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

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## Outline of the course

- Day 1: What is computational morphology? Theory of formal languages: regular expressions and finite automata.


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


## Day 1 outline

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- What is computational morphology?
- Regular expressions.
- Finite automata.
- 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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Basic tasks of computational morphology:

- Morphological analysis (tagging):

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


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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...
- A word includes at least one vowel and arbitrary number of consonants.
- Answer: $(C \mid V)^{*} V(C \mid V)^{*}$ where $\mid$ stands for OR.

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- All unstressed syllables are followed by a hyphen. That is $C^{*} V C^{*}-$ ( $V$ stands for unstressed).
- We have an arbitrary number of such groups $\left(C^{*} V C^{*}-\right)^{*}$ followed by a stressed syllable $C^{*} V_{0} C^{*}$.
- Concatenating, we obtain $\left(C^{*} V C^{*}-\right)^{*} C^{*} V_{0} C^{*}$.


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- Second case: stressed syllable is not the last one.
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- Arbitrary number of hyphenated unstressed syllables, followed by a hyphenated stressed syllable,
- followed by arbitrary number of hyphenated unstressed syllables, followed by an unstressed syllable.
- Together, $\left(C^{*} V C^{*}-\right)^{*} C^{*} V_{0} C^{*}-\left(C^{*} V C^{*}-\right)^{*} C^{*} V C^{*}$.


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- Another variant: $\left(C^{*} V C^{*}-\right)^{*} C^{*} V_{0} C^{*}\left(-C^{*} V C^{*}\right)^{*}$.


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

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- But $-s$ must be avoided after $s, x, z, c h, s h, \mathrm{C} y$, where $\mathbf{C}$ is arbitrary consonant.
- But regular expression cannot express negative patterns.
- Solution: list all that is allowed.


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- Grouping all together: $(C \mid V)^{*}\left((a|e| i|o| u \mid V y) \mid V(C \mid V)^{*}\left(C^{\prime} \mid C^{\prime \prime} ? h\right)\right) s$.

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- Iteration (Kleene star): $L^{*}=\bigcup_{k=0}^{\infty} L^{k}$.


## Regular languages

## Formal definitions

- Alphabet - arbitrary finite set $\Sigma$, its elements - letters.
- Words - finite sequences of letters, the set of words $-\Sigma^{*}$.
- $\varepsilon$ - empty word.
-     - concatenation of words, $a d \cdot b c=a d b c$.
- Languages - sets of words: $L \subseteq \Sigma^{*}$.
- Operations on languages:
- Boolean operations: $L_{1} \cup L_{2}, L_{1} \cap L_{2}, L_{1}-L_{2}, \bar{L}$ (complement).
- Concatenation: $L_{1} \cdot L_{2}=\left\{w_{1} \cdot w_{2} \mid w_{1} \in L_{1}, w_{2} \in L_{2}\right\}$.
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- $\{a, b\}^{*}=\{a, b\}^{0} \cup\{a, b\}^{1} \cup\{a, b\}^{2} \cup \ldots=\{\varepsilon, a, b, a a, a b, b a, b b, \ldots\}$.


## Regular expressions: what is it formally

- We distinguish regular expression $\alpha$ and its language $L(\alpha)$.
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- Regular languages: languages that can be expressed by regular expressions.


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## Exercise: vowel harmony

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## Exercise: Turkish infinitives.

In Turkish there are 8 vowels:

|  | Front | Back |
| :--- | :--- | :--- |
| Soft | e i | a । |
| Round | ü ö | u o |

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

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Schematically:


- That is finite automaton.

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

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- Every $a$ is immediately preceded by $b$, alphabet $a, b, c$.


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- Every $a$ is immediately preceded by $b$, alphabet $a, b, c$.

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



## Finite automata: examples

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


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- All plural forms can be decomposed as stem + s, where

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## Finite automata: English plural

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- A stem is anything with at least one vowel, but not ending with:
- -s, -x, -z, -sh, -ch, -zh (sibilants).
- C $y$.


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## Finite automata: English plural

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- A stem is anything with at least one vowel, but not ending with:
- $-s,-x,-z,-s h,-c h,-z h$ (sibilants).
- Cy.
- Automaton for all possible stems $\left(C_{0}=C-\{s, x, z, c, h\}, C_{1}=C_{0} \cup\{s, x, z\}\right)$ :


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## Properties of finite automata

## Theorem

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- Split all labels of length $\geqslant 2$ by inserting additional states.
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- Split all labels of length $\geqslant 2$ by inserting additional states.
- Now we have only letters and $\varepsilon$ as labels.
- Add an edge $\left\langle q_{1}, a\right\rangle \rightarrow q_{2}$ if there exist states $q_{3}, q_{4}$ such that $\left(\left\langle q_{3}, a\right\rangle \rightarrow q_{4}\right) \in \Delta$ and there are $\varepsilon$-paths from $q_{1}$ to $q_{3}$ and from $q_{4}$ to $q_{2}$.


## Properties of finite automata

## Theorem

Every automata language is recognized by an automaton with single letter labels.

## Sketch of the proof

- Split all labels of length $\geqslant 2$ by inserting additional states.
- Now we have only letters and $\varepsilon$ as labels.
- Add an edge $\left\langle q_{1}, a\right\rangle \rightarrow q_{2}$ if there exist states $q_{3}, q_{4}$ such that $\left(\left\langle q_{3}, a\right\rangle \rightarrow q_{4}\right) \in \Delta$ and there are $\varepsilon$-paths from $q_{1}$ to $q_{3}$ and from $q_{4}$ to $q_{2}$.
- 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.
Theory of formal languages
Finite automata
Properties of finite automata

## Properties of finite automata

## Definition

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Every automata language can be recognized by deterministic automata.

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- Start state $Q_{0}=\left\{q_{0}\right\}$ (only old start state).
- Final states: subsets containing at least one old final state.

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

## Finite automata

Kleene theorem

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The classes of automata and regular languages are the same.

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- We should prove that regular operations preserve automata languages.

Computational morphology. Day 1. Theory of formal languages.
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Union: $L_{1}=L\left(M_{1}\right), L_{2}=L\left(M_{2}\right) \rightarrow L_{1} \cup L_{2}=L(M)$


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Iteration: $L_{1}=L\left(M_{1}\right), L_{1}^{*}=L(M)$


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- Consider the deterministic automaton for language $L$.
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- Switching non-terminal and terminal states yields automaton for the complement.


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Theory of formal languages

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- Easy variant: $L_{1} \cap L_{2}=\overline{\overline{L_{1}} \cup \overline{L_{2}}}$.
- Complex (but effective) variant: consider complete deterministic automata $M_{1}$ for $L_{1}$ and $M_{2}$ for $L_{2}$.
- Let $Q_{1}, Q_{2}$ be their sets of states, $q_{01}, q_{02}$ be initial states and $F_{1}, F_{2}$ be sets of final states.


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- Its start state is $\left\langle q_{01}, q_{02}\right\rangle$.
- On the first coordinate it operates like $M_{1}$, on the second like $M_{2}$.
- Finite states are pairs of final states (the automaton accepts iff it accepts for both coordinates).

Computational morphology. Day 1. Theory of formal languages.
Recursive construction of automata

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- For example, the automata for English plural can be expressed as:

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\left(L_{s i b} \cdot e s\right) \cup\left(\left(\left(\overline{L_{s i b}} \cap L_{C}\right) \cup L_{C y} \cup L_{V}\right) \cdot s\right),
$$

where

- $L_{\text {sib }}$ - words ending with sibilant.
- $L_{C}$ - words ending with consonant.
- $L_{C_{y}}-$ words ending with consonant $+y$.
- $L_{V}-$ words ending with vowel (not $y$ ).


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- $L_{V}$ - words ending with vowel (not $y$ ).
- The basic languages are the automata ones; the automaton for the whole expression could be constructed recursively.


## Recursive construction of automata

## Turkish infinitive

Construct a finite automaton for Turkish infinitive

- Infinitive has the form stem $+m E k$.
- Placeholder $E$ is filled by $e$ if the stem ends with $e, i, \ddot{O}, \ddot{u}$ and $a$ if it ends with $a, I, o, u$.


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- $M_{2}$ checks the condition for vowels:

- $M_{1} \cap M_{2}$ is the required automaton.


## Recursive construction of automata

## Turkish infinitive

Construct a finite automaton for turkish passive infinitive

- Infinitive has the form stem $+X+m E k$.
- Placeholder $E$ is filled by e if the stem ends with $e, i, \ddot{O}, \ddot{u}$ 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 $-I l$ otherwise.
- Placeholder I equals $\iota$ after a, $\boldsymbol{i} ; \boldsymbol{u}$ after $u, o ; i$ after $e, i ; u ̈$ after $\ddot{u}, \ddot{0}$.


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

