Deduplication on Finite Automata and Nested Duplication Systems

Da-Jung Cho, Yo-Sub Han, and Hwee Kim

Department of Computer Science Yonsei University

Unconventional Computation and Natural Computation, 2017

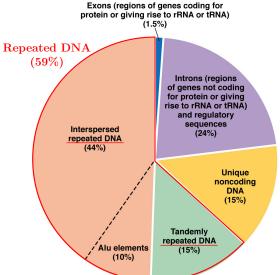
Outline

- Introduction
 - Motivation from Biology
 - Related Works
- Preliminaries
 - Nested Duplication
 - Nested Duplication System
- Main Results
 - NFA Construction for Nested Duplication System
 - Deduplication on Finite Automata
 - Capacity of Nested Duplication System
- Conclusion



Repeated DNA in Human Genome

Human genome contains large amount of repeated DNA.



Researches on Duplications

In formal language theory, a DNA is a string over $\Sigma = \{A, G, C, T\}$.

- Duplication operation on strings and their properties
 - Searls, "The computational linguistics of biological sequences", 1993.
 - ▶ Dassow et al., "On the regularity of duplication closure", 1999.
 - ▶ Dassow et al., "Operations and language generating devices suggested by the genome evolution", 2002.
 - Leupold et al., "Formal languages arising from gene repeated duplication", 2003.
 - Leupold et al., "Uniformly bounded duplication languages", 2005.
 - ▶ Ito et al., "Duplication in DNA sequences", 2008.
 - ► Cho et al., "Duplications and pseudo-duplications", 2016.
- Duplication Grammar
 - Martin-Vide and Păun, "Duplication grammars", 1999.
 - Mitrana and Rozenberg, "Some properties of duplication grammars", 1999.



Jain et al.¹ and Farnoud et al.² considered the string duplication systems and computed the capacity of the systems:

- string duplication system $S = (\Sigma, s, \tau)$ generates all strings by applying duplication function of τ to an initial string s a finite number times,
- capacity of string duplication system represents how many strings of length n that the system produces out of $|\Sigma^n|$, where n goes to infinity.

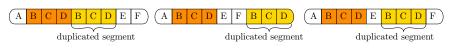
¹S. Jain, F. Farnoud, and J. Bruck. *Capacity and expressiveness of genomic tandem duplication*, ISIT 2015

²F. Farnoud, M. Schwartz, and J. Bruck. *The capacity of string-duplication systems*, IEEE Transactions on Information Theory, 2016.

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(a) Tandem duplication

- (b) End duplication
- (c) Interspersed duplication

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- *capacity* of string duplication system represents how many strings of length n that the system produces out of $|\Sigma^n|$, where n goes to infinity:

$$cap(S) = \lim_{n \to \infty} \sup \frac{\log_{|\Sigma|} |S \cap \Sigma^n|}{n}$$

The *Capacity* of string duplication system represents how many strings of length n the system produces out of $|\Sigma^n|$, where n goes to infinity.

Example

From a string 01 over $\Sigma = \{0, 1\}$, a system duplicates any substring of length up to 2 from 01 repetitively.

ullet 01 o 011 o 01111 o 0101111...

Then, the number of strings of length n is 2^{n-2} .

Encoding strings of length n in this system need n–2 bits.

The average number of bits per symbol = 1

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Encoding strings of length n in this system need n-2 bits.

The capacity of this system = 1

For computing the capacity, $\lim_{n\to\infty}\sup\frac{\log_{|\Sigma|}|S\cap\Sigma^n|}{n}$, of the duplication system $S=(\Sigma,s,\tau)$, we need to consider all strings

- of length *n*, where *n* goes to infinity,
- iteratively obtained by a duplication function $\mathbb{D} \in \tau$ from an initial string s,

$$\mathbb{D}^{i}(\mathbb{D}^{i-1}(\cdots(\mathbb{D}^{2}(\mathbb{D}^{1}(s)))), \text{ for } i \geq 1.$$

Jain et al. (2015)

Given a finite directed graph that represents the string duplication system *S*, we can compute the capacity of *S* using *Perron-Frobenus Theory* [Lind and Marcus, 1985].

It is hard to construct a finite automata!



Our Goal from Formal Language Theory

- Define a variant of duplication functions named nested tandem duplication
- Construct an NFA for a set of strings obtained by a nested duplication system
 - NFA construction (possible for any restriction on length of duplicated substring)
 - D-cycle deduplication on NFA
- Compute the capacity of the nested duplication system

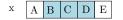
Definition (Tandem Duplication)

A tandem duplication $\mathbb{D}^{tan}_{\leq k}$ of x is defined

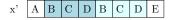
$$\mathbb{D}^{tan}_{\leq k}(x) = \begin{cases} uvvw & \text{for } x = uvw, |u| = i, |v| \leq k \\ x & \text{otherwise.} \end{cases}$$

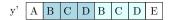
For a string x, $\mathbb{D}^{tan}_{\leq k}(x)$ allows a substring v of length up to k starting at position i+1 to be duplicated next to its original position.

Tandem Duplication and Nested Duplication





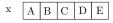




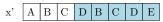
(a) A tandem duplication

(b) A nested duplication

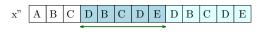
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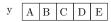
region of previous duplication



length of previous duplication



(a) A tandem duplication



region of previous duplication



length of previous duplication

(b) A nested duplication

Definition (Nested Duplication)

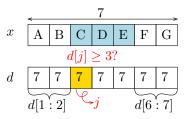
$$\begin{cases} (uvvw, d[1:|u|] \cdot |v|^{2|v|} \cdot d[|u|+|v|+1:|x|]) & \text{if } d[j] \ge |v| \\ & \text{for } |u|+1 \le j \le |u|+|v|, \end{cases}$$

$$(x, d) & \text{otherwise.}$$

- , ,
- For a string $w = w_1 w_2 \cdots w_n$ and $i \ge 1$, w[1:i] denotes a substring $w_1 \cdots w_i$.
- For an integer $j \ge 1$, j^k denotes k consecutive j.

Definition (Nested Duplication)

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$$(y, d') \in \mathbb{D}_{2,3}^{nes}(x, d)$$

$$y \quad \boxed{A \mid B \mid C \mid D \mid E \mid C \mid D \mid E \mid F \mid G}$$

$$d' \quad \boxed{7 \mid 7 \mid 3 \mid 3 \mid 3 \mid 3 \mid 3 \mid 3 \mid 7 \mid 7}$$

$$d[1:2] \quad 3^{3*2} \quad d[2+3+1:7]$$

Definition (Nested Duplication)

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Nested Duplication System

Definition (Nested Duplication System)

A nested duplication system consists of three tuples $S = (\Sigma, s, \mathbb{D}_{\leq k}^{nes})$,

- $s \in \Sigma^*$ is seed, a finite length string,
- $\mathbb{D}^{nes}_{\leq k}$ is the nested duplication function.

We call the set of all strings generated by the system $S = (\Sigma, s, \mathbb{D}^{\textit{nes}}_{\leq k})$

the language generated by S, L(S).

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We extend the nested duplication system to a language

$$S = (\Sigma, L, \mathbb{D}_{\leq k}^{nes}).$$

We construct an NFA M_S recognizing the language L(S) generated by the nested duplication system $S = (\Sigma, s, \mathbb{D}^{nes}_{< k})$.

NFA Construction for L(S)

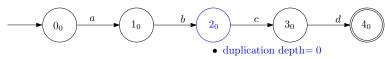
An NFA M_S is a tuple $(Q, \Sigma, \delta, 0_0, \{n_0\})$, where

$$Q = \{q \mid q = I[1]_{d[1]}I[2]_{d[2]} \cdots I[t]_{d[t]}, 1 \le t \le n, d[1] = 0\}$$

- t represents the depth of a duplication, $1 \le t \le n$
- for each depth t, d[t] denotes the length of duplications,
- I[t] represents # of characters duplicated so far by the last duplication in depth t.

$$S = (\Sigma, abcd, \mathbb{D}_{\leq 4}^{nes})$$

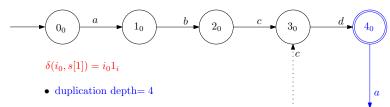
$$q = l[1]_{d[1]} l[2]_{d[2]} \cdots l[t]_{d[t]}$$



 $\delta((i-1)_0, s[i]) = i_0$

• two characters are so far read

$$S = (\Sigma, \operatorname{abcd}, \mathbb{D}_{\leq 4}^{nes})$$
$$q = l[1]_{d[1]} l[2]_{d[2]} \cdots l[t]_{d[t]}$$



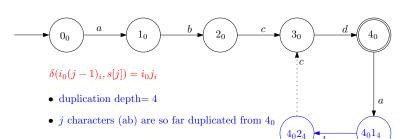
 $\bullet\,$ one character (a) are so far duplicated from 4_0



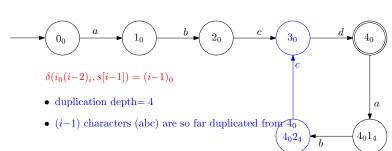
 4_01_4

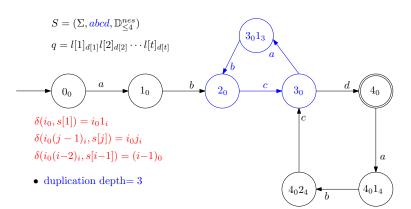
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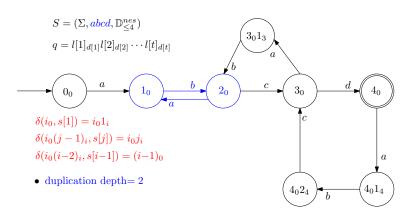
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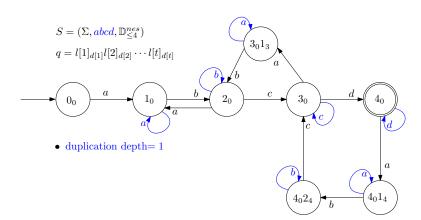


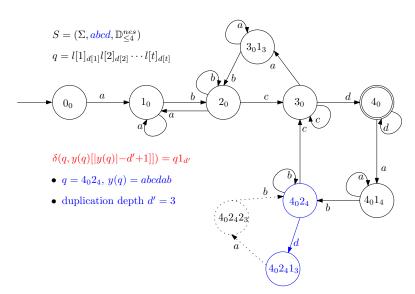
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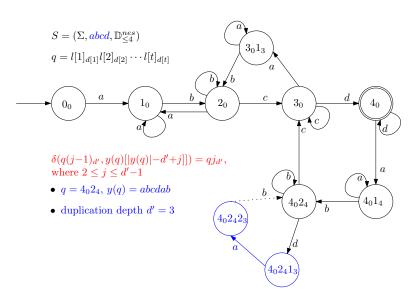


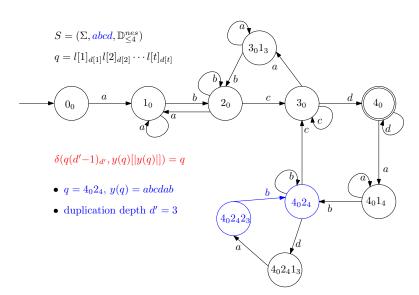


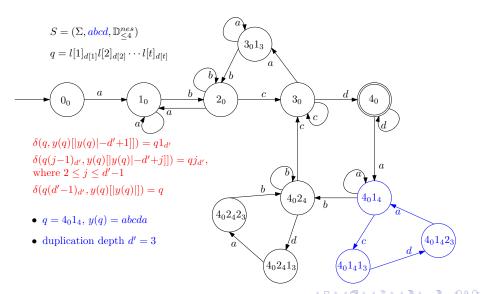


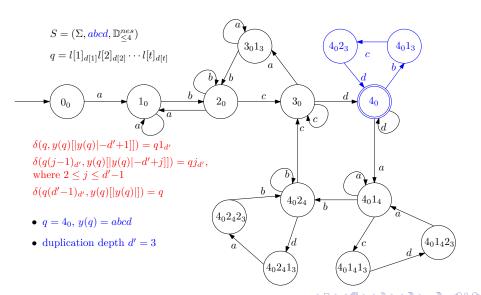


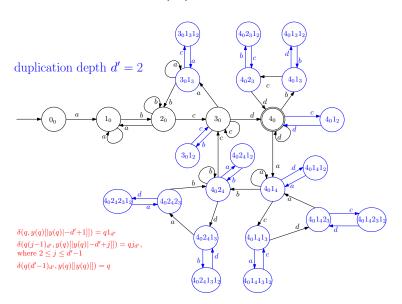


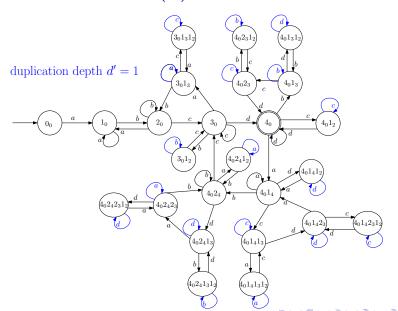












Given a set \mathcal{L} of possible duplication lengths,

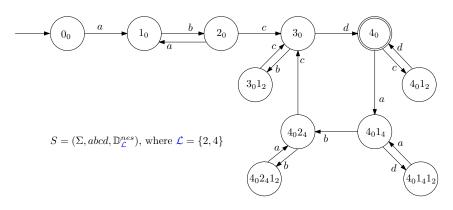


Figure: An example of NFA recognizing L(S), where $S = (\Sigma, abcd, \mathbb{D}^{nes}_{\mathcal{L}})$.

Theorem

The NFA $M_S = (Q, \Sigma, \delta, 0_0, \{n_0\})$ recognizes the language generated by the nested duplication system $S = (\Sigma, s, \mathbb{D}^{nes}_{\leq k}), L(M_S) = L(S)$.

- If $x \in L(S)$, then $x \in L(M_S)$.
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If $x \in L(M_S)$, then $x \in L(S)$.

- For a string $x \in L(M_S)$, let p be the path that yields x.
- We recursively generate a series of paths p_i and strings x_i :
 - $\bigcirc p_1$: generated by removing all self loops in p.
 - 2 ...
 - **3** p_i : generated by removing all cycles of size i in p_{i-1} .
- Then, $x_n = s$.

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Deduplication on finite automata!

Deduplication on Finite Automata

For a string w' = xyyz, where $|y| \le k$, deduplication of w' transforms yy into y,

$$Xyyz \rightarrow Xyz$$
.

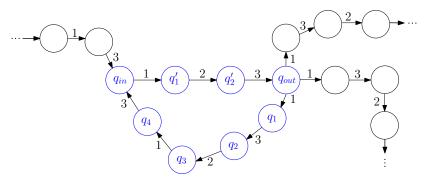
D-cycle deduplication

D-cycle deduplication transforms a given NFA M to a smaller NFA M' while generating the same language in the duplication system by removing cycles in the NFA that satisfies special conditions,

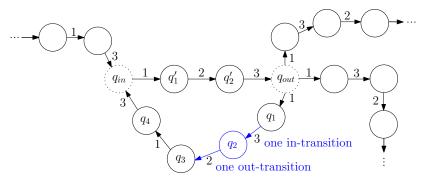
$$L(S) = L(S'),$$

where $S = (\Sigma, L(M), \mathbb{D}^{nes}_{\leq k})$ and $S' = (\Sigma, L(M'), \mathbb{D}^{nes}_{\leq k})$.

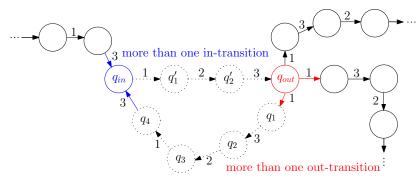
For a cycle C in an NFA, we call the cycle \mathbb{D} -cycle if C satisfies special conditions:



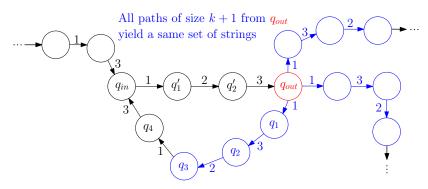
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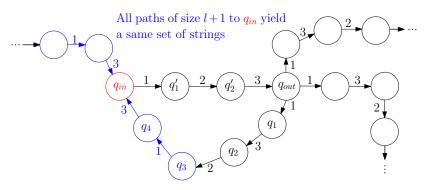
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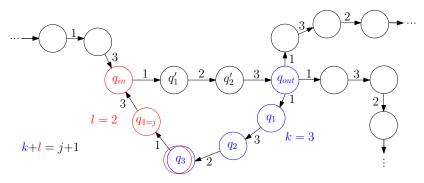
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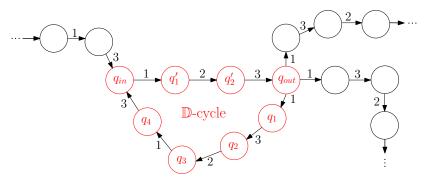
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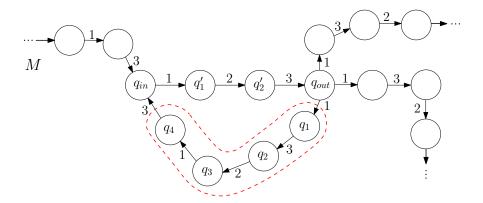


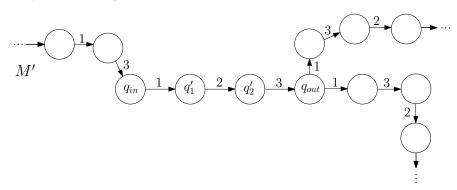
Definition

Given an NFA $M = (Q, \Sigma, \delta, s, F)$ with a \mathbb{D} -cycle $(q_{in}, q'_1, q'_2, \dots, q'_i, q_{out}, \dots, q'_i, q'_{out}, q$

 $q_1, q_2, \ldots, q_j, q_{in}$), we define a \mathbb{D} -cycle deduplication by $M \stackrel{\mathbb{D} \subseteq h}{\longrightarrow} M'$, where i+j=h, to be

$$M' = (Q \setminus \{q_1, q_2, \ldots, q_j\}, \Sigma, \{\delta(p, \alpha) = q \mid p, q \notin \{q_1, q_2, \ldots, q_j\}\}, s, F).$$





Lemma

Given an NFA M and its deduplication M' such that $M \overset{\mathbb{D}_{\leq h}^{-1}}{\longrightarrow} M'$, let $S = (\Sigma, L(M), \mathbb{D}_{\leq k}^{nes})$ and $S' = (\Sigma, L(M'), \mathbb{D}_{\leq k}^{nes})$. Then,

$$L(S) = L(S')$$
.

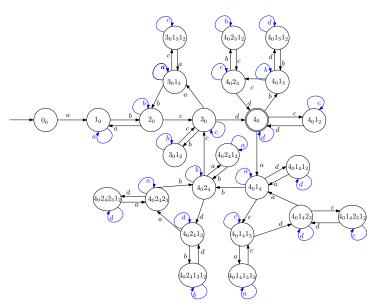
Theorem

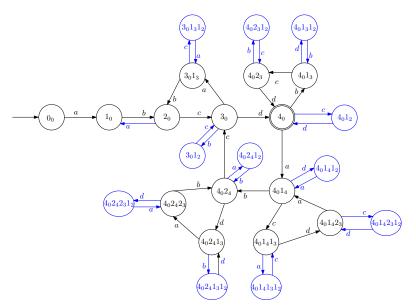
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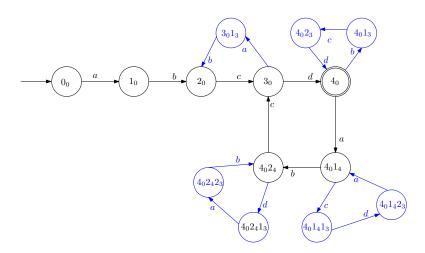
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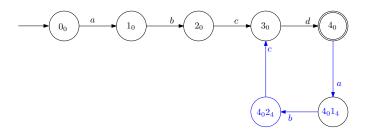
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Deduplication on finite automata!











Computing the Capacity of S

Definition

The *capacity* of a duplication system S represents how many strings the system produces compared to Σ^n , where n goes to infinity,

$$cap(S) = \lim_{n \to \infty} \sup \frac{\log_{|\Sigma|} |S \cap \Sigma^n|}{n}.$$

From Jain et al. (2015), it is known that we can compute the capacity of S represented by DFA using Perron-Frobenius Theory.

Computing the Capacity of S

- Construct an NFA M_S for $S = (\Sigma, s, \mathbb{D}^{nes}_{\leq k})$.
- ② Convert M_S to a DFA M'.
- § Find the maximal connected component in M' and compute its adjacency matrix \mathbb{M} .
- Return the maximum eigenvalue of M using Perron-Frobenius Theory.

Summary

- Defined
 - ▶ the nested duplication operation $\mathbb{D}^{nes}_{< k}(w)$,
 - ▶ the nested duplication system $S(\Sigma, s, \mathbb{D}^{nes}_{< k})$.
- Presented an NFA construction for L of $S(\Sigma, s, \mathbb{D}^{nes}_{\leq k})$
- Introduced the D-cycle deduplication on NFA



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Thank you!