

# Clearing Restarting Automata



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- The new model **can be learned very efficiently** from positive examples and its stronger version enables to learn effectively a **large class of languages**.
- We relate the class of languages recognized by clearing restarting automata to the **Chomsky hierarchy**.

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  - $I$  is a finite set of *instructions*  $(x, z, y)$ ,  $x \in LC_k$ ,  $y \in RC_k$ ,  $z \in \Sigma^+$ ,
    - ✦ **left context**  $LC_k = \Sigma^k \cup \clubsuit.\Sigma^{\leq k-1}$
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  - The special symbols:  $\phi$  and  $\$$  are called *sentinels*.
  - The *width of the instruction*  $i = (x, z, y)$  is  $|i| = |xzy|$ .

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- The *k-cl-RA*-automaton  $M$  *recognizes* the language  $L(M) = \{w \in \Sigma^* \mid M \text{ accepts } w\}$ .

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- Similarly  $\mathcal{L}(cl\text{-}RA)$  denotes the class of all languages accepted by  $cl\text{-}RA$ -automata.



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- $\mathcal{L}(cl\text{-RA}) = \bigcup_{k \geq 1} \mathcal{L}(k\text{-cl-RA})$ .
- **Note:** For every *cl-RA*  $M$ :  $\lambda \vdash_M^* \lambda$  hence  $\lambda \in L(M)$ . If we say that *cl-RA*  $M$  recognizes a language  $L$ , we mean that  $L(M) = L \cup \{\lambda\}$ .

# Motivation



- This model was inspired by the *Associative Language Descriptions (ALD)* model:
  - By Alessandra Cherubini, Stefano Crespi-Reghizzi, Matteo Pradella, Pierluigi San Pietro.
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- The simplicity of *c/-RA* model implies that the investigation of its properties is not so difficult and also the learning of languages is easy.
- Another important advantage of this model is that the instructions are human readable.

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- For instance:
  - $aaaabbbb \vdash^{R1} aaabbb \vdash^{R1} aabb \vdash^{R1} \underline{ab} \vdash^{R2} \lambda$ .
- Now we see that the word  $aaaabbbb$  is **accepted** because  $aaaabbbb \vdash_M^* \lambda$ .

# Some Theorems



- Error preserving property: Let  $M = (\Sigma, I)$  be a *cl-RA-automaton* and  $u, v$  be two words from  $\Sigma^*$ . If  $u \vdash_M^* v$  and  $u \notin L(M)$ , then  $v \notin L(M)$ .
  - **Proof.**  $v \in L(M) \Rightarrow v \vdash_M^* \lambda \Rightarrow u \vdash_M^* v \vdash_M^* \lambda \Rightarrow u \in L(M)$ . ■

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  - **Proof.**  $v \in L(M) \Rightarrow v \vdash_M^* \lambda \Rightarrow u \vdash_M^* v \vdash_M^* \lambda \Rightarrow u \in L(M)$ . ■
- Observation: For each **finite**  $L \subseteq \Sigma^*$  there exist *1-cl-RA-automaton*  $M$  such that  $L(M) = L \cup \{\lambda\}$ .
  - **Proof.** Suppose  $L = \{w_1, \dots, w_n\}$ .  
Consider  $I = \{(\$, w_1, \$), \dots, (\$, w_n, \$)\}$ . ■

# Some Theorems



- **Theorem:**  $\mathcal{L}(k\text{-cl-RA}) \subset \mathcal{L}((k+1)\text{-cl-RA})$ , for all  $k \geq 1$ .
- **Note:** The following language:  $\{ (c^k a c^k)^n (c^k b c^k)^n \mid n \geq 0 \}$  belongs to  $\mathcal{L}((k+1)\text{-cl-RA}) - \mathcal{L}(k\text{-cl-RA})$ .

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  - For each  $z \in \Sigma^*$ ,  $|z| = n$  there exist  $u, v, w$  such that  $|v| \geq 1$  and  $\delta(q_0, uv) = \delta(q_0, u)$ ; the word  $v$  can be crossed out.

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  - For each accepted  $z \in \Sigma^{<n} - \{\lambda\}$  we add instruction  $i_z = (\$, z, \$)$ .

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  - **Note**:  $L_1$  can be recognized by a simple *RRWW*-automaton. Moreover  $L_1$  is a *context-free language*, thus we get the following corollary:
- **Corollary**:
  - $\mathcal{L}(cl-RA) \subset \mathcal{L}(RRWW)$ .
  - $CFL - \mathcal{L}(cl-RA) \neq \emptyset$ .

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- Theorem: Languages  $L_2 \cup L_3$  and  $L_2 \cdot L_3$  are **not recognized** by any *cl-RA-automaton*.
- Corollary:  $\mathcal{L}(cl-RA)$  is **not closed** under **union**, **concatenation**, and **homomorphism**.
  - For homomorphism use  $\{a^n b^n \mid n \geq 0\} \cup \{c^n d^{2n} \mid n \geq 0\}$  and homomorphism defined as:  $a \mapsto a, b \mapsto b, c \mapsto a, d \mapsto b$ . ■



# Some Theorems



- It is easy to see that each of the following languages:
    - $L_4 = \{a^n cb^n \mid n \geq 0\} \cup \{a^m b^m \mid m \geq 0\}$
    - $L_5 = \{a^n cb^m \mid n, m \geq 0\} \cup \{\lambda\}$
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- **intersection with regular language**:  $L_5$  is regular.

- **set difference**:  $L_1 = (L_4 - L_6) \cup \{\lambda\}$ .

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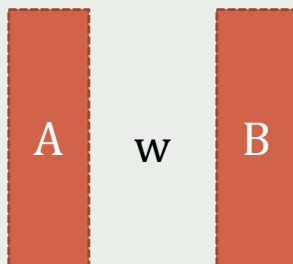


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  - Note: This instruction represents a *set of instructions*:
    - ✦  $(\{\epsilon\} \cup \Sigma, (), \Sigma \cup \{\$\})$ , where  $\Sigma = \{(\, )\}$  and
    - ✦  $(A, w, B) = \{(a, w, b) \mid a \in A, b \in B\}$ .

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    - ✦  $(A, w, B) = \{(a, w, b) \mid a \in A, b \in B\}$ .
  - Note: We use the following notation for the  $(A, w, B)$ :



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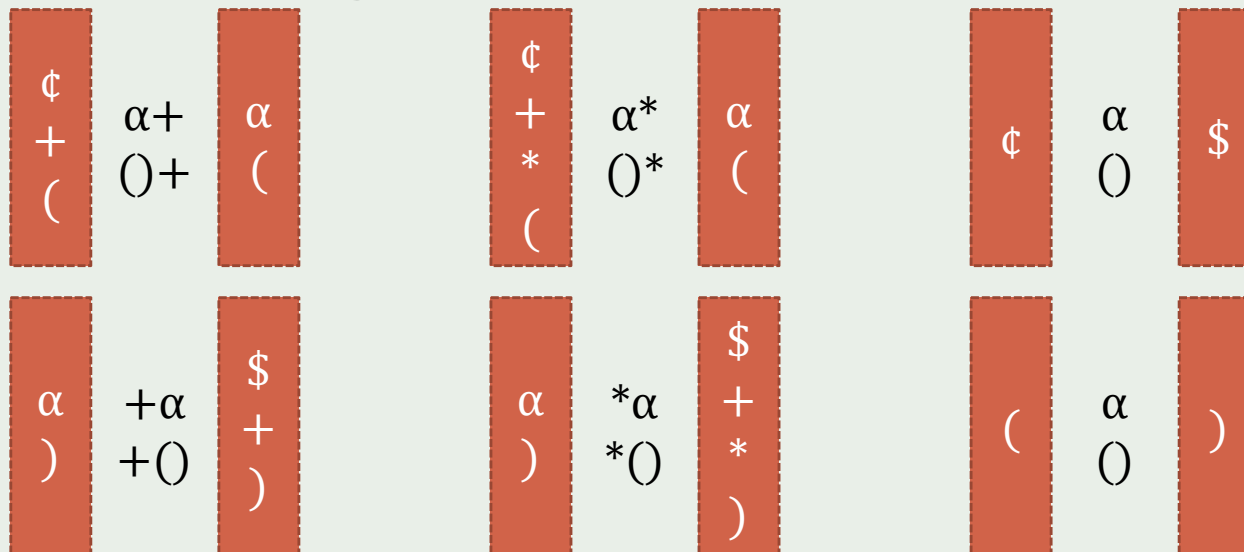


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- The priority of the operations is considered.
- The following *1-cl-RA*-automaton is sufficient:



# Arithmetic Expressions - Example



Expression	Instruction
$\underline{\alpha}^*\alpha + ((\alpha + \alpha) + (\alpha + \alpha^*\alpha))^*\alpha$	( $\$, \alpha^*, \alpha$ )
$\alpha + ((\underline{\alpha + \alpha}) + (\alpha + \alpha^*\alpha))^*\alpha$	( $\alpha, +\alpha, )$ )
$\alpha + ((\alpha) + (\alpha + \alpha^*\alpha))^*\underline{\alpha}$	( $) , * \alpha, \$$ )
$\alpha + ((\alpha) + (\alpha + \underline{\alpha^*}\alpha))$	( $+, \alpha^*, \alpha$ )
$\alpha + ((\alpha) + (\underline{\alpha + \alpha}))$	( $(, \alpha+, \alpha$ )
$\alpha + ((\underline{\alpha}) + (\alpha))$	( $(, \alpha, )$ )
$\alpha + ((\underline{()}) + (\alpha))$	( $(, ()+, ()$ )
$\alpha + ((\underline{()})$	( $(, \alpha, )$ )
$\alpha + ((\underline{()})$	( $(, (), )$ )
$\underline{\alpha + }()$	( $\$, \alpha+, ()$ )
$\underline{()}$	( $\$, (), \$$ )
$\lambda$	accept

# Nondeterminism



- Assume the following instructions:
    - $R1 = (bb, \underline{a}, bbbb)$
    - $R2 = (bb, \underline{bb}, \$)$
    - $R3 = (\text{¢}, \underline{cbb}, \$)$
- and the word: *cbbabbbb*.

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- $R2 = (bb, \underline{bb}, \$)$

- $R3 = (\text{\textcircled{c}}, \underline{cbb}, \$)$

and the word:  $cbbabbbb$ . Then:

- $c\underline{bb}a\underline{bb}bb \vdash^{R1} cbb\underline{bb}bb \vdash^{R2} c\underline{bb}bb \vdash^{R2} \underline{cbb} \vdash^{R3} \lambda.$

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and the word:  $cbbabbbb$ . Then:

- $cbb\underline{a}bbbb \vdash^{R1} cbb\underline{bb}bb \vdash^{R2} cbb\underline{bb} \vdash^{R2} \underline{cbb} \vdash^{R3} \lambda$ .

- **But** if we have started with  $R2$ :

- $cbb\underline{abb}bb \vdash^{R2} cbbabb$

**then** it would not be possible to continue.

# Nondeterminism



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- $R3 = (\$, \underline{cbb}, \$)$

and the word:  $cbbabbbb$ . Then:

- $cbb\underline{a}bbbb \vdash^{R1} cbb\underline{bb}bb \vdash^{R2} cbb\underline{bb} \vdash^{R2} \underline{cbb} \vdash^{R3} \lambda$ .

- **But** if we have started with  $R2$ :

- $cbb\underline{abb}bb \vdash^{R2} cbbabb$

**then** it would not be possible to continue.

- $\Rightarrow$  The order of used instructions is important!



# Greibach's Hardest CFL



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# Greibach's Hardest CFL



- As we have seen **not all context-free languages** are **recognized** by a *cl-RA*-automaton.
- We still can characterize **CFL** using **clearing restarting automata**, **inverse homomorphism** and **Greibach's hardest context-free language**.

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  - Any context-free language can be parsed in whatever time or space it takes to recognize  $H$ .
  - Any context-free language  $L$  can be obtained from  $H$  by an inverse homomorphism. That is, for each context-free language  $L$ , there exists a homomorphism  $\varphi: L = \varphi^{-1}(H)$ .

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- Then  $H = \{\lambda\} \cup \{\prod_{i=1..n} x_i c y_i c z_i d \mid n \geq 1, y_1 y_2 \dots y_n \in \#D_2, x_i, z_i \in \Sigma^*\}$ ,
  - $y_1 \in \#. \{a_1, a_2, \underline{a}_1, \underline{a}_2\}^*$ ,
  - $y_i \in \{a_1, a_2, \underline{a}_1, \underline{a}_2\}^*$  for all  $i > 1$ .

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(in *Associative language descriptions, Theoretical Computer Science, 270 (2002), 463-491*)
- So we will slightly extend the definition of  $cl$ - $RA$ -automata in order to be able to recognize more languages including  $H$ .

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  - where  $x \in LC_k$ ,  $y \in RC_k$ ,  $z \in \Gamma^+$ .
    - ✦ left context  $LC_k = \Gamma^k \cup \phi$ ,  $\Gamma^{\leq k-1}$
    - ✦ right context  $RC_k = \Gamma^k \cup \Gamma^{\leq k-1}.\$$

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- The  $k$ - $\Delta cl$ -RA-automaton  $M$  *recognizes* the language  $L(M) = \{w \in \Sigma^* \mid M \text{ accepts } w\}$ .

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- $\mathcal{L}(\Delta cl\text{-}RA) = \bigcup_{k \geq 1} \mathcal{L}(k\text{-}\Delta cl\text{-}RA)$ .
- **Note:** For every  $\Delta cl\text{-}RA M: \lambda \vdash_M^* \lambda$  hence  $\lambda \in L(M)$ . If we say that  $\Delta cl\text{-}RA M$  recognizes a language  $L$ , we mean that  $L(M) = L \cup \{\lambda\}$ .

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- For instance:
  - $aaacbbb \vdash^{Rc1} aa\Delta bb \vdash^{R\Delta1} \underline{a\Delta b} \vdash^{R\Delta2} \lambda$ .
- Now we see that the word  $aaacbbb$  is **accepted** because  $aaacbbb \vdash_M^* \lambda$ .

## Back to Greibach's Hardest CFL



- Theorem: Greibach's Hardest CFL  $H$  is recognized by a  $1-\Delta cl$ -RA-automaton.

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  - In the *first phase* we start with deleting letters ( from the alphabet  $\Sigma = \{a_1, a_2, \underline{a}_1, \underline{a}_2, \#, c\}$  ) from the right side of  $\#$  and from the left and right sides of the letters  $d$ .

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 $\# \Delta y_1 \Delta y_2 \Delta \dots \Delta y_n \Delta \$$
  - In the *second phase* we check if  $y_1 y_2 \dots y_n \in \# D_2$ .

# Instructions recognizing Hardest CFL H



- Suppose  $\Sigma = \{a_1, a_2, \underline{a}_1, \underline{a}_2, \#, c\}$ ,  $d \notin \Sigma$ ,  $\Gamma = \Sigma \cup \{d, \Delta\}$ .

## Instructions for the first phase:

- (1)  $(\epsilon, \Sigma \rightarrow \lambda, \Sigma)$
- (2)  $(\Sigma, \Sigma \rightarrow \lambda, d)$
- (3)  $(d, \Sigma \rightarrow \lambda, \Sigma)$
- (4)  $(\epsilon, c \rightarrow \Delta, \Sigma \cup \{\Delta\})$
- (5)  $(\Sigma \cup \{\Delta\}, cdc \rightarrow \Delta, \Sigma \cup \{\Delta\})$
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- In fact, there is no such thing as a *first phase* or a *second phase*. We have only instructions.
- Theorem:  $H \subseteq L(M)$ ,  $H \supseteq L(M)$ .

# Learning Clearing Restarting Automata



- Let  $u_i \vdash_M v_i, i = 1, 2 \dots, n$  be a list of **known reductions**.

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Step 2: For each reduction  $u_i \vdash_M v_i$  choose (nondeterministically) a factorization of  $u_i$ , such that  $u_i = x_i z_i y_i$  and  $v_i = x_i y_i$ .



# Learning Clearing Restarting Automata



Step 3: Construct a *k-cl-RA*-automaton  $M = (\Sigma, I)$ ,  
where  $I = \{ (Suff_k(\phi.x_j), z_j, Pref_k(y_j.\$)) \mid j = 1, \dots, n \}$ .

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Step 5: If the automaton *passed* all the tests, *return*  $M$ . Otherwise try another factorization of the known reductions and continue by Step 3 or increase  $k$  and continue by Step 2.

# Learning Clearing Restarting Automata



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# Learning Clearing Restarting Automata



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- Although  $\Delta$ -clearing restarting automata are stronger than **clearing restarting automata**, we will see that even **clearing restarting automata** can recognize some *non-context-free languages*.
- However, it can be shown, that:
- Theorem:  $\mathcal{L}(\Delta cl-RA) \subseteq CSL$ , where **CSL** denotes the class of *context-sensitive languages*.

# Learning Non-Context-Free Language



- Theorem: There exists a *k-cl-RA*-automaton  $M$  recognizing a language that is **not context-free**.



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  - If  $L(M)$  is a CFL then the intersection with a regular language is also a CFL. In our case the intersection is not a CFL.

# Learning Non-Context-Free Language



- Example:

*¢ abababababababab \$*

# Learning Non-Context-Free Language



- Example:

$\$ ababababababab\underline{a}b \$ \vdash_M \$ abababababab\underline{a}bb \$ \vdash_M$

$\$ ababab\underline{a}bbabb \$ \vdash_M \$ ab\underline{a}bbabbabb \$ \vdash_M$

$\$ abbabbabb \$$

# Learning Non-Context-Free Language



- Example:

$\$ \vdash_M \text{ abababababababab} \$ \vdash_M \text{ abababababababb} \$ \vdash_M$

$\$ \vdash_M \text{ ababababbabb} \$ \vdash_M \text{ ababbabbabb} \$ \vdash_M$

$\$ \vdash_M \text{ abbabbabb} \$ \vdash_M \text{ abbabbab} \$ \vdash_M$

$\$ \vdash_M \text{ abbababab} \$ \vdash_M \text{ abbababab} \$ \vdash_M$

$\$ \vdash_M \text{ abababab} \$$

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- From this sample computation we can collect **15 reductions** with unambiguous factorizations and use them as an input to our algorithm.

# Learning Non-Context-Free Language



- The only variable we have to choose is  $k$  - the length of the context of the instructions.

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- For  $k = 1$  we get the following set of instructions:  
 $(b, \underline{a}, b), (a, \underline{b}, b), (\$, \underline{ab}, \$)$

# Learning Non-Context-Free Language



- The only variable we have to choose is  $k$  - the length of the context of the instructions.
- For  $k = 1$  we get the following set of instructions:

$(b, \underline{a}, b), (a, \underline{b}, b), (\$, \underline{ab}, \$)$

But then the automaton would accept the word ***ababab*** which **does not belong to  $L$** :

$abab\underline{a}b \vdash_M ab\underline{a}bb \vdash_M ab\underline{b}bb \vdash_M ab\underline{b}b \vdash_M ab\underline{b} \vdash_M \lambda.$

# Learning Non-Context-Free Language



- For  $k = 2$  we get the following set of instructions:  
 $(ab, \underline{a}, \{b\$, ba\}), (\{\$a, ba\}, \underline{b}, \{b\$, ba\}), (\$, \underline{ab}, \$)$

# Learning Non-Context-Free Language



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# Learning Non-Context-Free Language



- For  $k = 2$  we get the following set of instructions:

$(ab, \underline{a}, \{b\$, ba\}), (\{\emptyset a, ba\}, \underline{b}, \{b\$, ba\}), (\emptyset, \underline{ab}, \$)$

But then the automaton would accept the word ***ababab*** which **does not belong to  $L$** :

$abab\underline{a}b \vdash_M abab\underline{b}b \vdash_M ab\underline{a}b \vdash_M ab\underline{b}b \vdash_M ab \vdash_M \lambda.$

- For  $k = 3$  we get the following set of instructions:

$(\{\emptyset ab, bab\}, \underline{a}, \{b\$, bab\}), (\{\emptyset a, bba\}, \underline{b}, \{b\$, bab\}), (\emptyset, \underline{ab}, \$)$

# Learning Non-Context-Free Language



- For  $k = 2$  we get the following set of instructions:

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But then the automaton would accept the word ***ababab*** which **does not belong to  $L$** :

$abab\underline{a}b \vdash_M abab\underline{b}b \vdash_M ab\underline{a}b \vdash_M ab\underline{b}b \vdash_M ab \vdash_M \lambda.$

- For  $k = 3$  we get the following set of instructions:

$(\{\$, ab, bab\}, \underline{a}, \{b\$, bab\}), (\{\$, a, bba\}, \underline{b}, \{b\$, bab\}), (\$, \underline{ab}, \$)$

And again we get:

$ab\underline{a}bab \vdash_M abab\underline{b}b \vdash_M ab\underline{a}b \vdash_M ab\underline{b}b \vdash_M ab \vdash_M \lambda.$



# Learning Non-Context-Free Language



- Finally, for  $k = 4$  we get the required *4-cl-RA-automaton*  $M$ .

¢ab  
abab

a

b\$  
babb

¢a  
abba

b

b\$  
bab\$  
baba

¢

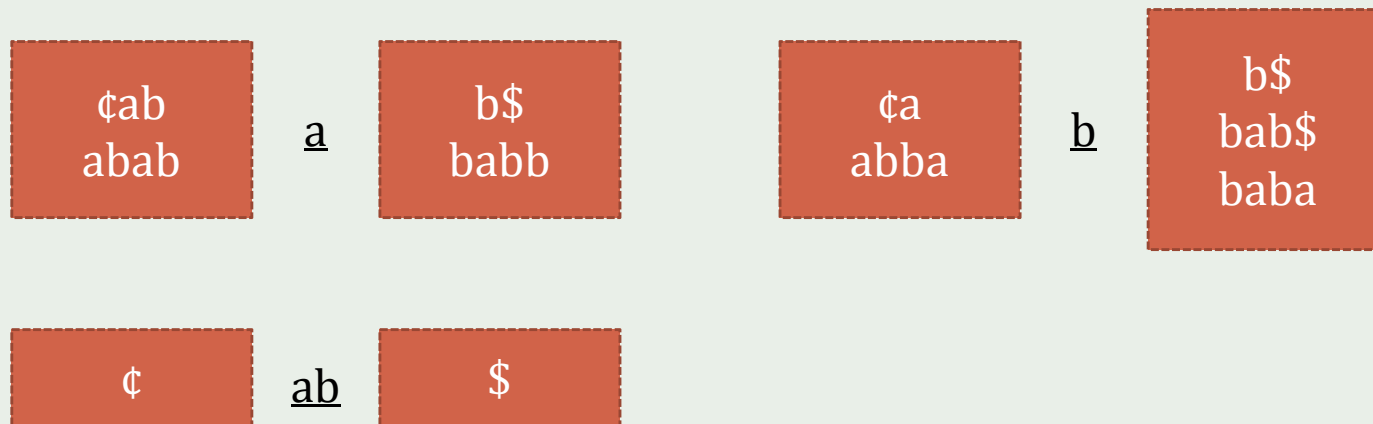
ab

\$

# Learning Non-Context-Free Language



- Finally, for  $k = 4$  we get the required *4-cl-RA-automaton*  $M$ .



- For this *4-cl-RA-automaton*  $M$  it can be shown, that:  
 $L(M) \cap \{(ab)^n \mid n > 0\} = \{(ab)^{2^m} \mid m \geq 0\}$ .

# Conclusion



- We have seen that knowing some **sample computations** (or even **reductions**) of a *cl-RA*-automaton (or  $\Delta cl-RA$ -automaton) it is extremely simple to **infer its instructions**.

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- The **instructions** of a  $\Delta cl-RA$ -automaton are **human readable** which is an advantage for their possible applications e.g. in **linguistics**.

# Conclusion



- We have seen that knowing some **sample computations** (or even **reductions**) of a *cl-RA*-automaton (or  $\Delta cl-RA$ -automaton) it is extremely simple to **infer its instructions**.
- The **instructions** of a  $\Delta cl-RA$ -automaton are **human readable** which is an advantage for their possible applications e.g. in **linguistics**.
- **Unfortunately**, we still do not know whether  $\Delta cl-RA$ -automata can recognize all **context-free languages**.

# Conclusion



- If we generalize  $\Delta$ cl-RA-automata by enabling them to use any number of auxiliary symbols:  $\Delta_1, \Delta_2, \dots, \Delta_n$  instead of single  $\Delta$ , we will increase their power up-to context sensitive languages.

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- If we generalize  $\Delta$ cl-RA-automata by enabling them to use any number of auxiliary symbols:  $\Delta_1, \Delta_2, \dots, \Delta_n$  instead of single  $\Delta$ , we will increase their power up-to context sensitive languages.
  - Such automata can easily accept all languages generated by context-sensitive grammars with productions in *one-sided normal form*:  $A \rightarrow a, A \rightarrow BC, AB \rightarrow AC$  where  $A, B, C$  are nonterminals and  $a$  is a terminal.

# Conclusion



- If we generalize  $\Delta$ cl-RA-automata by enabling them to use any number of auxiliary symbols:  $\Delta_1, \Delta_2, \dots, \Delta_n$  instead of single  $\Delta$ , we will increase their power up-to **context sensitive languages**.
  - Such automata can easily accept all languages generated by context-sensitive grammars with productions in **one-sided normal form**:  $A \rightarrow a, A \rightarrow BC, AB \rightarrow AC$  where  $A, B, C$  are nonterminals and  $a$  is a terminal.
  - Penttonen showed that for every **context-sensitive grammar** there exists an **equivalent grammar** in **one-sided normal form**.



# Open Problems



- What is the **difference** between language classes of  $\mathcal{L}(k-cl-RA)$  and  $\mathcal{L}(k-\Delta cl-RA)$  for different values of  $k$ ?

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# Open Problems



- What is the **difference** between language classes of  $\mathcal{L}(k-cl-RA)$  and  $\mathcal{L}(k-\Delta cl-RA)$  for different values of  $k$ ?
- Can  $\Delta cl-RA$ -automata recognize all string languages defined by **ALD's**?
- What is the relation between  $\mathcal{L}(\Delta cl-RA)$  and the class of **one counter languages**, **simple context-sensitive grammars** (they have single nonterminal), etc?

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