if and only if
```

there exist p and s such that $cs \cong p@s$, $p \in L(r)$, and $k(s) \cong true$.

(We are assuming termination as a lemma.)

<u>Proof</u>

By structural induction on **r**.

For all values

there exist p and s such that $cs \cong p@s$, $p \in L(r)$, and $k(s) \cong true$.

(We are assuming termination as a lemma.)

 $\underline{\mathsf{Proof}}$ By structural induction on \mathbf{r} .

Base Cases: Zero, One, Char (a) for every a:char.

For all values

```
r: regexp, cs: char list, k: char list -> bool, with k total,  (\text{match r cs k}) \cong \text{true}  if and only if
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there exist p and s such that $cs \cong p@s$, $p \in L(r)$, and $k(s) \cong true$.

(We are assuming termination as a lemma.)

 $\underline{\mathsf{Proof}}$ By structural induction on \mathbf{r} .

Base Cases: Zero, One, Char(a) for every a:char. Inductive Cases:

Plus (r_1, r_2) , Times (r_1, r_2) , Star (r).

For all values

r: regexp, cs: char list, k: char list -> bool, with k total, $(match \ r \ cs \ k) \ \cong \ true$ if and only if

there exist p and s such that $cs \cong p@s$, $p \in L(r)$, and $k(s) \cong true$.

(We are assuming termination as a lemma.)

Proof By structural induction on **r**.

Base Cases: Zero, One, Char(a) for every a:char. Inductive Cases:

Plus (r_1, r_2) , Times (r_1, r_2) , Star (r).

We will discuss only the **Plus** case here, as an example. (See also today's online notes, including another proof technique.)

Inductive Case $r = Plus(r_1, r_2)$, for some r_1, r_2 :

IH: For i=1,2 and for all values cs & k, with k total, (match r_i $cs k) \cong$ true iff there exist p&s such that $cs \cong p@s$, $p \in L(r_i)$, & $k(s) \cong$ true.

NTS: For all values cs & k, with k total, (match (Plus(r_1, r_2)) cs k) \cong true iff there exist p&s such that $cs \cong p@s$, $p \in L(Plus(<math>r_1, r_2$)), $\& k(s) \cong true$.

(We will prove the two parts of the "iff" separately.)

```
I. Suppose (match (Plus (r_1, r_2)) cs k) \cong true.
  NTS: There exist p\&s such that cs \cong p@s,
           p \in L(Plus(r_1, r_2)), & k(s) \cong true.
Showing:
                true
[assumption] \cong (match (Plus(r_1, r_2)) cs k)
   [Plus] \cong (match r_1 cs k) orelse (match r_2 cs k)
... One or both of the arguments to orelse must be true.
Let us suppose it is the first argument (proof similar for second).
So (match r_1 cs k) \cong true.
By IH for \mathbf{r}_1,
      there exist p&s s.t. cs \cong p@s, p \in L(r_1), & k (s) \cong true.
Then also p \in L(Plus(r_1, r_2)), by language definition for Plus.
```

That finishes this part of the proof (soundness).

II. Suppose there exist p&s such that $cs \cong p@s$, $p \in L(Plus(r_1, r_2))$, & k(s) $\cong true$.

NTS: $(match (Plus(r_1, r_2)) cs k) \cong true.$

Showing: $(match (Plus(r_1, r_2)) cs k)$ [Plus] $\cong (match r_1 cs k) orelse (match r_2 cs k)$ [see below] $\cong true$

By supposition, there exist p&s such that $cs \cong p@s$, $p \in L(Plus(r_1, r_2))$, & k(s) $\cong true$. By the language definition for Plus, $p \in L(r_1)$ and/or $p \in L(r_2)$.

If $p \in L(r_1)$, then (match r_1 cs k) \cong true by IH for r_1 . Otherwise, (match r_1 cs k) \cong false by termination, $p \in L(r_2)$, and (match r_2 cs k) \cong true by IH for r_2 .

That finishes this part of the proof (completeness), and so the Plus case.

That is all.

Please have a good lab.

See you Thursday.

We will discuss another matcher, inspired by staging and combinators.