# Weak Factor Automata: Comparing (Failure) Oracles and Storacles

Loek Cleophas, Derrick G. Kourie, and Bruce W. Watson

FASTAR Research Group, University of Pretoria and Stellenbosch University, South Africa

> {loek,derrick,bruce}@fastar.org http://www.fastar.org

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### (Weak) factor automata

- Factor automaton (DAWG)
  - Accepts factors of keyword
  - Used for efficient backward pattern matching
  - Used as index
- Weak factor automata
  - ► (Small) over-approximation ... to save space
  - OK for pattern matching
  - May be OK for indexing

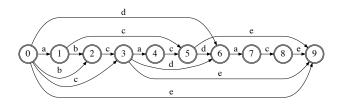


#### Contributions

- New weak factor automata constructions
  - Based on factor oracle and factor storacle
  - Using failure transitions
  - ► Failure factor oracle
  - Failure factor storacle
- Empirical size comparison
  - ▶ On generated strings of lengths 4-9
  - lacktriangle On English word list (lengths 4 28)



#### Factor oracle



- ► Small over-approximation—e.g. *bce*, *cace*
- ▶ m+1 states, m to 2m-1 transitions
- Acylic
- Homogeneous
- ightharpoonup O(m) construction (Allauzen, Crochemore & Raffinot 1999)
- ▶  $O(m^2)$  construction (Cleophas, Zwaan & Watson 2003/2005)
  - Conceptually simpler, some properties obvious



- 1: **for** *i* from 0 to *m* **do**
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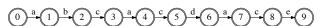


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$$0 \xrightarrow{a} 1 \xrightarrow{b} 2 \xrightarrow{c} 3 \xrightarrow{a} 4 \xrightarrow{c} 5 \xrightarrow{d} 6 \xrightarrow{a} 7 \xrightarrow{c} 8 \xrightarrow{e} 9$$

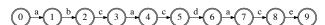


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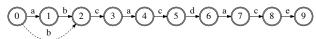


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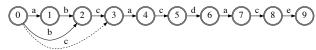
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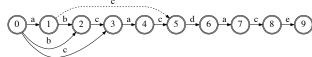
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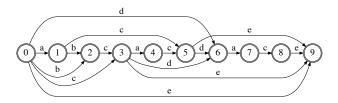






#### Factor oracle

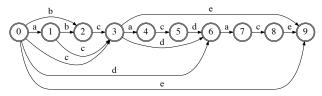
... etc. leads to





#### Factor storacle

- ▶ Modification to  $O(m^2)$  FO construction
- ▶ shortest forward transition oracle
  - ... keeping it homogeneous
  - Accidental...
  - Example smaller than FO



- Not smaller than FO in general (Cleophas & Watson 2012) ... usually slightly larger
- ▶ Conjecture *m* to 3*m* transitions



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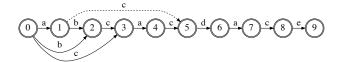


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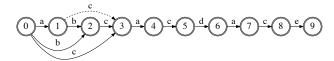


### Factor storacle construction example

#### Recall factor oracle case:



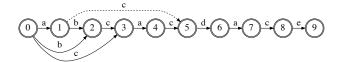
#### Factor storacle case:



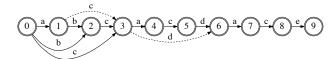


### Factor storacle construction example

#### Recall factor oracle case:



#### Factor storacle case:





#### Failure transitions

- Allow failure transitions in addition to symbol ones
- Save space, but more transition use...
- Not new
  - Aho-Corasick
  - ► Generalized by *Crochemore & Hancart 1997*
- ▶ First general  $DFA \rightarrow FDFA$  algorithm by Kourie et al. 2012
  - Intermediate lattice construction... keeping state set fixed
- Björklund et al. 2013
  - ► Complexity...
    - ... even if keeping state set fixed
  - ► Algorithm to reach  $\frac{2}{3}$  of optimal savings
- ▶ Both ex post facto...



#### Our idea

- Introduce failure transitions during construction
- ▶ We call the resulting automata Failure Factor (St)Oracles
- Complexity as for non-failure cases
- ▶ Idea: instead of constructing  $j \stackrel{a}{\rightarrow} k + 1$  ...
  - ... construct  $j \stackrel{fail}{\rightarrow} k$ , from which  $k \stackrel{a}{\rightarrow} k + 1$  exists
- ▶ Potential problem...



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- ▶ Using sequence of existing (failure, symbol) transitions may end up in j > k



#### Potential problem...

- ▶ Using sequence of existing (failure, symbol) transitions may end up in j > k
  - ... potential for backward failure transition
  - ... hence for cycle
  - ... hence for failure cycle
  - ... hence for divergent failure cycle
  - ... leading to live-lock in construction or use of automaton
- ▶ Solution: do not construct backward *failure* transition
  - ... instead create non-forward symbol transition
  - ... still potential for cycle (but manageable)



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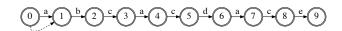
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Failure factor storacle construction algorithm similar



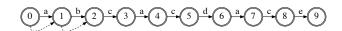
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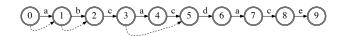
Suffix bcacdace





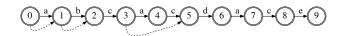
Suffix cacdace





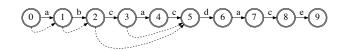
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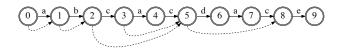
Suffix acdace Suffix cdace





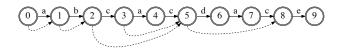
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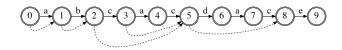
Suffix ace





Suffix ace Suffix ce





Suffix ace Suffix ce Suffix e



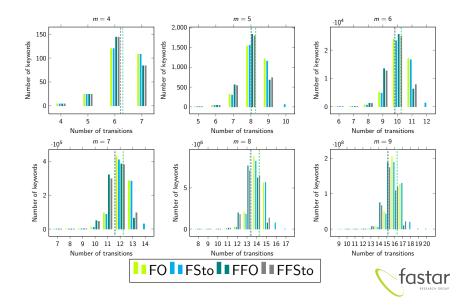
### **Empirical results**

#### Two data sets

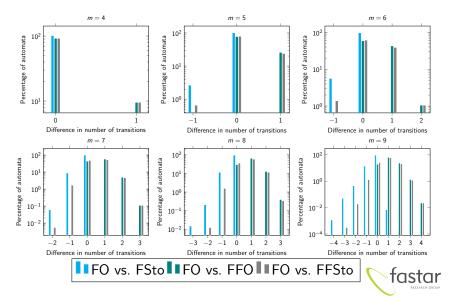
- ▶ Generated strings: all strings of length  $m \in [4, 9]$  over alphabet of size m
- ► English words



### Generated strings—number of transitions

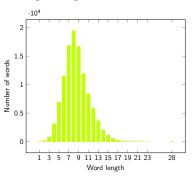


# Generated strings—difference in #transitions of FO vs. ...



# Empirical results on English words

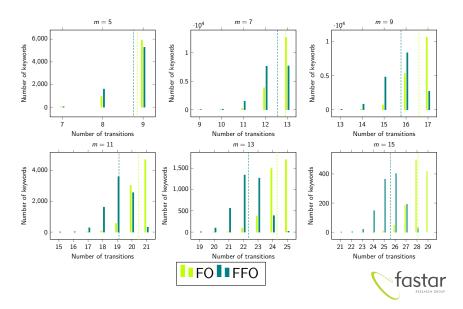
English word list from http://www.sil.org/linguistics/wordlists/english.



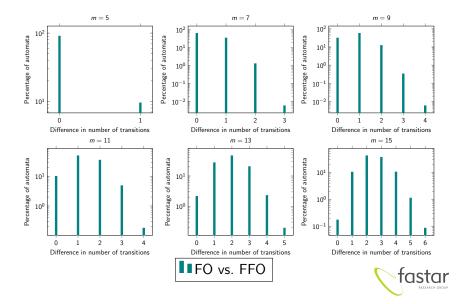
... disregarding words p with |p| < 4



### English words—number of transitions



#### English words—difference in #transitions of FO vs. FFO



# Concluding remarks

- ► Failure versions save ca. 2-10% on #transitions ... possibly more on space
- Open questions
  - Upper bounds on number of transitions
  - Languages
  - Comparison to general super automata
  - Comparison to general FDFA construction algorithm
- Performance when using automata
  - ... recent work: FFO for DNA strings of lengths 4-2048
    - ▶ Savings of 8 10% for lengths 16 2048
    - ▶ Also rudimentary processing; runtime increases 34 − 88%



#### References

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