# Computational morphology. Day 1. Theory of formal languages.

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- Day 5: Other methods and models for morphological analysis.

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- Finite automata for linguistic phenomena.

## What is morphology?

"Morphology is the study of the forms of words, and the ways in which words are related to other words of the same language." (R. Andersen).

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#### Informally, morphology studies:

- How the word changes in different contexts (word inflection).
- What factors determine these changes (morphological categories).
- What parts of the word reflect these changes (morpheme analysis).

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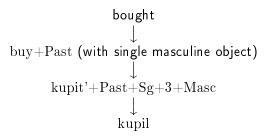
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 The effect of context is far more strong in highly inflective languages (Russian, Czech etc.).

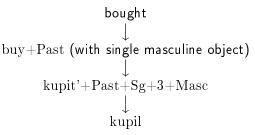
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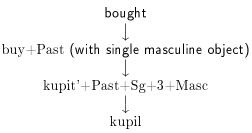
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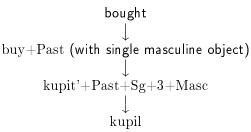
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- Information retrieval.
- Language modelling: making a probability model more sparse.
- Actually, morphological tagging is a preprocessing step for almost all NLP tasks.

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- Now let us describe a word...
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- Answer:  $(C|V)^*V(C|V)^*$  where | stands for OR.

Theory of formal languages

Regular languages

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     (V stands for unstressed).
  - We have an arbitrary number of such groups  $(C^*VC^*-)^*$  followed by a stressed syllable  $C^*V_0C^*$ .
  - Concatenating, we obtain  $(C^*VC^*-)^*C^*V_0C^*$ .

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  - Together,  $(C^*VC^*-)^*C^*V_0^*C^*-(C^*VC^*-)^*C^*VC^*$ .

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- It is simple:  $(C|V)^*(a|i|e)r(se)$ ?.
- C is an arbitrary consonant (just join all consonants with |) and
   V is a vowel.

Theory of formal languages
Regular languages

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- Solution: list all that is allowed.

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  - Contains a vowel and ends with h or C''h, where C'' stands for all consonants except  $s, c: (C|V)^*V(C|V)^*C''?h$
- Grouping all together:  $(C|V)^*((a|e|i|o|u|Vy)|V(C|V)^*(C'|C''?h))s$ .

Theory of formal languages

Regular languages
Formal definitions

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  - Iteration (Kleene star):  $L^* = \bigcup_{k=0}^{\infty} L^k$ .
  - $\{a,b\}^* = \{a,b\}^0 \cup \{a,b\}^1 \cup \{a,b\}^2 \cup \ldots = \{\varepsilon,a,b,aa,ab,ba,bb,\ldots\}.$

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# Regular languages Exercise: vowel harmony

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#### Exercise: Turkish infinitives.

In Turkish there are 8 vowels:

	Front	Back
Soft	e i	а।
Round	üö	uо

Infinitive is formed by suffix -mek/-mak attached to verb stem, where e appears if the last vowel of stem is front and a – if it is back. Write a regular expression for Turkish infinitives.

Computational morphology. Day 1. Theory of formal languages.

Theory of formal languages Finite automata

#### Finite automata

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Theory of formal languages
Finite automata

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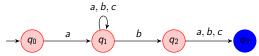
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#### Schematically:



• That is finite automaton.

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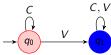
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- Automaton  $\mathcal{A}$  accepts language  $L(\mathcal{A})$  of all words that label paths from initial state to some final.

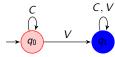
### Finite automata: examples

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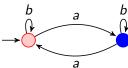


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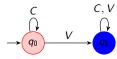
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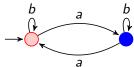
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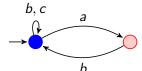
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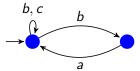
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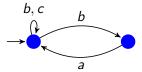
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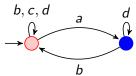
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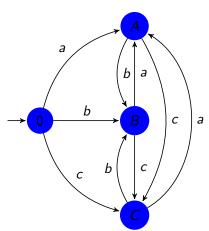
• To the right of every a occurs b with no a, c between them, alphabet a, b, c, d.



Finite automata

## Finite automata: examples

No repeating letters, alphabet a, b, c. States correspond to letters:

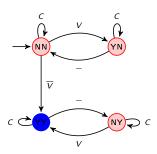


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Computational morphology. Day 1. Theory of formal languages.

Theory of formal languages

Finite automata

Finite automata: English plural

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Theory of formal languages

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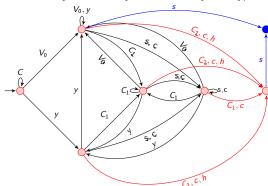
## Finite automata: English plural

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- Automaton for all possible stems

$$(C_0 = C - \{s, x, z, c, h\}, C_1 = C_0 \cup \{s, x, z\})$$
:



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Theory of formal languages

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### Theorem.

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- Mark as terminal all states from which terminal states are  $\varepsilon$ -reachable.
- Now remove all  $\varepsilon$ -paths.

Computational morphology. Day 1. Theory of formal languages.

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Every automata language can be recognized by deterministic automata.

- New automaton states are sets of old states.
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Computational morphology. Day 1. Theory of formal languages.

Theory of formal languages

Finite automata

### Kleene theorem

#### **Theorem**

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Theory of formal languages

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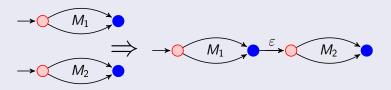
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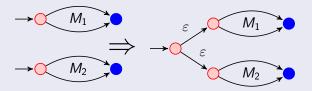
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Union: 
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Iteration:  $L_1 = L(M_1), L_1^* = L(M)$ 



Theory of formal languages

Finite automata

## Properties of automata languages

Theorem

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Theory of formal languages

Finite automata

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- Switching non-terminal and terminal states yields automaton for the complement.

Theory of formal languages

Finite automata

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#### where

- L<sub>sib</sub> words ending with sibilant.
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- The basic languages are the automata ones; the automaton for the whole expression could be constructed recursively.

#### Turkish infinitive

Construct a finite automaton for Turkish infinitive

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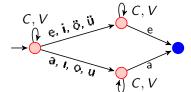
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- M<sub>2</sub> checks the condition for vowels:



•  $M_1 \cap M_2$  is the required automaton.

#### Turkish infinitive

Construct a finite automaton for turkish passive infinitive

- Infinitive has the form stem +X + mEk.
- Placeholder E is filled by e if the stem ends with e, i, ö, ü and a if it ends with a, i, o, u.
- Suffix X is -n if the stem ends with vowel, -In if the stem ends with I and -II otherwise.
- Placeholder I equals 1 after a, 1; u after u, o; i after e, i; ü after ü, ö.

# Where to get presentations

- https://www.irit.fr/esslli2017/courses/33.
- http://tipl.philol.msu.ru/~otipl/index.php/department/ faculty/AAS/esslli

For the next day:

Install (simply download and unpack) finite-state compiler FOMA from https://code.google.com/archive/p/foma/.