# Regular expressions as types: Bit-coded regular expression parsing 

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## Regular expression

## Definition (Regular expression)

A regular expression ( $R E$ ) over finite alphabet $A$ is an expression of the form

$$
E, F::=0|1| a|E| F|E F| E *
$$

where $a \in A$
Used in bioinformatics, compilers (lexical analysis, control flow analysis), logic, natural language processing, program verification, protocol specification, query processing, security, XML access paths and document types, operating systems, scripting of searching, matching and substitution in texts or semi-structured data (Perl)...

## Language interpretation of regular expressions

## Definition (Language interpretation)

The language interpretation of a regular expression $E$ is the set of strings $\mathcal{L} \llbracket E \rrbracket$ defined by

$$
\begin{aligned}
\mathcal{L} \llbracket 0 \rrbracket & =\emptyset & \mathcal{L} \llbracket E \mid F \rrbracket & =\mathcal{L} \llbracket E \rrbracket \cup \mathcal{L} \llbracket F \rrbracket \\
\mathcal{L} \llbracket 1 \rrbracket & =\{\epsilon\} & \mathcal{L} \llbracket E F \rrbracket & =\mathcal{L} \llbracket E \rrbracket \odot \mathcal{L} \llbracket F \rrbracket \\
\mathcal{L} \llbracket a \rrbracket & =\{a\} & \mathcal{L} \llbracket E * \rrbracket & =\bigcup_{i \geq 0}(\mathcal{L} \llbracket E \rrbracket)^{i}
\end{aligned}
$$

where $S \odot T=\{s t \mid s \in S \wedge t \in T\}, E^{0}=\{\epsilon\}, E^{i+1}=E E^{i}$.

## Kleene's Theorem

Theorem (Kleene 1956)
A language is regular if and only it is denoted by a regular expression under its language interpretation.

## What is regular expression "matching"?

Given regular expression and input string, return ... what?
(1) yes or no (membership testing)
(2) zero or one substring matches for each regular subexpression (PCRE)
(3) any finite number of substring matches for each regular subexpression (regular expression types)
(c) a parse tree

## What is regular expression "matching"?

(1) Membership testing $=$ language interpretation.
(2) PCRE: Only one match under a Kleene star (typically the last)
(3) RET: Matches under two Kleene stars not grouped
(1) Parsing: Each Kleene star yields a list of matches (thus parse tree).

Note:

- Increasing structure: Lower level matching output constructible from higher level matching output, in particular from parsing.
- Classical automata theory (e.g. minimal DFA construction) only sound for membership testing.


## Practice

PCRE-style programming ${ }^{1}$ :

- Group matching: Does the RE match and where do (some of) its sub-REs match in the string?
- Substitution: Replace matched substrings by specified other strings
- Extensions: Backreferences, look-ahead, look-behind,...
- Lazy vs. greedy matching, possessive quantifiers, atomic grouping
- Optimization

Observe: Language interpretation (yes/no) inappropriate, need more refined interpretation

## Example

$$
((\mathrm{ab})(\mathrm{c} \mid \mathrm{d}) \mid(\mathrm{abc})) * .
$$

Match against abdabc.
For each parenthesized group a substring is returned. ${ }^{a}$

|  |  | PCRE |
| :--- | :--- | :--- | POSIX | $\$ 1=$ | $a b c$ | $a b c$ |
| :--- | :--- | :--- |
| $\$ 2=$ | $a b$ | $\epsilon$ |
| $\$ 3=$ | $c$ | $\epsilon$ |
| $\$ 4=$ | $\epsilon$ | $a b c$ |

${ }^{2}$ Or special null-value

## Intermezzo: Optimization??

Optimizing regular expressions $=$ rewriting them to equivalent form that is more efficient for matching. ${ }^{2}$


Cox (2007)

- Perl-compliant regular expressions (what you get in Perl, Python, Ruby, Java) use backtracking parsing.
- Does not handle "problematic" regular expressions: $E^{*}$ where $E$ contains $\epsilon$ - may crash at run-time (stack overflow).
${ }^{2}$ Friedl, Mastering Regular Expressions, chapter 6: Crafting an efficient


## Why discrepancy between theory and practice?

- Theory is extensional: About regular languages.
- Does this string match the regular expression? Yes or no?
- Practice is intensional: About regular expressions as grammars.
- Does this string match the regular expression and if so how-which parts of the string match which parts of the RE?
- Ideally: Regular expression matching $=$ parsing + "catamorphic" processing of syntax tree
- Reality:
- Naive backtracking matching, or
- finite automaton + opportunistic instrumentation to get some parsing information (TCL (?), Laurikari 2000, Cox 2010).


## Regular expression parsing

- Regular expression parsing: Construct parse tree for given string.
- Representation of parse tree: Regular expression as type


## Example

Parse abdabc according to ( $(a b)(c \mid d) \mid(a b c)) *$.

- $p_{1}=[\operatorname{inl}((a, b), \operatorname{inr} d), \operatorname{inr}(a,(b, c))]$
- $p_{2}=[\operatorname{inl}((a, b), \operatorname{inr} d), \operatorname{inl}((a, b), \operatorname{inl} c)]$
- $p_{1}, p_{2}$ have type $((a \times b) \times(c+d)+a \times(b \times c))$ list .
- Compare with regular expression ((ab)(c|d)|(abc))*.
- The elements of type $E$ correspond to the syntax trees for strings parsed according to regular expression E!


## Type interpretation

## Definition (Type interpretation)

The type interpretation $\mathcal{T}$ 【.】 compositionally maps a regular expression $E$ to the corresponding simple type:

$$
\begin{aligned}
\mathcal{T} \llbracket 0 \rrbracket & =\emptyset & & \text { empty type } \\
\mathcal{T} \llbracket 1 \rrbracket & =\{()\} & & \text { unit type } \\
\mathcal{T} \llbracket a \rrbracket & =\{a\} & & \text { singleton type } \\
\mathcal{T} \llbracket E \mid F \rrbracket & =\mathcal{T} \llbracket E \rrbracket+\mathcal{T} \llbracket F \rrbracket & & \text { sum type } \\
\mathcal{L} \llbracket E F \rrbracket & =\mathcal{T} \llbracket E \rrbracket \times \mathcal{T} \llbracket F \rrbracket & & \text { product type } \\
\mathcal{T} \llbracket E^{*} \rrbracket & =\left\{\left[v_{1}, \ldots, v_{n}\right\rfloor \mid v_{i} \in \mathcal{T} \llbracket E \rrbracket\right\} & & \text { list type }
\end{aligned}
$$

## Flattening

## Definition

The flattening function flat(.) : $\operatorname{Val}(\mathcal{A}) \rightarrow \operatorname{Seq}(\mathcal{A})$ is defined as follows:

$$
\begin{aligned}
\operatorname{flat}(())=\epsilon & \text { flat }(a)=a \\
\text { flat(inl } v)=\text { flat }(v) & \text { flat(inr } w)=\text { flat }(w) \\
\text { flat }((v, w)) & =\operatorname{flat}(v) \operatorname{flat}(w) \\
\operatorname{flat}\left(\left[v_{1}, \ldots, v_{n}\right]\right) & =\operatorname{flat}\left(v_{1}\right) \ldots \operatorname{flat}\left(v_{n}\right)
\end{aligned}
$$

## Example

$$
\begin{aligned}
f l a t([\operatorname{inl}((a, b), \operatorname{inr} d) \operatorname{inr}(a,(b, c))]) & =a b d a b c \\
\text { flat }([\operatorname{inl}((a, b), \operatorname{inr} d), \operatorname{inl}((a, b), \operatorname{inl} c)]) & =a b d a b c
\end{aligned}
$$

## Regular expressions as types

Informally:
string $s$ with syntax tree $p$ according to regular expression $E$ $\cong$
string flat $(v)$ of value $v$ element of simple type $E$

## Theorem

$$
\mathcal{L} \llbracket E \rrbracket=\{\operatorname{flat}(v) \mid v \in \mathcal{T} \llbracket E \rrbracket\}
$$

## Membership testing versus parsing

## Example

$$
E=((\mathrm{ab})(\mathrm{c} \mid \mathrm{d}) \mid(\mathrm{abc})) * \quad E_{d}=(\mathrm{ab}(\mathrm{c} \mid \mathrm{d})) *
$$

- $E_{d}$ is unambiguous: If $v, w \in \mathcal{T} \llbracket E_{d} \rrbracket$ and flat $(v)=$ flat $(w)$ then $v=w$. (Each string in $E_{d}$ has exactly one syntax tree.)
- $E$ is ambiguous. (Recall $p_{1}$ and $p_{2}$.)
- $E$ and $E_{d}$ are equivalent: $\mathcal{L} \llbracket E \rrbracket=\mathcal{L} \llbracket E_{d} \rrbracket$
- $E_{d}$ "represents" the minimal deterministic finite automaton for $E$.
- Matching (membership testing): Easy-use $E_{d}$.
- But: How to parse according to $E$ using $E_{d}$ ?


## Bit coding

General idea:

- Have nondeterministic machine/algorithm $M$ with no input, generating all elements of a set
- Use sequence of choices as representation of output (modulo M)

For regular languages:

- Record binary choices for expanding a regular expression $E$ into a particular string $s$.
- The sequence of choices (as bits) to drive machine to particular output $s$ as the bit coding of $s$ under $E$.


## Bit coding: Example

## Example

Recall syntax trees $p_{1}, p_{2}$ for abdabc under $E=((a \times b) \times(c+d)+a \times(b \times c))^{*}$.

- $p_{1}=[\operatorname{inl}((a, b), \operatorname{inr} d), \operatorname{inr}(a,(b, c))]$
- $p_{2}=[\operatorname{inl}((a, b), \operatorname{inr} d), \operatorname{inl}((a, b), \operatorname{inl} c)]$

We can code them by storing only their inl, inr occurrences:

$$
\begin{aligned}
& \operatorname{code}\left(p_{1}\right)=011 \\
& \operatorname{code}\left(p_{2}\right)=0100
\end{aligned}
$$

## Bit decoding

There is a linear-time polytypic function decode that can reconstitute the syntax trees.

## Theorem <br> $\operatorname{decode}_{E}\left(\operatorname{code}_{E}(v)\right)=v$ for all $v \in \mathcal{T} \llbracket E \rrbracket$.

## Example

$$
\begin{aligned}
\operatorname{decode}_{E}(011) & =[\operatorname{inl}((a, b), \operatorname{inr} d), \operatorname{inr}(a,(b, c))] \\
\operatorname{decode}_{E}(0100) & =[\operatorname{inl}((a, b), \operatorname{inr} d), \operatorname{inl}((a, b), \operatorname{inl} c)]
\end{aligned}
$$

## Why bit coding?

Bit coding of string $s$ under $E$

- represents a syntax tree of $s$
- takes at most as much space as $|s|$ and often a lot less (depending on $E$ )
- can be combined with statistical compression for text compression


## Bit coded regular expression parsing

- Problem:
- Input: string $s$ and regular expression $E$.
- Output: (some) parse tree $p$ such that $\operatorname{flat}(p)=s$.
- Goal: Output bit coding $\operatorname{code}_{E}(p)$ instead.
- Dual advantage:
- Less space used for output.
- Output faster to compute.
- How to do that? Mark the "turns" in Thompson NFA (they yield the bit coding)


## DFASIM algorithm: Outline

(1) RE to NFA: Build Thompson-style NFA with suitable output bits
(2) NFA to DFA: Perform extended DFA construction (only for states required by input string), with (multiple) bit sequence annotations on edges
(3) Traverse accepting path from right to left to construct bit coding by concatenating bit sequences.

## Thompson-style NFA generation with output bits

| E | NFA | Extended NFA |
| :---: | :---: | :---: |
| 0 | $\xrightarrow[\longrightarrow]{(1)} \underset{\rightarrow}{\longrightarrow}$ | $\xrightarrow{(1) \longrightarrow}$ |
| 1 | $\rightarrow$ (0) $\rightarrow$ | $\rightarrow$ (0) $\rightarrow$ |
| a | $\longrightarrow(0) \rightarrow$ (1) $\rightarrow$ | $\longrightarrow(0) \xrightarrow{a / 1} \rightarrow$ |
| E F | $\rightarrow$ (0) ${ }^{\mathrm{E}} \rightarrow{ }^{\text {F }} \rightarrow$ | $\rightarrow$ (0) ${ }^{\mathrm{E}} \rightarrow \mathrm{Cl}^{\mathrm{F}} \rightarrow{ }^{(2)}$ |
| $E \mid F$ | $\rightarrow(0)$ | $\rightarrow(0)$ |
| $E^{*}$ |  |  |

## Benchmark examples

| $1:$ | $\backslash w+([-+.] \backslash w+) * @ \backslash w+([-.] \backslash w+) * \backslash . \backslash w+([-.] \backslash w+) *$ <br> $([, ;] \backslash s * \backslash w+([-+.] \backslash w+) * @ \backslash+([-.] \backslash w+) * \backslash . \backslash w+([-.] \backslash w+) *) *$ |
| :---: | :--- |
| $2:$ | $\$ ?(\backslash d\{1,3\}, ?(\backslash d\{3\}, ?) * \backslash d\{3\}(\backslash . \backslash d\{0,2\}) ?\|\backslash d\{1,3\}(\backslash . \backslash d\{0,2\}) ?\| \backslash . \backslash d\{1,2\} ?)$ |
| $4:$ | $[A-Z a-z 0-9](([\backslash . \backslash-] ?[a-z A-Z 0-9]+) *) @([A-Z a-z 0-9]+)$ |
|  | $(([\backslash . \backslash-] ?[a-z A-Z 0-9]+) *) \backslash .([A-Z a-z][A-Z a-z]+)$ |
| $5:$ | $(\backslash w \mid-)+@((\backslash w \mid-)+\backslash)+.(\backslash w \mid-)+$ |
| $6:$ | $[+-] ?([0-9] * \backslash . ?[0-9]+\mid[0-9]+\backslash . ?[0-9] *)([e E][+-] ?[0-9]+) ?$ |
| $7:$ | $((\backslash w\|\backslash d\| \backslash-\mid \backslash)+) @.\{1\}(((\backslash w\|\backslash d\| \backslash-)\{1,67\}) \mid((\backslash w\|\backslash d\| \backslash-)+\backslash .(\backslash w\|\backslash d\| \backslash-)\{1,67\}))$ |
|  | $\backslash .((([a-z]\|[A-Z]\| \backslash d)\{2,4\})(\backslash .([a-z]\|[A-Z]\| \backslash d)\{2\}) ?)$ |
| $8:$ | $(([A-Z a-z 0-9]++)\|([A-Z a-z 0-9]+\backslash-+)\|([A-Z a-z 0-9]+\backslash .+) \mid([A-Z a-z 0-9]+\backslash++)) *$ |
|  | $[A-Z a-z 0-9]+@((\backslash w+\backslash-+) \mid(\backslash w+\backslash)). * \backslash w\{1,63\} \backslash .[a-z A-Z]\{2,6\}$ |
| $9:$ | $(([a-z A-Z 0-9 \backslash-\backslash]+) @.([a-z A-Z 0-9 \backslash-\backslash]+.) \backslash .([a-z A-Z]\{2,5\})\{1,25\})+$ |
|  | $([;].(([a-z A-Z 0-9 \backslash-\backslash]+) @.([a-z A-Z 0-9 \backslash-\backslash]+.) \backslash .([a-z A-Z]\{2,5\})\{1,25\})+) *$ |
| $10:$ | $((\backslash w+([-+.] \backslash w+) * @ \backslash w+([-.] \backslash w+) * \backslash . \backslash w+([-.] \backslash w+) *) \backslash s *[],\{0,1\} \backslash s *)+$ |

From Veanes, de Halleaux, Tillman (2010)

## Benchmark experiments (without \#3)



## Regular expression algorithms compared

- FrCa: Based on Frisch, Cardelli (2004), right-to-left first phase, left-to-right second phase.
- DFASIM: As above.
- DFA: As DFASIM, but staged. Extended DFA for complete extended Thomson-NFA generated, before application to input.
- Precompiled DFA: As DFA, but extended DFA specialized (in C ++ ) and compiled.
- Backtracking: PCRE-style backtracking parser.

All algorithms:

- generate bit codes;
- coded in C++


## Benchmark experiment \#1



## Benchmark experiment \#2



## Benchmark experiment \#4



## Benchmark experiment \#5



## Benchmark experiment \#6



## Benchmark experiment \#7

Example \#7


## Benchmark experiment \#8



## Benchmark experiment \#9



## References

- Henglein, Nielsen, "Regular Expression Containment: Coinductive Axiomatization and Computational Interpretation", POPL 2011
- Nielsen, Henglein, "Bit-coded Regular Expression Parsing", LATA 2011


## Related work

- Frisch, Cardelli (2004): Regular types corresponding to regular expressions, linear-time parsing for REs;
- Hosoya et al. (2000-): Regular expression types, proper extension of regular types (!), axiomatization of tree containment
- Aanderaa (1965), Salomaa (1966), Krob (1990), Pratt (1990), Kozen (1994, 2008), Grabmeyer (2005), Rutten et al. (2008): RE axiomatizations (extensional)
- Rutten et al. (1998-): Coalgebraic approach to systems, including finite automata, extensional
- Brandt/Henglein (1998): Coinduction rule and computational interpretation for recursive types
- Cameron (1988), Jansson, Jeuring (1999): Bit coding for CFGs and algebraic types
- Cox (2010): RE2 regular expression library, TCL RE library (appear to be state of the Perl/POSIX-style "regex" libraries)


## Questions?

## Future work

- Construction of minimal extended NFAs: All
- Regular expression parsing with projection (throwing subtrees away)
- Regular expression parsing with catamorphic postprocessing (substituting subtrees)
- Regular expression library as practical alternatives to PCRE, RE2 and Tcl, etc., with improved expressiveness, semantics and performance.

