

# Regular Combinators for String Transformations

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**EXCAPE**  
Expeditions in Computer Augmented  
Program Engineering



**Penn**  
Engineering

# Our Goal

Languages,  $\Sigma^* \rightarrow \text{bool}$   $\equiv$  Regular expressions  
Transformations,  $\Sigma^* \rightarrow \Gamma^*$   $\equiv$  ?

# String Transformations

... are all over the place

- ▶ Find and replace  
Rename variable `foo` to `bar`
- ▶ Spreadsheet macros  
Convert phone numbers like “(123) 456-7890” to  
“123-456-7890”
- ▶ String sanitization
- ▶ ...

# String Transformations

## Tool and theory support

- ▶ Good tool support: sed, AWK, Perl, domain-specific tools, ...
- ▶ Renewed interest: Recent transducer-based tools such as Bek, Flash-Fill, ...
- ▶ But unsatisfactory theory ...
- ▶ Expressibility: Can I express  $\langle \textit{favorite transformation} \rangle$  using  $\langle \textit{favorite tool} \rangle$ ?
- ▶ Analysis questions:
  - ▶ Is the transformation well-defined for all inputs?
  - ▶ Does the output always have some “nice” property?  
 $\forall \sigma$ , is it the case that  $f(\sigma) \in L$ ?
  - ▶ Are two transformations equivalent?

# Historical Context

## Regular languages

### Beautiful theory

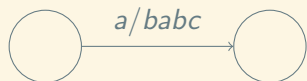
Regular expressions  $\equiv$  DFA

Analysis questions (mostly) efficiently decidable

Lots of practical implementations

# String Transducers

One-way transducers: Mealy machines



Folk knowledge [Aho et al 1969]

Two-way transducers strictly more powerful than one-way transducers

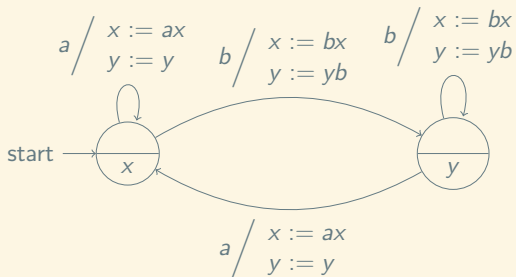
Gap includes many transformations of interest

Examples: string reversal, copy, substring swap, etc.

# Regular String Transformations

- ▶ Two-way finite state transducers are our notion of regularity
- ▶ Known results
  - ▶ Closed under composition [Chytil, Jákł 1977]
  - ▶ Decidable equivalence checking [Gurari 1980]
  - ▶ Equivalent to MSO-definable string transformations [Engelfriet, Hoogeboom 2001]
- ▶ Recent result: Equivalent one-way deterministic model with applications to the analysis of list-processing programs [Alur, Černý 2011]

# Streaming String Transducers (SST)

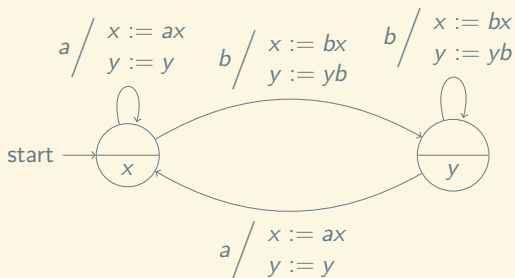


If input ends with a  $b$ , then delete all  $a$ -s, else reverse

- ▶  $x$  contains the reverse of the input string seen so far
- ▶  $y$  contains the list of  $b$ -s read so far



# Streaming String Transducers (SST)



- ▶ Finitely many locations
- ▶ Finite set of registers
- ▶ Transitions test-free
- ▶ Registers concatenated (copyless updates only)
- ▶ Final states associated with registers (output functions)

# Regular String Transformations

Rephrasing our goal

Languages, DFA  $\equiv$  Regular expressions  
Transformations, SST  $\equiv$  ?

# Can we Find an Equivalent Regex-like Characterization?

## Motivation

- ▶ Theoretical: To understand regular functions
- ▶ Practical: As the basis for a domain-specific language for string transformations

Base functions:  $R \mapsto \gamma$

If  $\sigma \in L(R)$ , then  $\gamma$ , and otherwise undefined

$$(\{ ".c" \} \cup \{ ".cpp" \}) \mapsto ".cpp"$$

Analogue of basic regular expressions:  $\{a\}$ , for  $a \in \Sigma$

$R$  is a regular expression and  $\gamma$  is a constant

If-then-else:  $\text{ite } R \ f \ g$

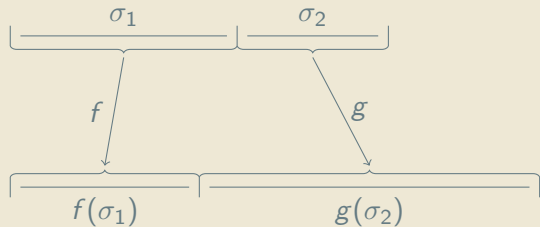
If  $\sigma \in L(R)$ , then  $f(\sigma)$ , and otherwise  $g(\sigma)$

$\text{ite } [0 - 9]^* \ (\Sigma^* \mapsto \text{"Number"}) \ (\Sigma^* \mapsto \text{"Non-number"})$

Analogue of **unambiguous** regex union

## Split sum: $\text{split}(f, g)$

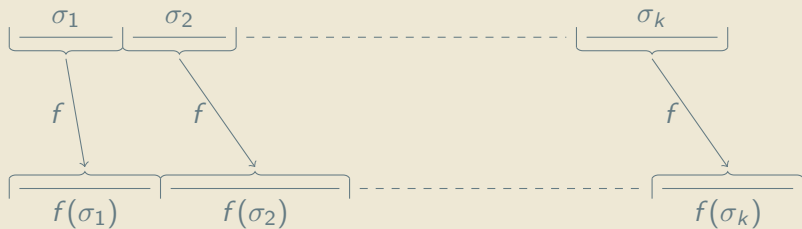
Split  $\sigma$  into  $\sigma = \sigma_1\sigma_2$  with both  $f(\sigma_1)$  and  $g(\sigma_2)$  defined. If the split is unambiguous then  $\text{split}(f, g)(\sigma) = f(\sigma_1)g(\sigma_2)$



Analogue of regex concatenation

## Iterated sum: $\text{iterate}(f)$

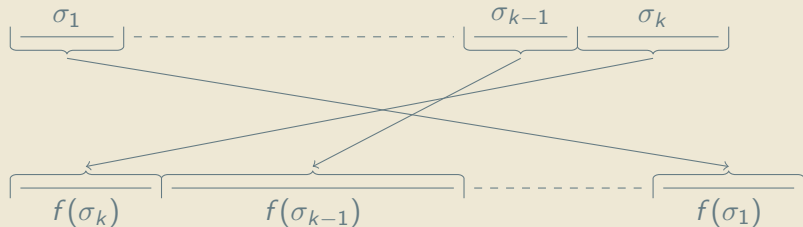
Split  $\sigma = \sigma_1\sigma_2\dots\sigma_k$ , with all  $f(\sigma_i)$  defined. If the split is unambiguous, then output  $f(\sigma_1)f(\sigma_2)\dots f(\sigma_k)$



- ▶ Kleene-\*
- ▶ If *echo* echoes a single character, then  $\text{iterate}(\text{echo})$  is the identity function

## Left-iterated sum: $\text{left-iterate}(f)$

Split  $\sigma = \sigma_1\sigma_2\dots\sigma_k$ , with all  $f(\sigma_i)$  defined. If the split is unambiguous, then output  $f(\sigma_k)f(\sigma_{k-1})\dots f(\sigma_1)$

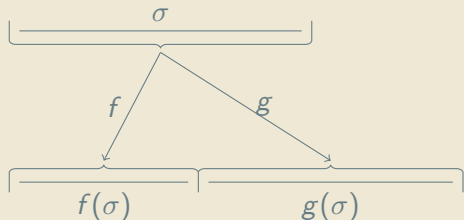


Think of  $\sigma \mapsto \sigma^{\text{rev}}$ :  $\text{left-iterate}(\text{echo})$



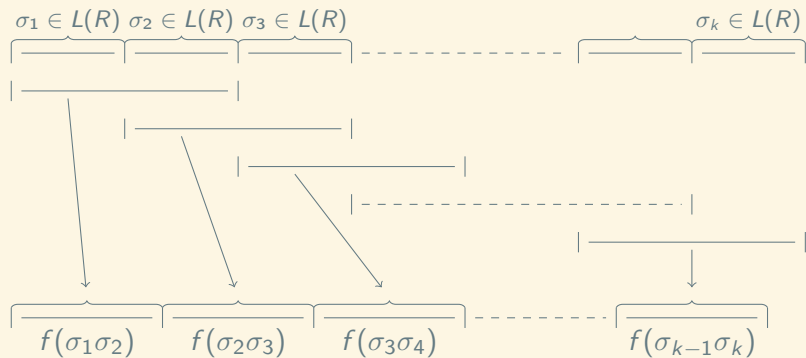
# “Repeated” sum: $\text{combine}(f, g)$

$$\text{combine}(f, g)(\sigma) = f(\sigma)g(\sigma)$$



- ▶ No regex equivalent
- ▶  $\sigma \mapsto \sigma\sigma$ :  $\text{combine}(id, id)$

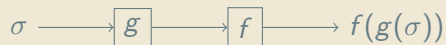
## Chained sum: $\text{chain}(f, R)$



And similarly for  $\text{left-chain}(f, R)$

## Function composition: $f \circ g$

$$f \circ g(\sigma) = f(g(\sigma))$$



Regular string transformations are closed under composition

# Function Combinators are Expressively Complete

## Theorem (Completeness)

*All regular string transformations can be expressed using the following combinators:*

- ▶ *Basic functions:  $a \mapsto \gamma$ ,  $\epsilon \mapsto \gamma$ ,  $\perp$ ,*
- ▶ *ite  $R f g$ ,  $\text{split}(f, g)$ ,  $\text{combine}(f, g)$ , and*
- ▶ *chained sums:  $\text{chain}(f, R)$ , and  $\text{left-chain}(f, R)$ .*

# Function Combinators are Expressively Complete

Arbitrary monoids  $(\mathbb{D}, \otimes, 0)$

- ▶ Functions  $\Sigma^* \rightarrow \mathbb{D}$  for an arbitrary monoid  $(\mathbb{D}, \otimes, 0)$
- ▶ All machinery still works: Function combinators remain expressively complete  
Base functions:  $a \mapsto \gamma, \epsilon \mapsto \gamma$ , for  $\gamma \in \mathbb{D}$
- ▶ Strings  $(\Gamma^*, \cdot, \epsilon)$  just a special case
- ▶ Monoid of discounted costs  $(cost, discount) \in \mathbb{R} \times [0, 1]$   
 $(c, d) \otimes (c', d') = (c + dc', dd')$   
Identity element:  $(0, 1)$   
Potentially useful for quantitative analysis

# The Special Case of Commutative Monoids

## Expressive completeness of function combinators

- ▶ Integers under addition  $(\mathbb{Z}, +, 0)$ , and integer-valued cost functions  $\Sigma^* \rightarrow \mathbb{Z}$
- ▶ Example: Count number of  $a$ -s followed by  $b$

$$\text{split}(b^* \mapsto 0, \text{iterate}(a^+ \cdot b^+ \mapsto 1), a^* \mapsto 0)$$

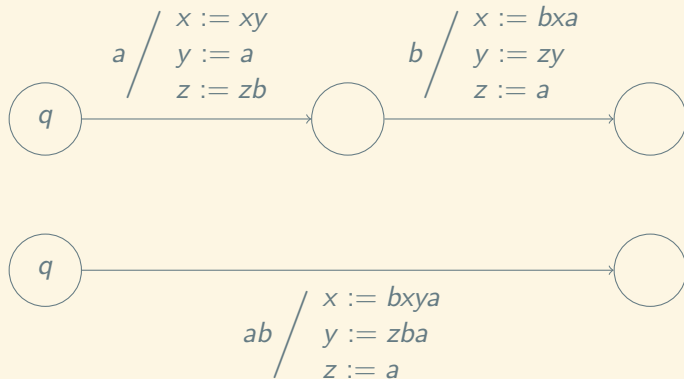
- ▶ Smaller set of combinators needed for expressive completeness
  - ▶ Basic functions:  $a \mapsto \gamma$ ,  $\epsilon \mapsto \gamma$ ,  $\perp$
  - ▶  $\text{ite } R f g$ ,  $\text{split}(f, g)$ , and
  - ▶  $\text{iterate}(f)$
- ▶ Unnecessary combinators:  $\text{combine}(f, g)$ ,  $\text{chain}(f, R)$ ,  $\text{left-chain}(f, R)$

## A Taste of the Proof

Broadly similar to DFA-to-Regex translation

# A Taste of the Proof

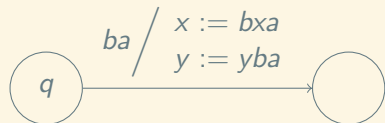
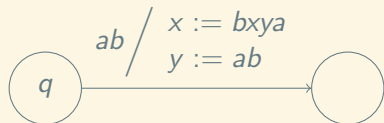
Summarize effect of (individual) strings





# A Taste of the Proof

## Shapes



$$x := \xleftrightarrow{\gamma_{x1}} x \xleftrightarrow{\gamma_{x2}} y \xleftrightarrow{\gamma_{x3}} \rightarrow$$

$$y := \xleftrightarrow{\gamma_{y1}} \rightarrow$$

$$x := \xleftrightarrow{\gamma_{x1}} x \xleftrightarrow{\gamma_{x2}} \rightarrow$$

$$y := \xleftrightarrow{\gamma_{y1}} y \xleftrightarrow{\gamma_{y2}} \rightarrow$$

# A Taste of the Proof

Summarizing effect of (a set of) strings

“Summarize” = “Give expression for each patch”

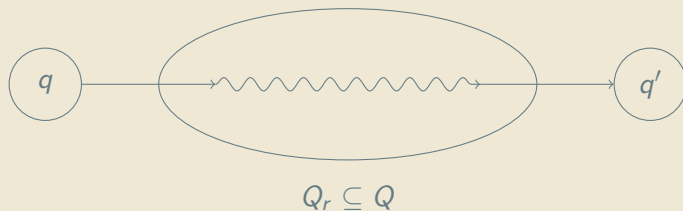
$$x := \xleftrightarrow{\gamma_{x1}} x \xleftrightarrow{\gamma_{x2}} y \xleftrightarrow{\gamma_{x3}}$$

$$y := \xleftrightarrow{\gamma_{y1}}$$

# A Taste of the Proof

## Piggyback on the Regex-to-DFA Translation Algorithm

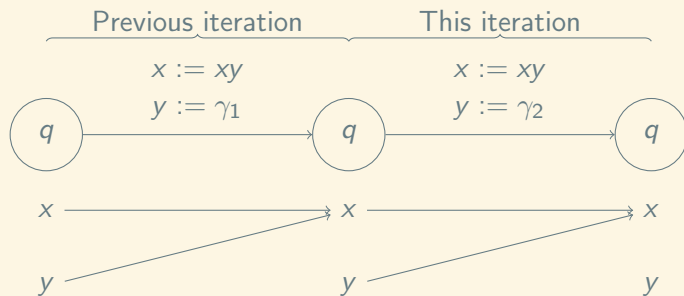
Summarize all paths  $q \rightarrow q'$  with shape  $S$



Start with  $Q_r = \emptyset$  and iteratively add states until  $Q_r = Q$

# A Taste of the Proof

Summarizing loops: Or why the chained sum is needed

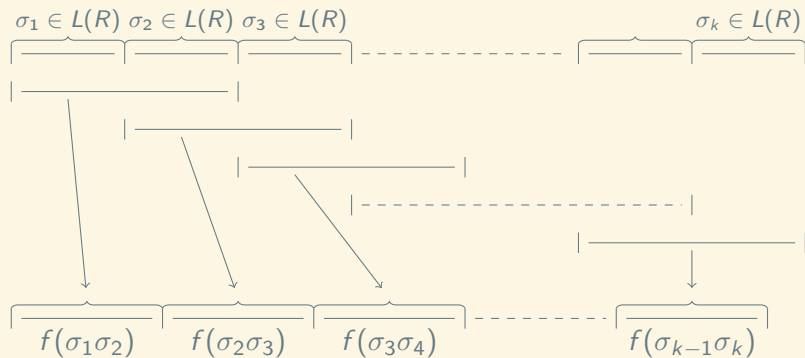


Value appended to  $x$  at the end of *this* loop iteration ( $\gamma_1$ ) depends on value computed in  $y$  during the *previous* iteration

Chained sum

# A Taste of the Proof

Recall the chained sum:  $\text{chain}(f, R)$



## Conclusion

Introduced a declarative notation for regular string transformations

# Conclusion

## Summary of operators

Purpose	Regular Transformations	Regular Expressions
Base	$R \mapsto \gamma$	$\{a\}$ , for $a \in \Sigma$
Union	ite $R f g$	$R_1 \cup R_2$
Concatenation	split( $f, g$ )	$R_1 \cdot R_2$
Kleene-*	iterate( $f$ ) (also left-iterate( $f$ ))	$R^*$
Repetition	combine( $f, g$ )	New!
Chained sum	chain( $f, R$ ) (and left-chain( $f, R$ ))	
Composition	$f \circ g$	

# Future Work

- ▶ Design and implement a DSL for string transformations based on these foundations
- ▶ Lower bounds on expressibility of certain functions
- ▶ Theory of regular functions
  - ▶ Strings to numerical domains
  - ▶ Strings to semirings
  - ▶ Trees to trees / strings (Processing hierarchical data, XML documents, etc.)
  - ▶  $\omega$ -strings to strings
- ▶ Automatically learn transformations
  - ▶ from input/output examples
  - ▶ from teachers ( $L^*$ )



Thank you! Questions?  
Suggestions? Brickbats?