

# Natuurlijke Taalverwerking II 2006/2007

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[www.let.rug.nl/~gosse/ntv2](http://www.let.rug.nl/~gosse/ntv2)

## Regular Expressions

[A,B]	A followed by B
{A,B}	A or B
[A,B^]	An A optionally followed by a B
A*	zero or more occurrences of A
A+	one or more occurrences of A
?	Any symbol
'0'..'9'	Symbol in the range of '0' .. '9'
\$ A	A string containing A

## Overzicht

- Relatie tussen Reg Ex en Automaten
- (Non-)determinisme
- Transducers
- Operaties op Transducers

## More Regular Expressions

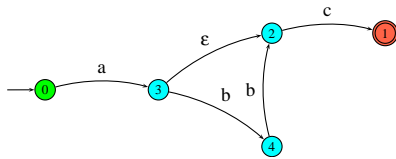
~ A	A string not matching A
A - B	A string matching A but not B
A & B	A string matching A and B

## Examples

[? *, i,s,h]	A string with suffix <b>ish</b>
\$ [q,u]	A string containing <b>qu</b>
'0'..'9'	a digit
'0'..'9' - '2'	all digits except 2
~ '0' ...'9'	not a digit (i.e. includes a, 10, $\epsilon$ )
\$ a & \$ b	strings containing an a and a b

## Epsilon

- Epsilon transition's (jumps) allow transition from one state to another without reading any input symbol

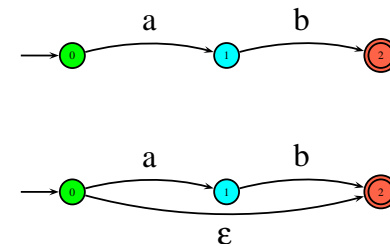


## From Reg Ex to FSA

- Every Reg Ex corresponds with a FS automaton
- Every Reg Ex **operator** defines an operation on FS automata

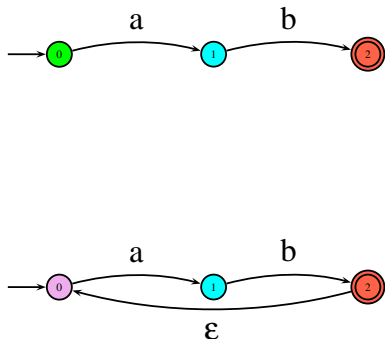
## Optional

$[a,b]^{\wedge}$



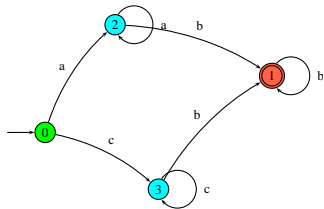
## Kleene Closure

$[a, b]^*$



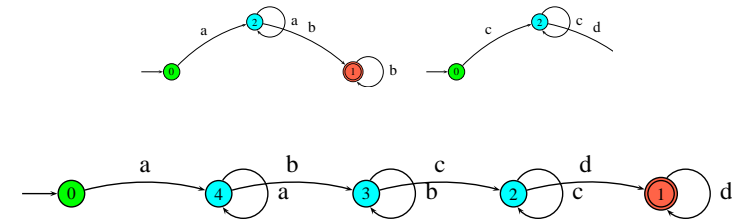
## Union

$\{[a^+, b^+], [c^+, b^+]\}$

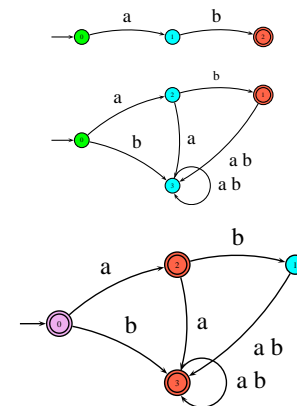


## Concatenation

$[[a^+, b^+], [c^+, d^+]]$



## Complement

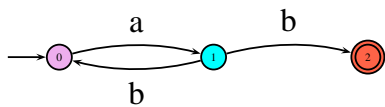
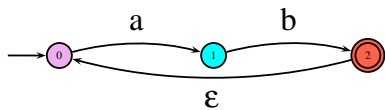


- Input automaton must be **deterministic**

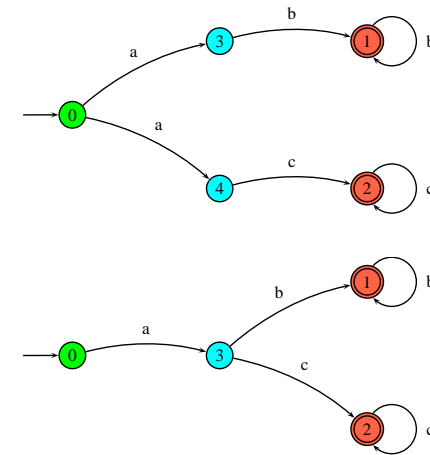
## Deterministic Recognizer

- A FS recognizer is deterministic iff
  - ★ it has a single start state,
  - ★ it has no epsilon transitions,
  - ★ for each state and each symbol there is at most one applicable transition.
- For every  $M$  there is a deterministic (efficient) automaton  $M'$  such that  $L(M) = L(M')$ .

## Removing Epsilons



## Removing Non-deterministic Transitions



## Converting NFA to DFA

[www.cs.may.ie/~jpower/Courses/parsing/](http://www.cs.may.ie/~jpower/Courses/parsing/)

We use a Deterministic Finite-State Automaton (DFA) which is a special case of a NFA with the additional requirements that:

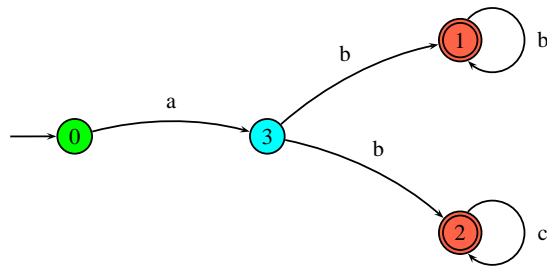
- There are no transitions involving  $\epsilon$ ,
- No state has two outgoing transitions based on the same symbol .

## Subset Construction Algorithm

- The  $\epsilon$ -closure function takes a state and returns the set of states reachable from it based on (one or more)  $\epsilon$ -transitions.
- The function **move** takes a state and a character, and returns the **set of states** reachable by one transition on this character.

$$\text{move}(\{A, B\}, a) = \text{move}(A, a) \cup \text{move}(B, a)$$

### Example



$$\{(0, a, 3), (3, b, 1), (3, b, 2), (1, b, 1), (2, c, 2)\}$$

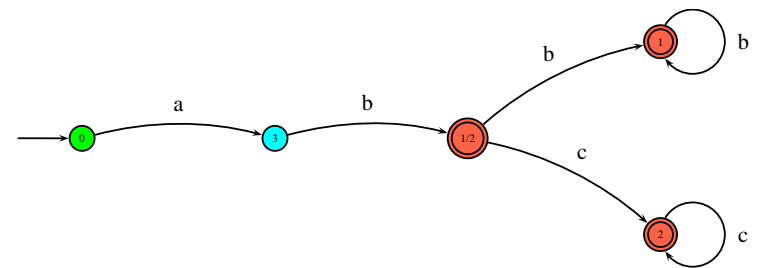
$$\Downarrow$$

$$\{(0, a, 3), (3, b, \{1, 2\}), (\{1, 2\}, b, 1), (\{1, 2\}, c, 2), (1, b, 1), (2, c, 2)\}$$

## The Subset Construction Algorithm II

1. DFA start state =  $\epsilon$ -closure(NFA start state).
2. For each new DFA-state S and possible input symbol a:
  - Add the transition  $(S, a, \epsilon\text{-closure}(\text{move}(S, a)))$
3. Apply step 2 to newly added states.
4. DFA finish states = states containing a NFA finish state.

### DFA



## Intermezzo: RegEx without Kleene \*

- Automata for languages definable without Kleene \* or + have interesting properties (Yli Jyrä, EACL 2003)
- Can you define the language  $a^*$  without using Kleene \*, +, or \$

## Recognizers vs Transducers

- A finite state **recognizer** is an automaton which **accepts** strings (yes/no decisions):
  - ★ recognize Zip Codes, Proper Names, Syllables, ...
- A finite state **transducer** is an automaton which maps one string onto another string:
  - ★ Map Letters onto Phonemes, Inflected words onto Base Forms, Words onto Part of Speech Tags, ....

## Intermezzo: RegEx without Kleene \*

- Can you define the language  $a^*$  without using Kleene \*, +, or \$
- $\sim[\{\}, \sim\{\}], ? -a, \{\}, \sim\{\}$

## Stemming

- Translate a word into its **base form**,
- For **information retrieval**:
  - ★ Given a query, find relevant documents
  - ★ A query with **republican**, can lead to a document with **republicans**.

## Stemming

Georgia	georgia
Republicans	republican
are	be
getting	get
strong	strong
encouragement	encouragement
to	to
enter	enter
a	a
candidate	candidate

## Part of Speech Tagging

AT1	a
JJ	relative
NN1c	handful
IO	of
DAz	such
NN2	reports
VBDZ	was
VVNv	received

## Part of Speech Tagging

- Translate a sequence of words into a sequence of **Part of Speech Tags**
- Useful as a first step towards full **parsing** or to support **searching** for linguistic patterns,

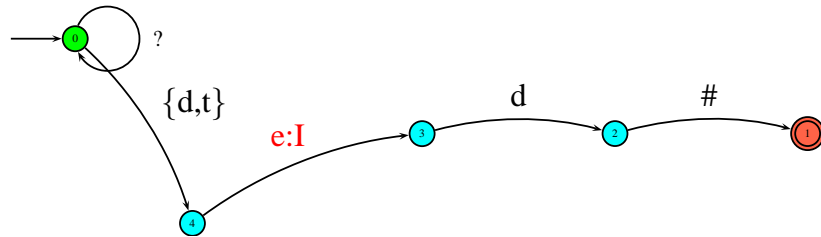
## Grapheme to Phoneme Conversion

- Translate a sequence of letters into a sequence of phonemes
- Required for Text to Speech applications
- Each letter or sequence of letters is translated into a phoneme

a	b	b	r	e	v	i	a	t	e	d
↓	↓	↓	↓	↓	↓	↓	↓	↓	↓	↓
@	b	€	r	i	v	l	1	t	l	d

## Encoding a Rule

- $e \rightarrow I / \{t,d\} \_ d \#$



- abbreviated#  $\rightarrow$  abbreviatId#

## Regex Notation for Transducers

- $[a:b, c^*]$  is short for  $[a:b, (c:c)^*]$
- By default, a regular expression without ':' is read as the **identity-transducer**: every symbol in the input is mapped onto itself.

## Regex Notation for Transducers

- $[a:b, c^*]$  translates, among others, **accc** in **bccc**.
- **:** is the 'pair'-operator: it translates a **symbol A** in a **symbol B**.

## Dutch Diminitives

huis+je  $\rightarrow$  huisje  
 haan+je  $\rightarrow$  haantje  
 man+je  $\rightarrow$  mannetje

input	h	u	i	s	+	j	e	
output	h	u	i	s	ε	j	e	
input	h	a	a	n	+	j	e	
output	h	a	a	n	t	j	e	
input	m	a	n	ε	ε	+	j	e
output	m	a	n	n	e	t	j	e



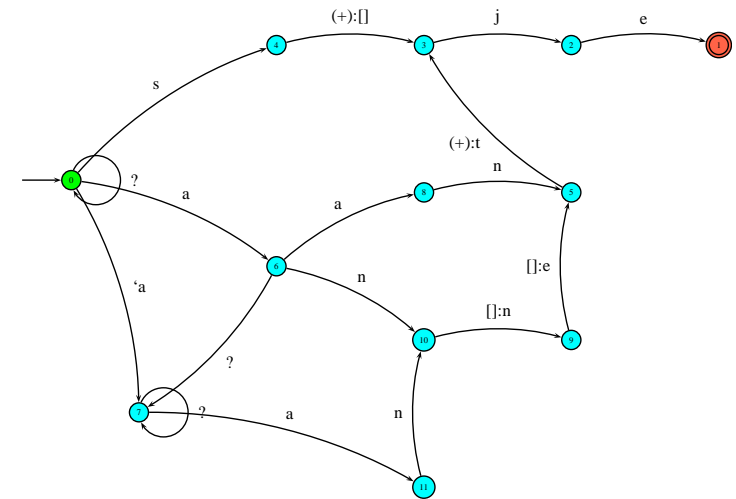
## Dutch Diminitives

```
[? *,{[s,+ :[]],
  [a,a,n,+ :t],
  [~a,a,n,[]:n,[]:e,+ :t]
},
j,e
]
```

## (Non-)determinism

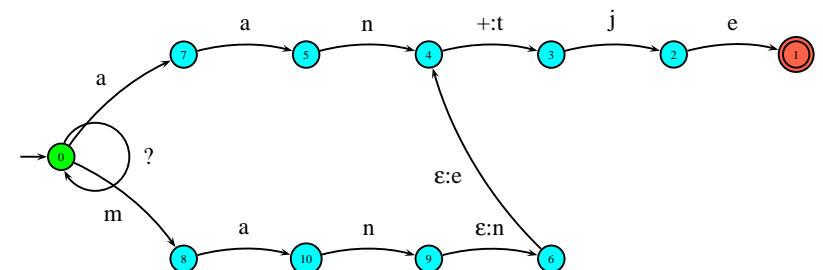
- An transducer is **deterministic** if for every state and inputsymbol, at most a single transduction to a new state is possible.
- Non-deterministic **transducers** can sometimes be made deterministic, but **not always**.
- Non-deterministic **recognizers** can **always** be made deterministic.

## Dutch Diminitives



## Non-Determinism: Example

maan+je → maantje  
 man+je → mannetje



## Two Sources of Non-determinism

- Unbounded Look-ahead

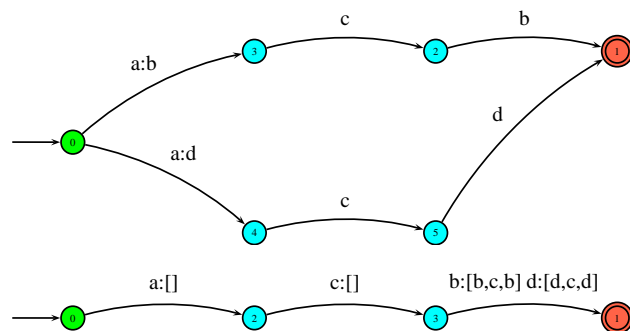
- ★  $acccb \rightarrow bcccb \text{ } acccd \rightarrow dcccd$
- ★  $\{[a:b, c^*, b], [a:d, c^*, d]\}$

- Multiple outputs

- ★  $bloem+je \rightarrow bloempje$
- ★  $bloem+je \rightarrow bloemetje$
- ★  $[?^*, o, e, m, \{+:p, +:[e,t,]\}, j, e]$

## Making a Transducer Deterministic

$acb \rightarrow bcb$   
 $acd \rightarrow dcd$



## Deterministic Transducers

- Deterministic transducers are more **efficient** than non-deterministic transducers (because no choice-points/backtracking/search is required).
- But deterministic transducers can be **much larger** than corresponding non-deterministic transducer.
- (`t_determinize` option in FSA).

## From English to Dutch Numbers

- Automatic translation of (spoken) English into Dutch requires translation of number words,
- $twentyone \rightarrow \text{eenentwintig}$ ,
- $twentyone \rightarrow 21 \rightarrow \text{eenentwintig}$

## From Number Words to Numbers

```
macro(one, {one:1, two:2, ...,
           nine:9 } ).
macro(twenty, {twenty:2,thirty:3,...,
              ninety:9 } ).
macro(eng2num,{ one,ten:[1,0],
                eleven:[1,1],...,
                nineteen:[1,9],
                [twenty,one]      } ).
```

## Composition

- The **composition** of transducers T1 and T2 is a new transducer T3, which is equivalent to passing the input through T1, **taking the output of T1 as input for T2**, and taking the output of T2 as output.
- $T1 \circ T2$  denotes the composition of T1 and T2.

## From English to Dutch Numbers

- Transducer **T1** for translating English Number Words into Numbers,
- Transducer **T2** for translating Numbers into Dutch Number Words
- The output of **T1** is used as input by **T2**.

## Number Translation by Composition

```
macro(eng2num,
      {{one,ten:[1,0],...}}).
macro(num2dut,
      {1:een,2: twee, ...}).
macro(eng2dut,
      eng2num o num2dut).
```

## Input/Output reversal

- The inverse of a transducer  $T$  is a transducer which takes as **input** the output of  $T$ , and produces as **output** the input of  $T$ .
- In FSA:  $\text{inverse}(T)$ .
- Translating Dutch into English:

```
macro(dutch2eng,  
      inverse(num2dut) o inverse(eng2num) ).  
macro(dutch2eng,  
      inverse(eng2dut) ).
```

## Finite State POS Tagging

- A Solution:
  - ★ A non-deterministic  $T$  which assigns a word all possible POS tags,
  - ★ Recognizers  $R$  which filter the output of  $T$ ,
  - ★ **Compose**  $T$  and (the identity transducer for)  $R$ .

## Finite State POS Tagging

- Assign Part of Speech tags to words,
- but many words have more than one POS:
  - ★ The/**det** report/**n** was/**aux** written/**v**
  - ★ The/**det** police/**n** has/**aux** to/**aux** report/**v**  
all/**det** problems/**n**

## Finite State POS Tagging

```
macro(lexicon,  
      { all:det,has:aux,police:n,problems:n,  
        report:{v,n},the:det,to:v,was:aux,  
        written:v}* ).  
macro(no_det_v,  
      ~ $ [ det, v ] ).  
macro(tagger,  
      lexicon o no_det_v ).
```