

Coarse-to-fine recognition for weighted tree-stack automata

Max Korn

27. Oktober 2017

Motivation

- ▶ Problem: Parsing with complicated grammars and recognition with complicated automata are time intensive

Motivation

- ▶ Problem: Parsing with complicated grammars and recognition with complicated automata are time intensive

- ▶ Example: multiple-context-free grammars and tree-stack automata with restricted fanout k have a complexity of $\mathcal{O}(n^{3k})$

Motivation

- ▶ Problem: Parsing with complicated grammars and recognition with complicated automata are time intensive

- ▶ Example: multiple-context-free grammars and tree-stack automata with restricted fanout k have a complexity of $\mathcal{O}(n^{3k})$

- ▶ Solution: use less complex grammar/ automaton

Outline

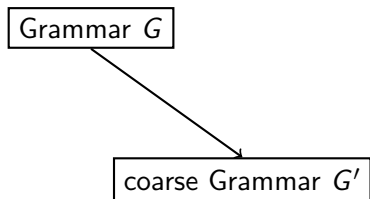
Outline

Grammar Based Coarse-to-Fine Parsing

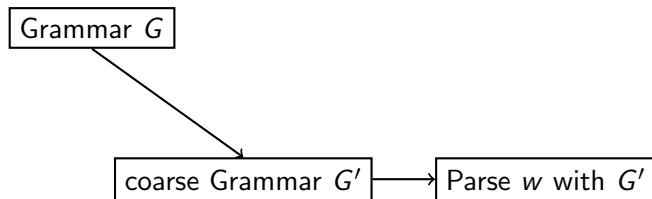
Grammar Based Coarse-to-Fine Parsing

Grammar G

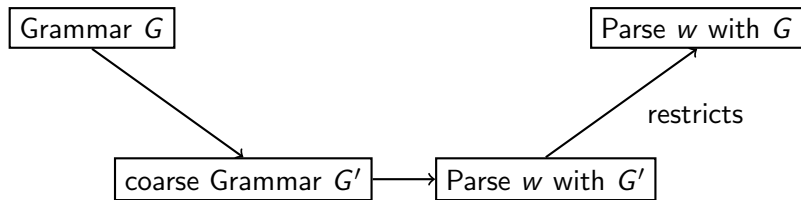
Grammar Based Coarse-to-Fine Parsing



Grammar Based Coarse-to-Fine Parsing



Grammar Based Coarse-to-Fine Parsing



Data-Storage

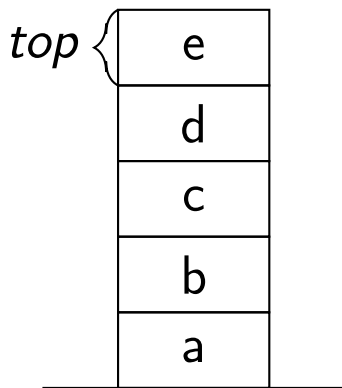
A tuple $S = (C, P, R, c_i)$ with

Data-Storage

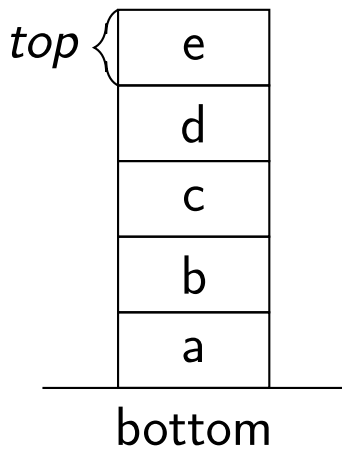
A tuple $S = (C, P, R, c_i)$ with

- ▶ set C (of configurations)
- ▶ set P (of predicates) with $P \subseteq P(C)$
- ▶ set R (of instructions) with $R \subseteq P(C \times C)$
- ▶ initial configuration $c_i \in C$

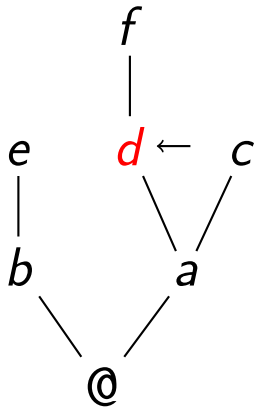
Push-Down



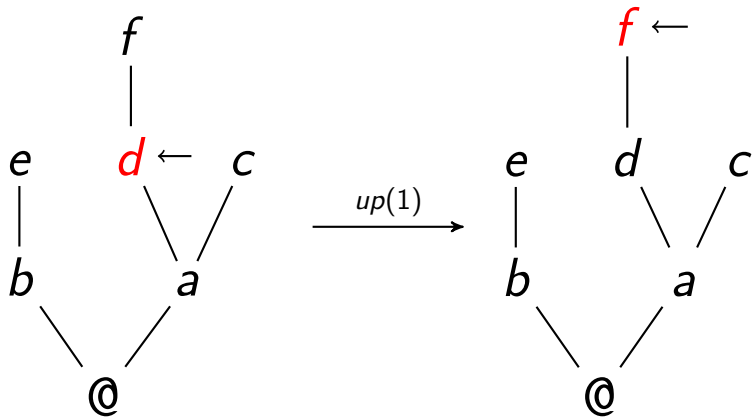
Push-Down



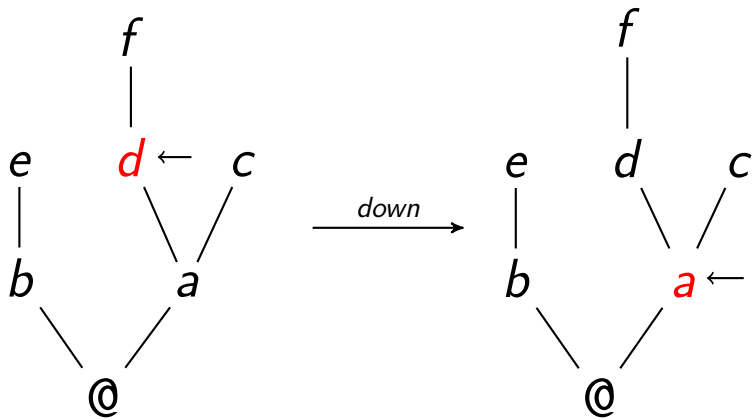
Tree-Stack



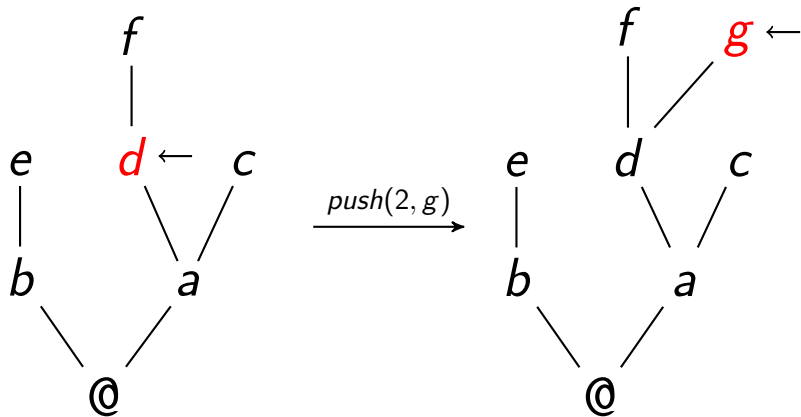
Tree-Stack



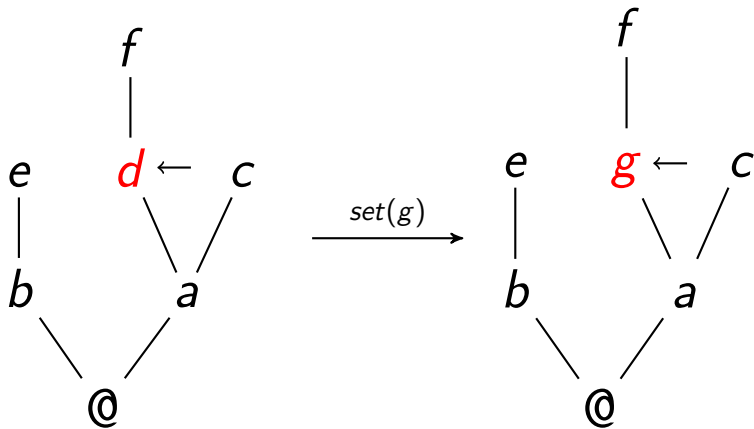
Tree-Stack



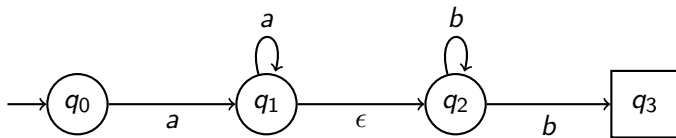
Tree-Stack



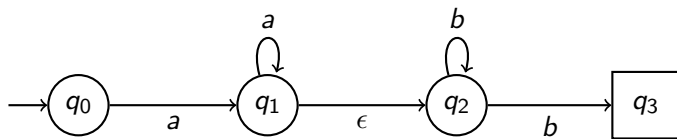
Tree-Stack



Automata

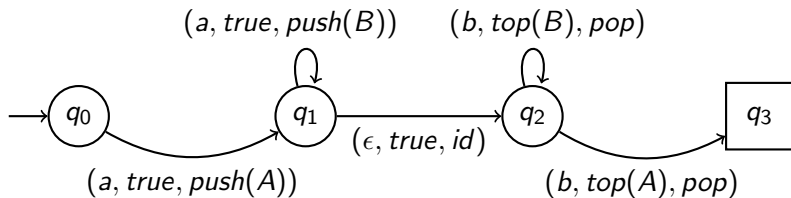


Automata

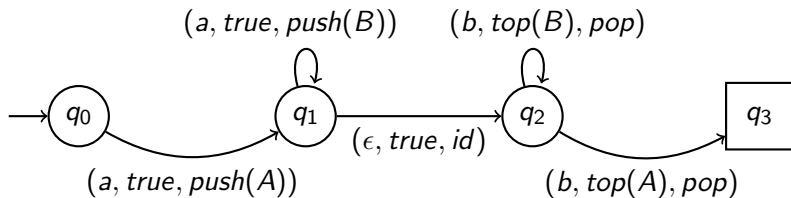


$$L(\mathcal{M}) = \{a^n b^m \mid n, m \geq 1\}$$

Automata with Storage

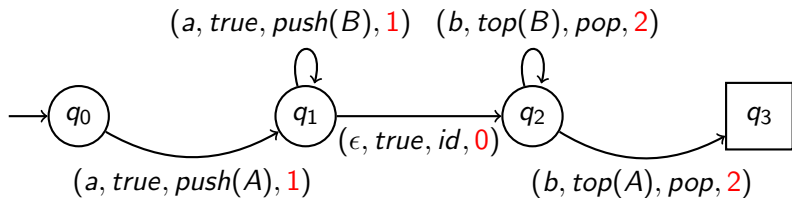


Automata with Storage



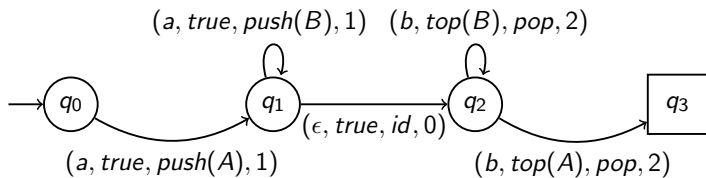
$$L(\mathcal{M}_S) = \{a^n b^n \mid n \geq 1\}$$

Automata with Storage

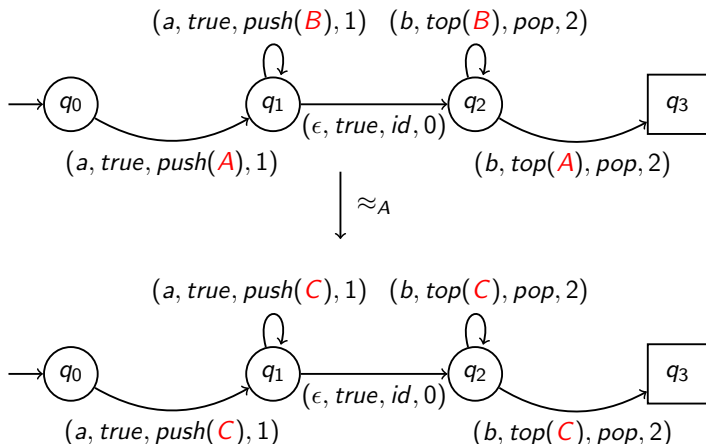


$$L(\mathcal{M}_S) = \{a^n b^n \mid n \geq 1\}$$

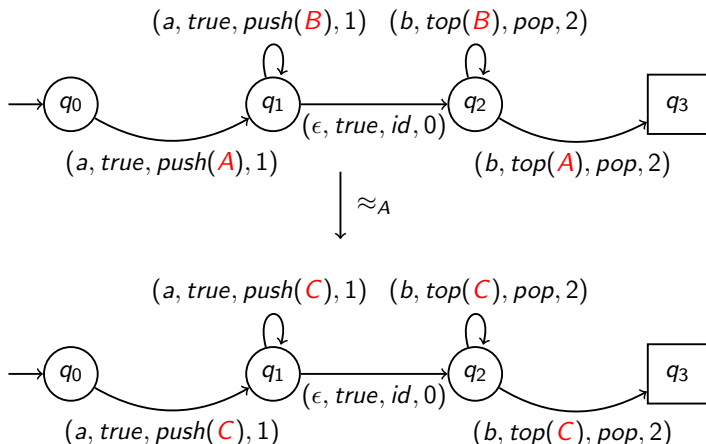
Approximation



Approximation



Approximation



$$L(\mathcal{M}_{\approx_A}) = \{a^n b^m \mid n \geq m \geq 1\}$$

Outline

We use three strategies to approximate the initial automaton:

We use three strategies to approximate the initial automaton:

- ▶ Ignoring tree-structures inspired by Burden and Ljunglöf [1] and Cranenburgh [3] (*TTS*)

We use three strategies to approximate the initial automaton:

- ▶ Ignoring tree-structures inspired by Burden and Ljunglöf [1] and Cranenburgh [3] (*TTS*)
- ▶ Relabelling to equivalence classes of stack symbols by Charniak et al. [2] (*RLB*)

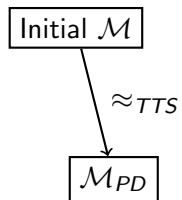
We use three strategies to approximate the initial automaton:

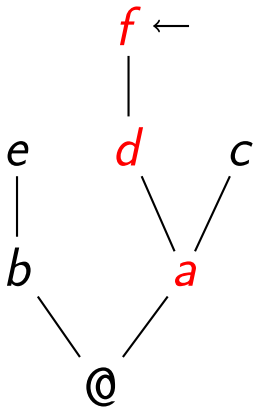
- ▶ Ignoring tree-structures inspired by Burden and Ljunglöf [1] and Cranenburgh [3] (*TTS*)
- ▶ Relabelling to equivalence classes of stack symbols by Charniak et al. [2] (*RLB*)
- ▶ Reducing the amount of push-down configurations to a finite number by Nederhof [5] (*PTK*)

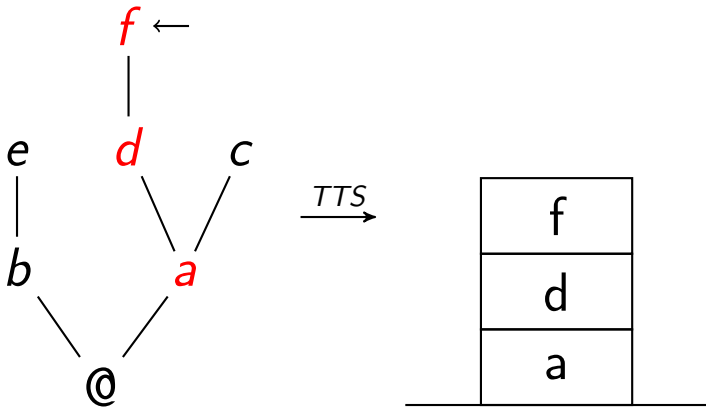
Ignore Tree-Structure

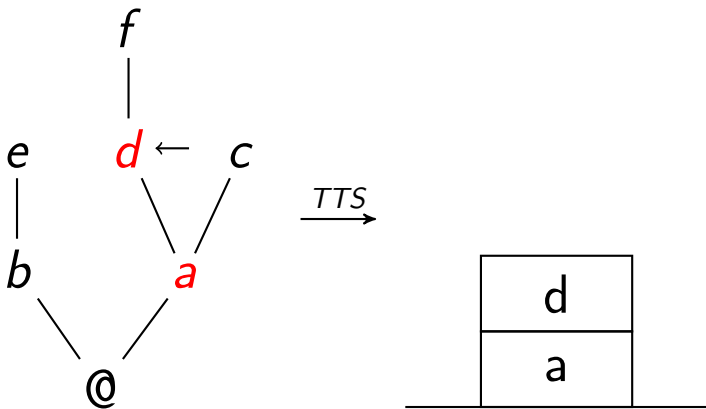
Initial \mathcal{M}

Ignore Tree-Structure

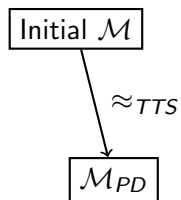




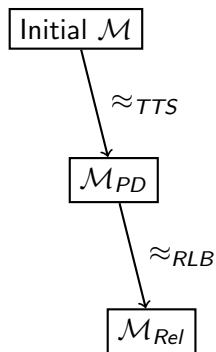


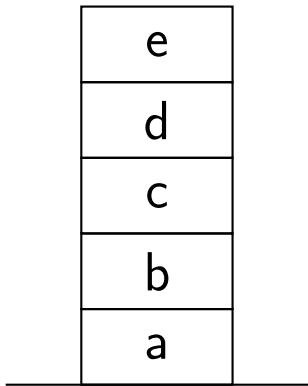


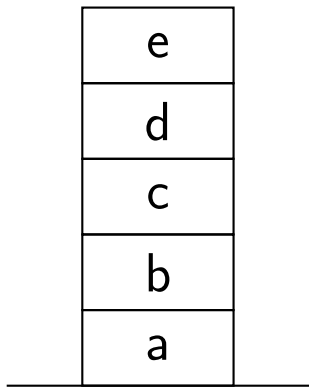
Equivalence-Classes of Stack symbols



Equivalence-Classes of Stack symbols

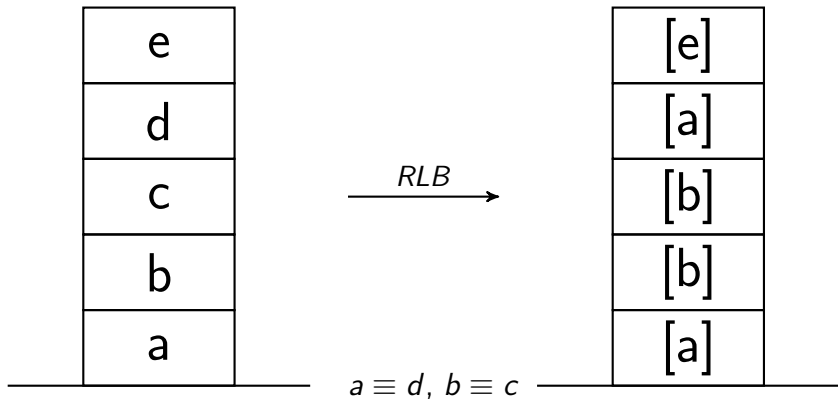




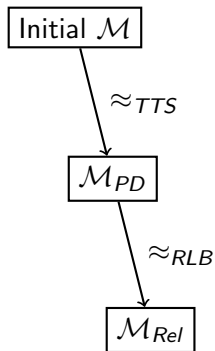


$RLB \rightarrow$

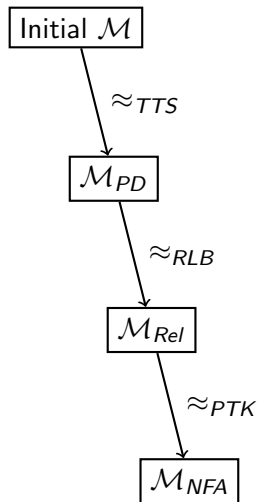
$a \equiv d, b \equiv c$

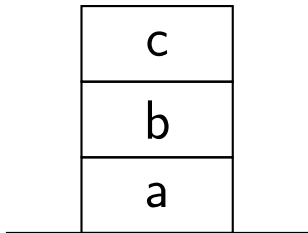


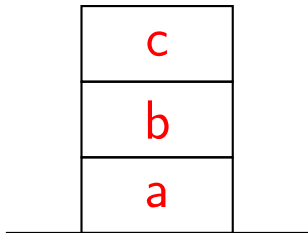
Limit Push-Down Height

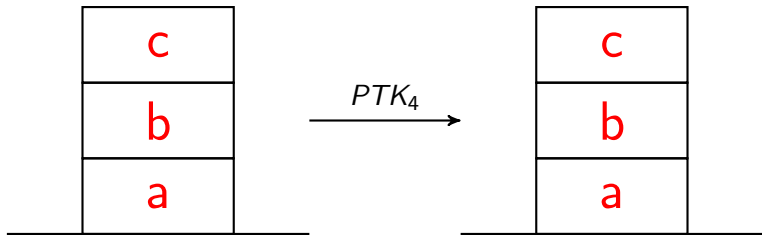


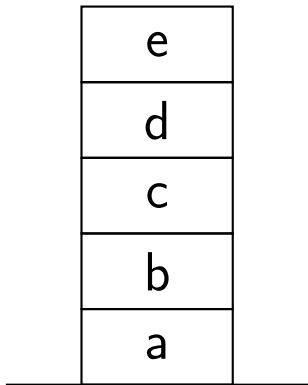
Limit Push-Down Height

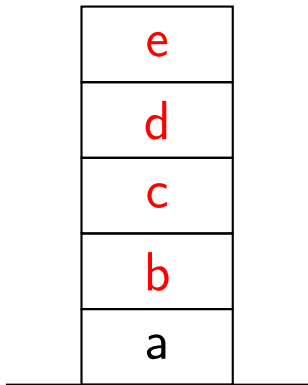


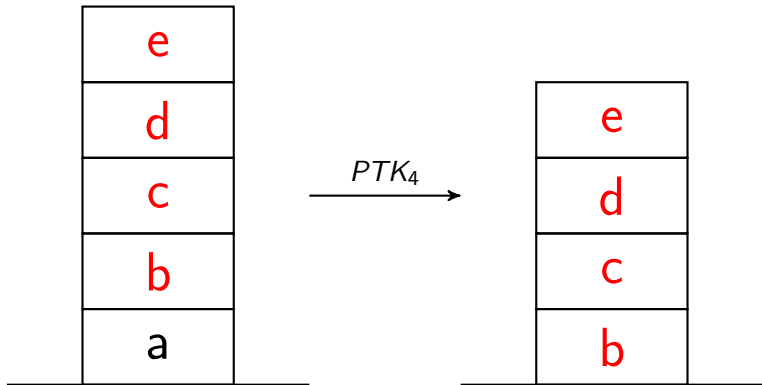






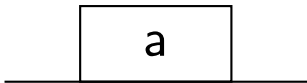






Special Case

pushdown

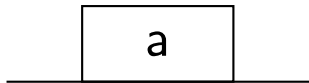


$PTK_4(\text{pushdown})$

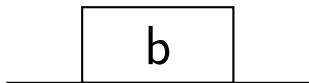


Special Case

pushdown



$top(a), set(b)$

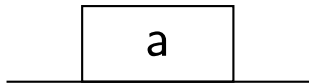


$PTK_4(\text{pushdown})$



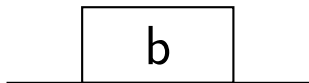
Special Case

pushdown

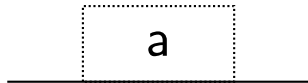


$top(a), set(b)$

A vertical arrow pointing downwards, indicating the transition from the initial state to the final state.

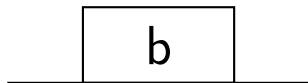


$PTK_4(\text{pushdown})$



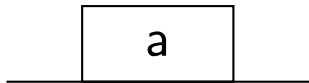
$PTK_4(top(a), set(b))$

A vertical arrow pointing downwards, indicating the transition from the initial state to the final state.



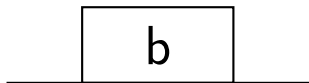
Special Case

pushdown

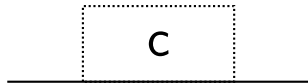


$top(a), set(b)$

A vertical arrow pointing downwards from the text above to the diagram below.

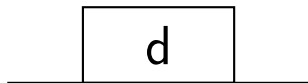


$PTK_4(\text{pushdown})$

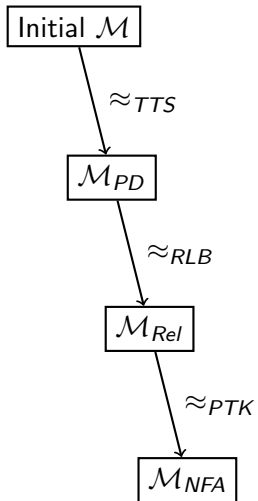


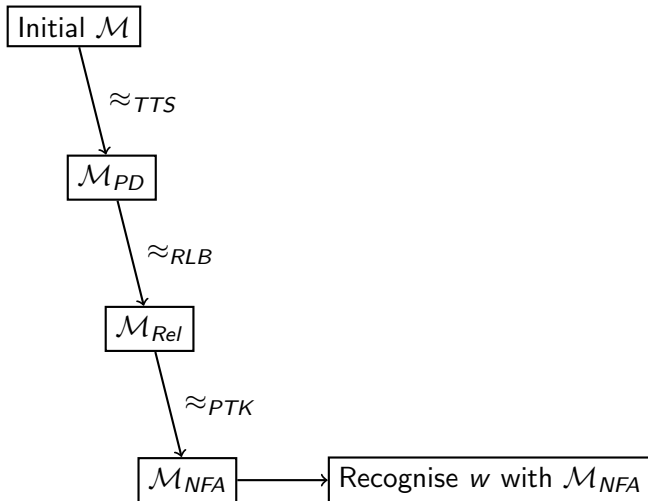
$PTK_4(top(c), set(d))$

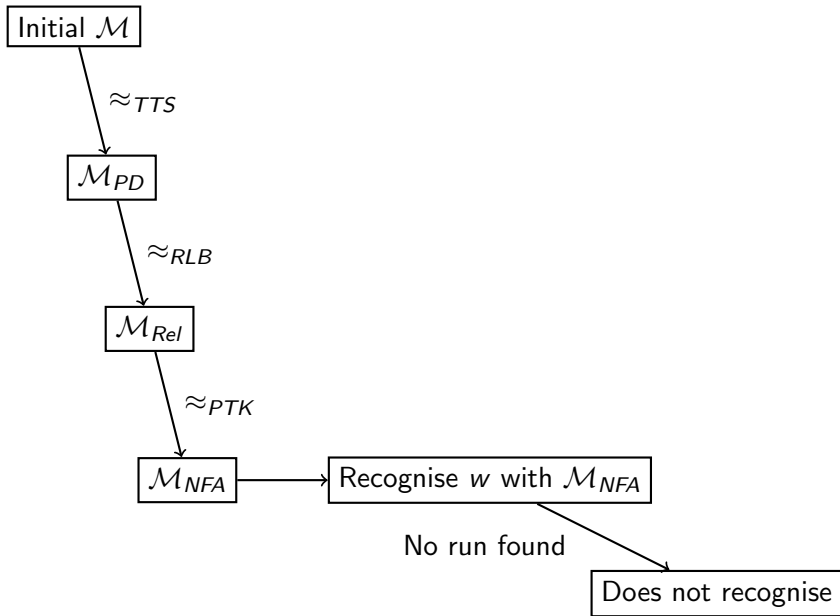
A vertical arrow pointing downwards from the text above to the diagram below.



Outline







Algorithm by Denkinger [4]

Input: proper total approximation strategy A ,
(S, Σ, K)-Automaton \mathcal{M} , $n \in \mathbb{N}$, word $w \in \Sigma^*$ and part. order
 $(\leq) \subseteq K \times K$

Output: some set of n -best runs of \mathcal{M} on w

Algorithm by Denkinger [4]

Input: proper total approximation strategy A ,
(S, Σ, K)-Automaton \mathcal{M} , $n \in \mathbb{N}$, word $w \in \Sigma^*$ and part. order
 $(\leq) \subseteq K \times K$

Output: some set of n -best runs of \mathcal{M} on w

1: $\mathcal{M}' \leftarrow \approx_A(\mathcal{M})$

2: $P_f \leftarrow \emptyset$

3: $P_c \leftarrow R_{\mathcal{M}'}(w)$

9: **return** P_f

Algorithm by Denkinger [4]

Input: proper total approximation strategy A ,
(S, Σ, K)-Automaton \mathcal{M} , $n \in \mathbb{N}$, word $w \in \Sigma^*$ and part. order
 $(\leq) \subseteq K \times K$

Output: some set of n -best runs of \mathcal{M} on w

1: $\mathcal{M}' \leftarrow \approx_A(\mathcal{M})$

2: $P_f \leftarrow \emptyset$

3: $P_c \leftarrow R_{\mathcal{M}'}(w)$

4: **while**

do

5: $\theta \leftarrow$ smallest element of P_c

6: $P_c \leftarrow P_c \setminus \{\theta\}$

9: **return** P_f

Algorithm by Denkinger [4]

Input: proper total approximation strategy A ,
(S, Σ, K)-Automaton \mathcal{M} , $n \in \mathbb{N}$, word $w \in \Sigma^*$ and part. order
 $(\leq) \subseteq K \times K$

Output: some set of n -best runs of \mathcal{M} on w

1: $\mathcal{M}' \leftarrow \approx_A(\mathcal{M})$

2: $P_f \leftarrow \emptyset$

3: $P_c \leftarrow R_{\mathcal{M}'}(w)$

4: **while**

do

5: $\theta \leftarrow$ smallest element of P_c

6: $P_c \leftarrow P_c \setminus \{\theta\}$

7: **for** $\theta' \in \approx_A^{-1}(\theta)$ **do**

8: **if** $\theta' \in R_{\mathcal{M}}$ **then** $P_f \leftarrow P_f \cup \{\theta'\}$

9: **return** P_f

Algorithm by Denkinger [4]

Input: proper total approximation strategy A ,
(S, Σ, K)-Automaton \mathcal{M} , $n \in \mathbb{N}$, word $w \in \Sigma^*$ and part. order
 $(\leq) \subseteq K \times K$

Output: some set of n -best runs of \mathcal{M} on w

1: $\mathcal{M}' \leftarrow \approx_A(\mathcal{M})$

2: $P_f \leftarrow \emptyset$

3: $P_c \leftarrow R_{\mathcal{M}'}(w)$

4: **while** $|P_f| < n$ or $\max_{\theta \in P_f} \text{wt}(\theta) > \min_{\theta' \in P_c} \text{wt}(\approx_A^{-1}(\theta'))$ **do**

5: $\theta \leftarrow$ smallest element of P_c

6: $P_c \leftarrow P_c \setminus \{\theta\}$

7: **for** $\theta' \in \approx_A^{-1}(\theta)$ **do**

8: **if** $\theta' \in R_{\mathcal{M}}$ **then** $P_f \leftarrow P_f \cup \{\theta'\}$

9: **return** P_f

Algorithm for multiple layers

$$\mathcal{M} \xrightarrow{\approx_{A_1}} \mathcal{M}_1 \xrightarrow{\approx_{A_2}} \mathcal{M}_2 \xrightarrow{\approx_{A_3}} \dots \xrightarrow{\approx_{A_m}} \mathcal{M}_m$$

Algorithm for multiple layers

$$\mathcal{M} \xrightarrow{\approx_{A_1}} \mathcal{M}_1 \xrightarrow{\approx_{A_2}} \mathcal{M}_2 \xrightarrow{\approx_{A_3}} \dots \xrightarrow{\approx_{A_m}} \mathcal{M}_m$$

Input: (S, Σ, K) -Automaton \mathcal{M} , $n \in \mathbb{N}$, word $w \in \Sigma^*$, part. order

$(\leq) \subseteq K \times K$,

proper total approximation strategy A_1 ,

proper total approximation strategy A_2 ,

proper total approximation strategy A_3 ,

\dots ,

proper total approximation strategy A_m ,

Output: some set of n -best runs of \mathcal{M} on w

Algorithm for multiple layers

1: $\mathcal{M}_1 \leftarrow \approx_{A_1} (\mathcal{M})$

2: $\mathcal{M}_2 \leftarrow \approx_{A_2} (\mathcal{M}_1)$

...

3: $\mathcal{M}_m \leftarrow \approx_{A_m} (\mathcal{M}_{m-1})$

4: $P_f \leftarrow \emptyset$

5: $P_m \leftarrow R_{\mathcal{M}_m}(w)$

15: **return** P_f

Algorithm for multiple layers

- 1: $\mathcal{M}_1 \leftarrow \approx_{A_1} (\mathcal{M})$
- 2: $\mathcal{M}_2 \leftarrow \approx_{A_2} (\mathcal{M}_1)$
- ...
- 3: $\mathcal{M}_m \leftarrow \approx_{A_m} (\mathcal{M}_{m-1})$
- 4: $P_f \leftarrow \emptyset$
- 5: $P_m \leftarrow R_{\mathcal{M}_m}(w)$
- 6: **while** $|P_f| < n$ or $\max_{\theta \in P_f} \text{wt}(\theta) > \min_{\theta' \in P_m} \text{wt}(\approx_A^{-1}(\theta'))$ **do**
- 7: $\theta_m \leftarrow$ smallest element of P_m
- 8: $P_m \leftarrow P_m \setminus \{\theta_m\}$

15: **return** P_f

Algorithm for multiple layers

- 1: $\mathcal{M}_1 \leftarrow \approx_{A_1} (\mathcal{M})$
- 2: $\mathcal{M}_2 \leftarrow \approx_{A_2} (\mathcal{M}_1)$
- ...
- 3: $\mathcal{M}_m \leftarrow \approx_{A_m} (\mathcal{M}_{m-1})$
- 4: $P_f \leftarrow \emptyset$
- 5: $P_m \leftarrow R_{\mathcal{M}_m}(w)$
- 6: **while** $|P_f| < n$ or $\max_{\theta \in P_f} wt(\theta) > \min_{\theta' \in P_m} wt(\approx_A^{-1}(\theta'))$ **do**
- 7: $\theta_m \leftarrow$ smallest element of P_m
- 8: $P_m \leftarrow P_m \setminus \{\theta_m\}$
- 9: **for** $\theta_{m-1} \in \approx_{A_m}^{-1}(\theta_m)$ **do**
- 10: **if** $\theta_{m-1} \in R_{\mathcal{M}_{m-1}}$ **then**

- 15: **return** P_f

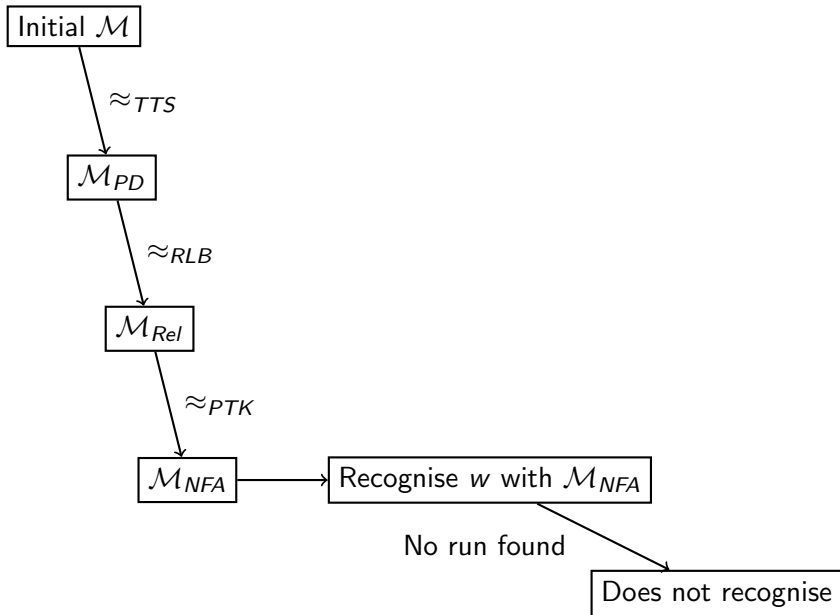
Algorithm for multiple layers

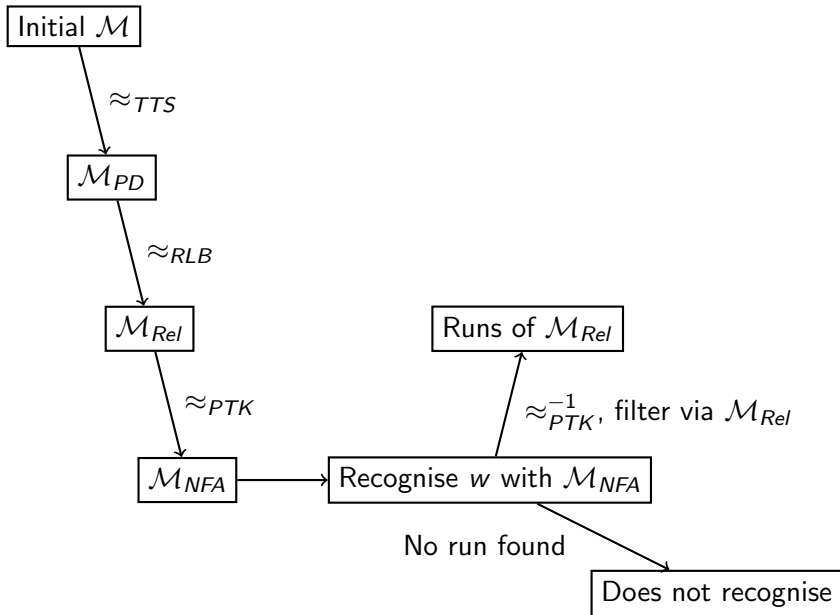
- 1: $\mathcal{M}_1 \leftarrow \approx_{A_1} (\mathcal{M})$
- 2: $\mathcal{M}_2 \leftarrow \approx_{A_2} (\mathcal{M}_1)$
- ...
- 3: $\mathcal{M}_m \leftarrow \approx_{A_m} (\mathcal{M}_{m-1})$
- 4: $P_f \leftarrow \emptyset$
- 5: $P_m \leftarrow R_{\mathcal{M}_m}(w)$
- 6: **while** $|P_f| < n$ or $\max_{\theta \in P_f} wt(\theta) > \min_{\theta' \in P_m} wt(\approx_A^{-1}(\theta'))$ **do**
- 7: $\theta_m \leftarrow$ smallest element of P_m
- 8: $P_m \leftarrow P_m \setminus \{\theta_m\}$
- 9: **for** $\theta_{m-1} \in \approx_{A_m}^{-1}(\theta_m)$ **do**
- 10: **if** $\theta_{m-1} \in R_{\mathcal{M}_{m-1}}$ **then**
- 11: **for** $\theta_{m-2} \in \approx_{A_{m-1}}^{-1}(\theta_{m-1})$ **do**
- 12: **if** $\theta_{m-2} \in R_{\mathcal{M}_{m-2}}$ **then**

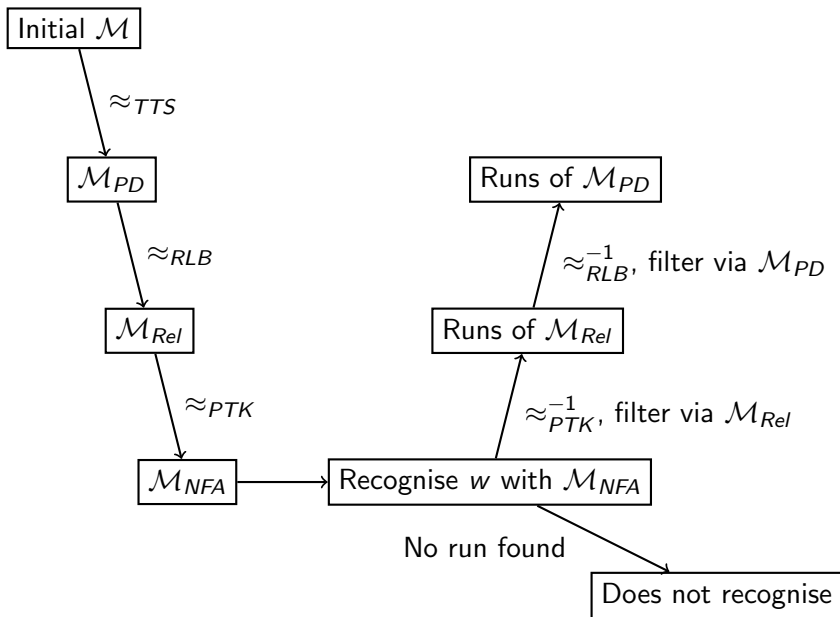
- 15: **return** P_f

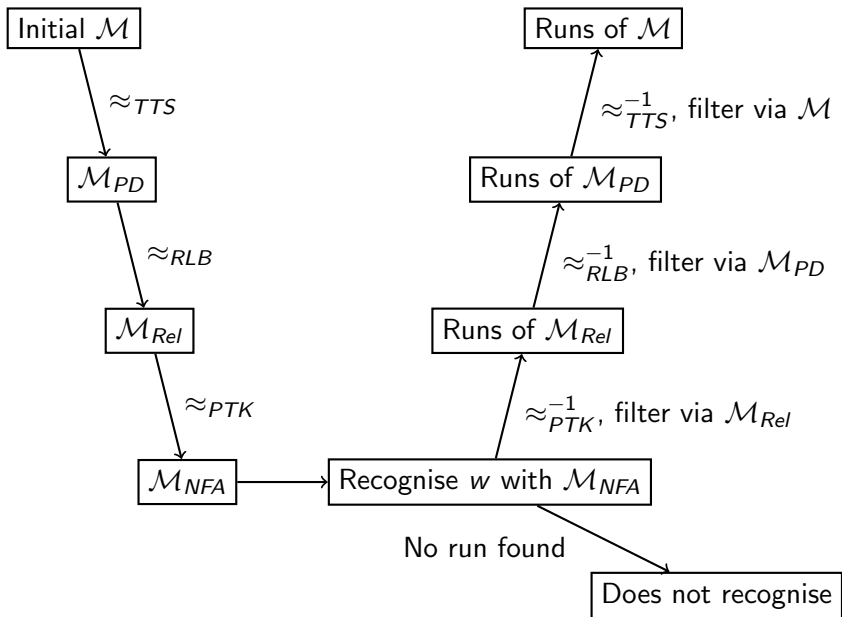
Algorithm for multiple layers

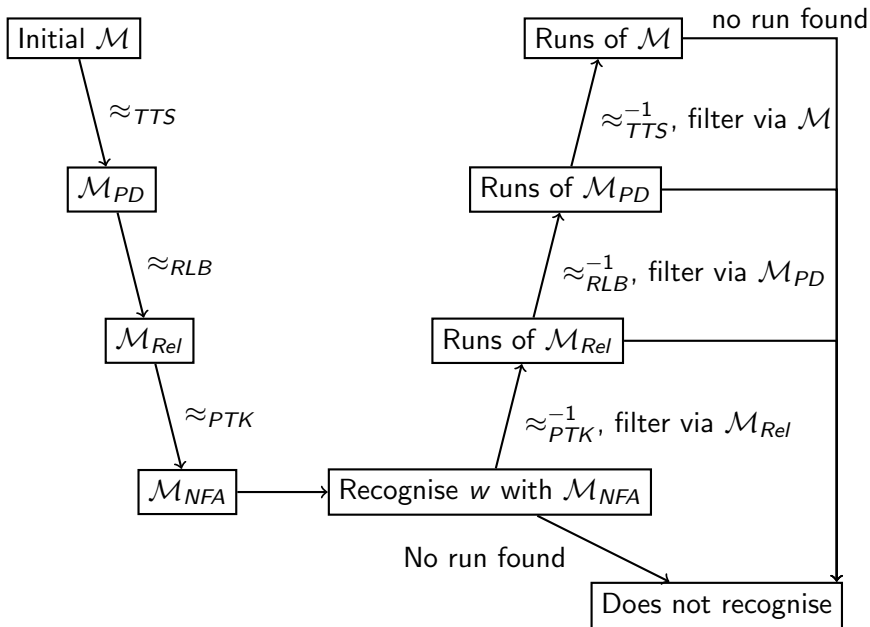
- 1: $\mathcal{M}_1 \leftarrow \approx_{A_1} (\mathcal{M})$
- 2: $\mathcal{M}_2 \leftarrow \approx_{A_2} (\mathcal{M}_1)$
- ...
- 3: $\mathcal{M}_m \leftarrow \approx_{A_m} (\mathcal{M}_{m-1})$
- 4: $P_f \leftarrow \emptyset$
- 5: $P_m \leftarrow R_{\mathcal{M}_m}(w)$
- 6: **while** $|P_f| < n$ or $\max_{\theta \in P_f} wt(\theta) > \min_{\theta' \in P_m} wt(\approx_A^{-1}(\theta'))$ **do**
- 7: $\theta_m \leftarrow$ smallest element of P_m
- 8: $P_m \leftarrow P_m \setminus \{\theta_m\}$
- 9: **for** $\theta_{m-1} \in \approx_{A_m}^{-1}(\theta_m)$ **do**
- 10: **if** $\theta_{m-1} \in R_{\mathcal{M}_{m-1}}$ **then**
- 11: **for** $\theta_{m-2} \in \approx_{A_{m-1}}^{-1}(\theta_{m-1})$ **do**
- 12: **if** $\theta_{m-2} \in R_{\mathcal{M}_{m-2}}$ **then**
- ...
- 13: **for** $\theta_0 \in \approx_{A_1}^{-1}(\theta_1)$ **do**
- 14: **if** $\theta_0 \in R_{\mathcal{M}}$ **then** $P_f \leftarrow P_f \cup \{\theta_0\}$
- 15: **return** P_f











Outline

Implementation¹

¹using *rustomata* <https://github.com/tud-fop/rustomata>

Implementation¹

Preprocessing: $\text{app0} \xrightarrow{\text{tts}} \text{app1} \xrightarrow{\text{rlb}} \text{app2} \xrightarrow{\text{ptk}} \text{app3}$

¹using *rustomata* <https://github.com/tud-fop/rustomata>

Implementation¹

Preprocessing: app0 $\xrightarrow{\text{tts}}$ app1 $\xrightarrow{\text{rlb}}$ app2 $\xrightarrow{\text{ptk}}$ app3

```
for run1 in app3.recognise(word).take(n) {
  let trans_runs1 = ctf_level(run1, &ptk, &app2);
  for run2 in trans_runs1 {
    let trans_runs2 = ctf_level(run2, &rlb, &app1);
    for run3 in trans_runs2 {
      let trans_runs3 = ctf_level(run3, &tts, &app0);
      for run4 in trans_runs3 {
        println!("{:?}", run4);
      }
    }
  }
}
```

¹using *rustomata* <https://github.com/tud-fop/rustomata>

Outline

Experiments

- ▶ Grammars created by using the first 5, 10, 15 and 20 sentences of the NEGRA corpus²

²<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/negra-corpus.html>

³<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/stts.asc>

Experiments

- ▶ Grammars created by using the first 5, 10, 15 and 20 sentences of the NEGRA corpus²
- ▶ Grammars converted into Automata by *rustomata*

²<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/negra-corpus.html>

³<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/stts.asc>

Experiments

- ▶ Grammars created by using the first 5, 10, 15 and 20 sentences of the NEGRA corpus²
- ▶ Grammars converted into Automata by *rustomata*
- ▶ 2 equivalence classes, one using fanout and the other using tag-grouping³

²<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/negra-corpus.html>

³<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/stts.asc>

Experiments

- ▶ Grammars created by using the first 5, 10, 15 and 20 sentences of the NEGRA corpus²
- ▶ Grammars converted into Automata by *rustomata*
- ▶ 2 equivalence classes, one using fanout and the other using tag-grouping³
- ▶ *PTK* heights of 5, 10, 15 and 20

²<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/negra-corpus.html>

³<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/stts.asc>

Experiments

- ▶ Grammars created by using the first 5, 10, 15 and 20 sentences of the NEGRA corpus²
- ▶ Grammars converted into Automata by *rustomata*
- ▶ 2 equivalence classes, one using fanout and the other using tag-grouping³
- ▶ *PTK* heights of 5, 10, 15 and 20
- ▶ recognising three sentences contained in the corresponding corpus

²<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/negra-corpus.html>

³<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/stts.asc>

Experiments

- ▶ Grammars created by using the first 5, 10, 15 and 20 sentences of the NEGRA corpus²
- ▶ Grammars converted into Automata by *rustomata*
- ▶ 2 equivalence classes, one using fanout and the other using tag-grouping³
- ▶ *PTK* heights of 5, 10, 15 and 20
- ▶ recognising three sentences contained in the corresponding corpus

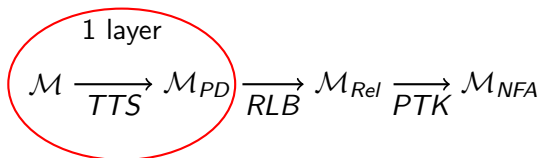
$$\mathcal{M} \xrightarrow{TTS} \mathcal{M}_{PD} \xrightarrow{RLB} \mathcal{M}_{Rel} \xrightarrow{PTK} \mathcal{M}_{NFA}$$

²<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/negra-corpus.html>

³<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/stts.asc>

Experiments

- ▶ Grammars created by using the first 5, 10, 15 and 20 sentences of the NEGRA corpus²
- ▶ Grammars converted into Automata by *rustomata*
- ▶ 2 equivalence classes, one using fanout and the other using tag-grouping³
- ▶ *PTK* heights of 5, 10, 15 and 20
- ▶ recognising three sentences contained in the corresponding corpus

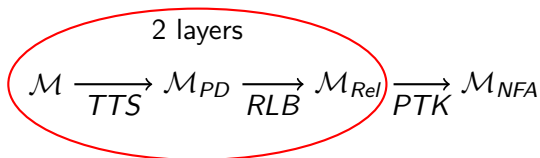


²<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/negra-corpus.html>

³<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/stts.asc>

Experiments

- ▶ Grammars created by using the first 5, 10, 15 and 20 sentences of the NEGRA corpus²
- ▶ Grammars converted into Automata by *rustomata*
- ▶ 2 equivalence classes, one using fanout and the other using tag-grouping³
- ▶ *PTK* heights of 5, 10, 15 and 20
- ▶ recognising three sentences contained in the corresponding corpus

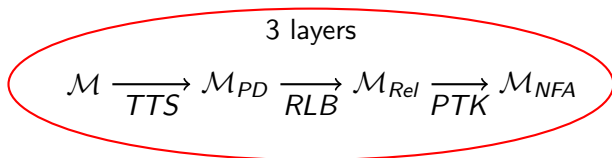


²<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/negra-corpus.html>

³<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/stts.asc>

Experiments

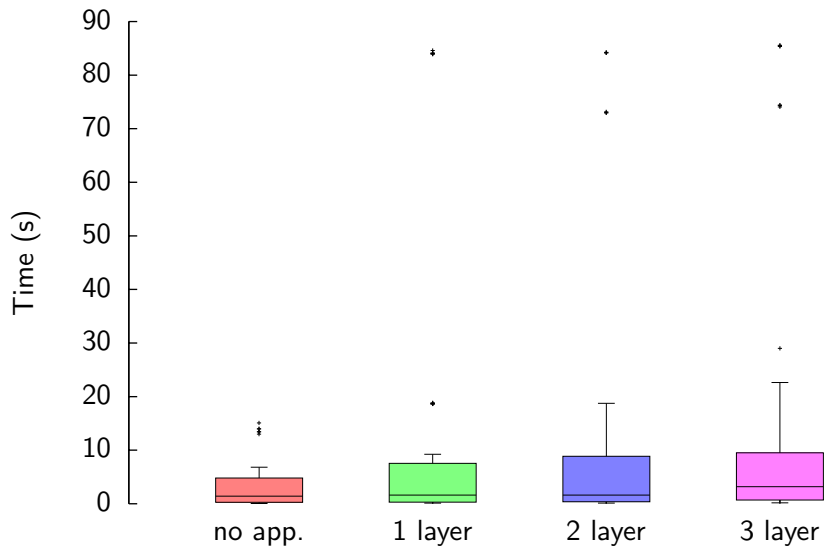
- ▶ Grammars created by using the first 5, 10, 15 and 20 sentences of the NEGRA corpus²
- ▶ Grammars converted into Automata by *rustomata*
- ▶ 2 equivalence classes, one using fanout and the other using tag-grouping³
- ▶ *PTK* heights of 5, 10, 15 and 20
- ▶ recognising three sentences contained in the corresponding corpus



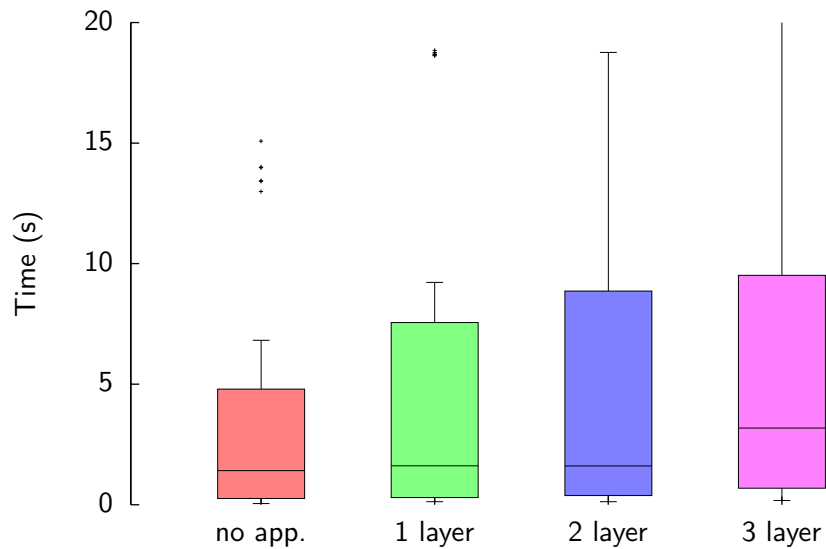
²<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/negra-corpus.html>

³<http://www.coli.uni-saarland.de/projects/sfb378/negra-corpus/stts.asc>

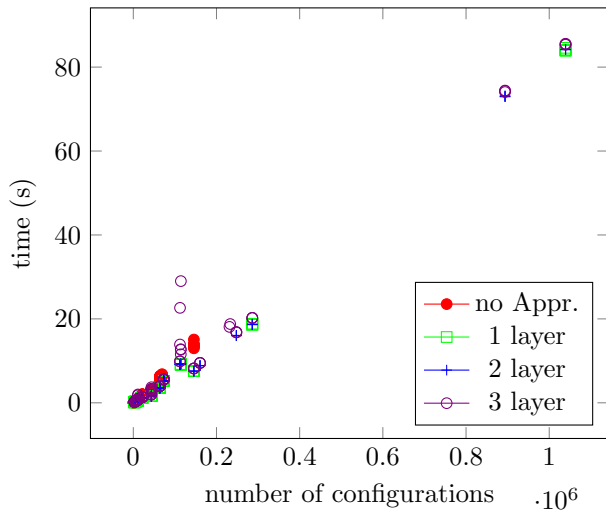
Results



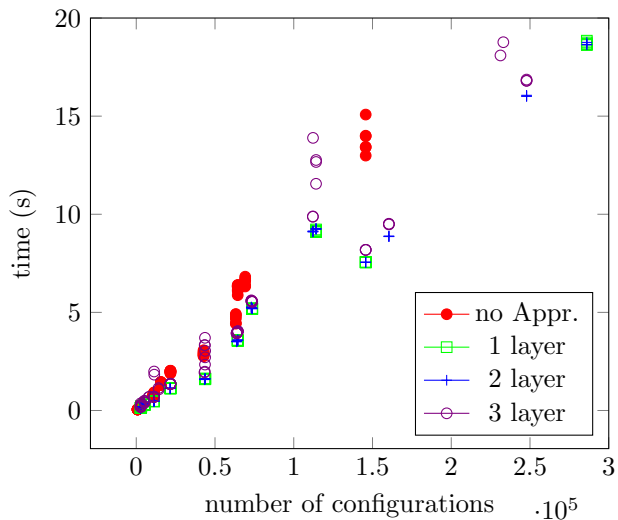
Results



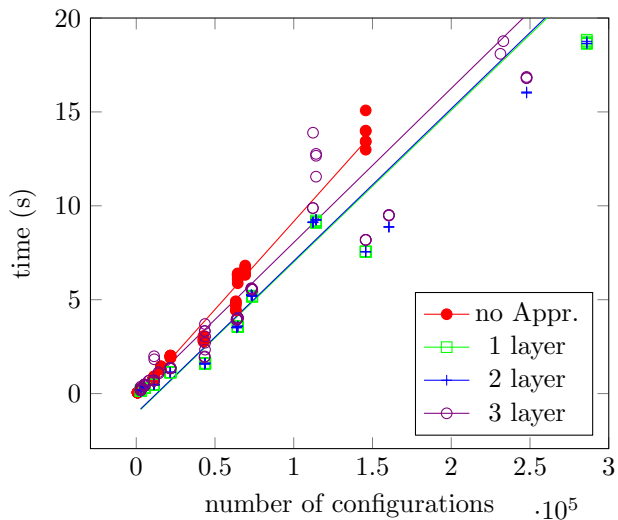
Results



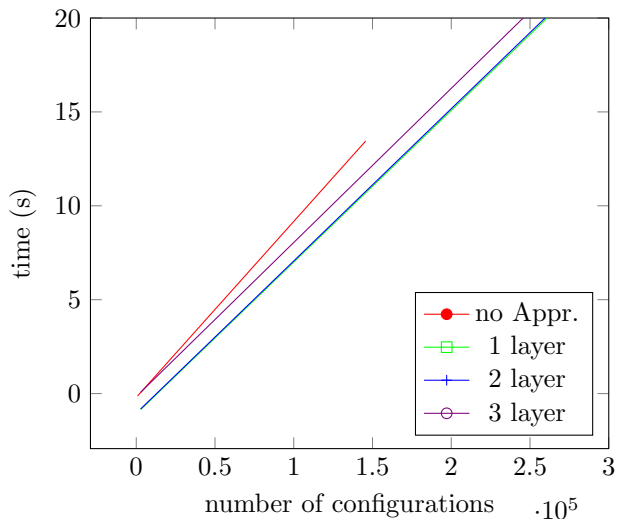
Results



Results



Results



References

- [1] Håkan Burden and Peter Ljunglöf. “Parsing Linear Context-Free Rewriting Systems”. In: *Proceedings of the Ninth IWPT (2005)*, pp. 11–17.
- [2] Eugene Charniak et al. “Multilevel coarse-to-fine PCFG parsing”. In: *Proceedings of the HLT-NACL. 2006*.
- [3] Andreas van Cranenburgh. “Efficient Parsing with Linear Context-Free Rewriting Systems”. In: *Proceedings of the 13th Conference of the EACL. (2012)*, pp. 460–470.
- [4] Tobias Denkinger. “Approximation of Weighted Automata with Storage”. In: *Proceedings Eighth International Symposium on GandALF. 2017*, pp. 91–105.
- [5] Mark-Jan Nederhof. “Regular approximations of CFLs: A grammatical view”. In: *Proceedings of the IWPT (1997)*, pp. 159–170.

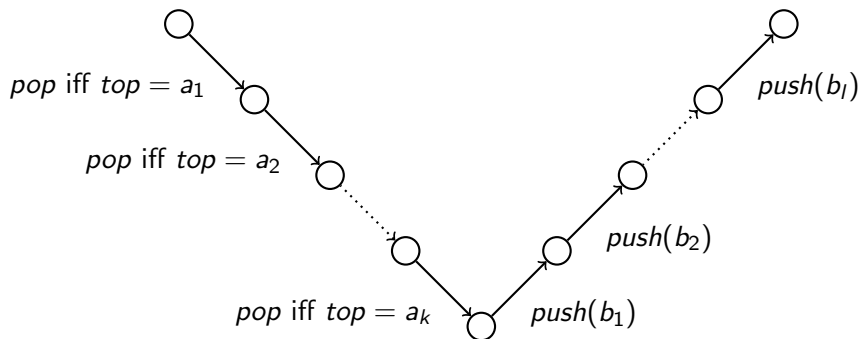
Stateless Push-Down Automata

Stateless Push-Down Automata

replace($\underbrace{a_1 a_2 a_3 \dots a_k}_{\text{current symbols}}, \underbrace{b_1 b_2 b_3 \dots b_l}_{\text{new symbols}}$)

Stateless Push-Down Automata

replace($\underbrace{a_1 a_2 a_3 \dots a_k}_{\text{current symbols}}, \underbrace{b_1 b_2 b_3 \dots b_l}_{\text{new symbols}}$)



- ▶ $push(\gamma) = replace(\varepsilon, \gamma)$ for all $\gamma \in \Gamma$

- ▶ $push(\gamma) = replace(\varepsilon, \gamma)$ for all $\gamma \in \Gamma$
- ▶ $pop(\gamma) = replace(\gamma, \varepsilon)$ for all $\gamma \in \Gamma$

- ▶ $push(\gamma) = replace(\varepsilon, \gamma)$ for all $\gamma \in \Gamma$
- ▶ $pop(\gamma) = replace(\gamma, \varepsilon)$ for all $\gamma \in \Gamma$
- ▶ $id(\gamma) = replace(\gamma, \gamma)$ for all $\gamma \in \Gamma$

- ▶ $push(\gamma) = replace(\varepsilon, \gamma)$ for all $\gamma \in \Gamma$
- ▶ $pop(\gamma) = replace(\gamma, \varepsilon)$ for all $\gamma \in \Gamma$
- ▶ $id(\gamma) = replace(\gamma, \gamma)$ for all $\gamma \in \Gamma$
- ▶ $id = replace(\varepsilon, \varepsilon)$

Stateless Tree-Stack Automata

Every instruction is preceded and followed by a $set(\gamma)$.

Stateless Tree-Stack Automata

Every instruction is preceded and followed by a $set(\gamma)$.

State behaviour is encoded into stack-symbols.