



## A separation between RLSPs and LZ77

**Bille, Philip; Gagie, Travis; Gørtz, Inge Li; Prezza, Nicola**

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A Separation Between RLSLPs and LZ77<sup>☆</sup>Philip Bille<sup>a</sup>, Travis Gagie<sup>b</sup>, Inge Li Gørtz<sup>a,\*</sup>, Nicola Prezza<sup>a</sup><sup>a</sup>*DTU Compute, Technical University of Denmark, Lyngby, Denmark*<sup>b</sup>*EIT, Universidad Diego Portales, Santiago, Chile*

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**Abstract**

In their ground-breaking paper on grammar-based compression, Charikar et al. (2005) gave a separation between straight-line programs (SLPs) and Lempel-Ziv '77 (LZ77): they described an infinite family of strings such that the size of the smallest SLP generating a string of length  $n$  in that family, is an  $\Omega(\log n / \log \log n)$ -factor larger than the size of the LZ77 parse of that string. However, the strings in that family have run-length SLPs (RLSLPs) — i.e., SLPs in which we can indicate many consecutive copies of a symbol by only one copy with an exponent — as small as their LZ77 parses. In this paper we modify Charikar et al.'s proof to obtain the same  $\Omega(\log n / \log \log n)$ -factor separation between RLSLPs and LZ77.

*Keywords:* grammar-based compression; run-length compression; SLP; RLSLP; LZ77; Thue-Morse sequence

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**1. Introduction**

Storing and processing massive datasets has become a fundamental task of modern computer science and inspired a renaissance in data compression. Most datasets are highly repetitive and so dictionary- and grammar-based compression algorithms often achieve dramatic results, with the added benefit that some

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\*Corresponding author

*Email addresses:* `phbi@dtu.dk` (Philip Bille), `travis.gagie@gmail.com` (Travis Gagie), `inge@dtu.dk` (Inge Li Gørtz), `nicola.prezza@gmail.com` (Nicola Prezza)

are “computation-friendly” in the sense that we can perform many calculations faster on compressed datasets than on uncompressed ones. However, traditional techniques for analyzing compression — developed mainly for statistical compressors and based on empirical entropy or the expected compressibility of strings generated by Markov sources — do not accurately predict how well we can compress repetitive datasets.

Charikar et al. [1] changed the course of this line of research by proving upper and lower bounds relating the sizes of several compressed representations, to the size of the input’s Lempel-Ziv ’77 (LZ77) parse [2] and to the size of its smallest straight-line program (SLP). The LZ77 parse of a text is a greedy left-to-right parse into maximal factors such that each factor already occurred to the left. Despite its simplicity, LZ77 can be easily shown to be optimal among all unidirectional parses (i.e. that copy phrases from left-to-right), and dominates SLPs, which are context-free grammars that generate only the text as output, and other popular compression schemes.

Let  $z_{no}$  be the number of phrases of the Lempel-Ziv parse when overlaps are not allowed between phrases and their sources, and let  $g^*$  be the size of the smallest SLP. Charikar et al. [1] and Rytter [3] showed how to obtain a unidirectional parse of size at most  $g$  starting from a SLP of size  $g$ . It follows from the optimality of LZ77 that the relation  $z_{no} \leq g^*$  holds. On the other hand, they showed how to build an SLP of size  $O(z_{no} \log(n/z_{no}))$  from the LZ77 parse, so  $g^*$  has at most that size. Finally, Charikar et al. showed an infinite family of strings for which  $g^*/z_{no} = \Omega(\log n / \log \log n)$ , where  $n$  is the length of the string. These results imply that LZ77 compression without overlaps is always at least as good as grammar compression, and strictly better in some cases.

Given that SLPs are often more computation-friendly than LZ77, one might wonder whether we could enhance SLPs so that they become as powerful as Lempel-Ziv compression. See, for example, Bille et al. [4, Thm 1.1] and Kreft and Navarro [5, Thm 4.11] for classical solutions to the random access problem on grammar- and Lempel-Ziv-compressed texts, respectively. One possible extension of SLPs is to add so-called run-length rules, i.e. rules of the form

$X \rightarrow Y^\ell$ , for  $\ell > 1$  (meaning that  $X$  expands to  $\ell$  repetitions of  $Y$ ). This extension takes the name *run-length SLP*, or RLSLP in what follows. RLSLPs were formally introduced by Nishimoto et al. [6], who used them in a compressed data structure for computing longest common extensions, although Jež [7] used  
 40 a similar idea earlier in his paper on approximating the smallest SLP via recompression. Interestingly, Jež’s construction gives a balanced RLSLP, which becomes unbalanced when it is converted into a standard SLP. Very recently, Gagie, Navarro and Prezza [8] used RLSLPs in a data structure supporting fast  
 45 random access to compressed strings.

Let  $g_{rl}^*$  be the size of the smallest RLSLP. It is easy to show that  $g^* = \Theta(\log n)$  and  $g_{rl}^* = O(1)$  on unary strings of length  $n$ . This implies that RLSLPs are a strict improvement over SLPs. Since  $z_{no} \in \Theta(\log n)$  on unary strings, we also have that  $z_{no}/g_{rl}^* = \Theta(\log n)$  for an infinite class of strings: RLSLPs  
 50 improve upon Lempel-Ziv compression in some cases, and therefore are good candidates for capturing it. However, a slight modification to the LZ77 compression scheme adds enough power to capture, again, grammar compression with run-length rules. Let  $z$  be the number of phrases of the Lempel-Ziv parse when overlaps are allowed between phrases and their sources. By adapting Rytter’s proof, Gagie et al. [8] proved that  $z \leq 2g_{rl}^*$ , implying we cannot hope to  
 55 significantly beat LZ77 with overlaps using RLSLPs, but they did not give a separation between  $z$  and  $g_{rl}^*$ ; for strings in the family Charikar et al. described,  $g_{rl}^* = O(z_{no})$

The missing piece in the puzzle is the following: are RLSLPs always at least  
 60 as good as Lempel-Ziv (with or without overlaps)? In this paper, we answer negatively to this question. By adapting Charikar et al.’s proof [1], we give an infinite family of strings for which  $g_{rl}^*/z_{no} = \Omega(\log n / \log \log n)$ . Since  $z \leq z_{no}$  trivially holds, our result implies that Lempel-Ziv compression with overlaps is always at least as good as grammar-compression with run-length rules, and  
 65 strictly better in some cases. Formally, we prove the following theorem.

**Theorem 1.** *There exists an infinite family of strings for which the ratio be-*

tween the size of the smallest RLSLP and the length of the LZ77 parse is

$$\frac{g_{rl}^*}{z_{no}} = \Omega\left(\frac{\log n}{\log \log n}\right).$$

We note that since Charikar et al.’s and Rytter’s work, other researchers simplified the proof that  $g^* \in O(z_{no} \log(n/z_{no}))$  and strengthened it to show  $g^* \in O(z \log(n/z))$  [7], and described an infinite family of *binary* strings for which  $g^*/z_{no} = \Omega(\log n / \log \log n)$  [9]. In collaboration, these authors and oth-  
 70 ers [10] have recently independently proposed ideas similar to some of the ones we describe in this paper: specifically, they used the cube-freeness of the Thue-Morse sequence to show there is an infinite family of strings — prefixes of the Thue-Morse sequence — whose minimum RLSLPs are not asymptotically smaller than their minimum SLPs. This does not separate RLSLPs from LZ77,  
 75 however, since those strings’ LZ77 parses are not asymptotically smaller than their minimum SLPs, either.

Now that we know the Charikar et al.’s separation between SLPs and LZ77 can be made robust with respect either to alphabet size or to run-length encoding of symbols in rules, an obvious open problem is strengthening the results in  
 80 this paper to hold for strings over small alphabets, ideally binary. In the longer term, we feel researchers should revisit several other natural generalizations of SLPs that Charikar et al. proposed in the conference version of their paper and claimed to show not to have significantly greater power, “suggest[ing] the robustness of grammar based string complexity”; the proofs seemed fragile and  
 85 those sections were omitted from the final version.

## 2. Preliminaries

Charikar et al. [1] showed a separation between the smallest grammar and the size of the LZ77 parse of a string.

**Lemma 2** (Charikar et al.). *There exists an infinite family of strings for which the ratio between size of the smallest grammar and the length of the LZ77 parse*

is

$$\frac{g^*}{z_{no}} = \Omega\left(\frac{\log n}{\log \log n}\right).$$

The proof is based on the following lemma (implicit in the paper) that they  
 90 proved using a link between grammars and addition chains.

**Lemma 3** (Charikar et al.). *Let  $k_1, \dots, k_p$  be a set of distinct positive integers, and consider strings of the form  $s = x^{k_1}|_1x^{k_2}|_2 \dots |_{p-1}x^{k_p}$ , where  $k_1$  is the largest of the  $k_i$ . Let  $p = \Theta(\log k_1)$ . There exists an infinite class of sequences of integers  $k_1, \dots, k_p$  such that the smallest grammar for  $s$  has size*

$$\Omega\left(\frac{\log^2 k_1}{\log \log k_1}\right).$$

Since the LZ77 parse for the string has size  $O(p + \log k_1) = O(\log k_1)$  Lemma 2 follows.

*Thue-Morse Sequence.* The Thue-Morse sequence can be generated by starting with 01 and keep appending the inverse binary negation of the sequence already generated:

$$01 \rightarrow 0110 \rightarrow 01101001 \rightarrow 0110100110010110 \rightarrow \dots$$

The Thue-Morse sequence is overlapfree [11, 12, 13, 14], and therefore also cubefree on two symbols [15]. We denote the infinite Thue-Morse sequence as  $t$   
 95 in the following.

### 3. Separation

*Size of smallest RLSLP.* Let  $t(n)$  be the prefix of length  $n$  of the infinite Thue-Morse sequence. Let  $k_1, \dots, k_p$  be a set of distinct positive integers, and consider strings of the form

$$\hat{s} = t(k_1)|_1t(k_2)|_2 \dots |_{p-1}t(k_p),$$

where  $k_1$  is the largest of the  $k_i$ .

Since the sequences  $t(k_i)$  are cubefree, there is no difference in the size of the smallest grammar and the smallest RLSLP for the string  $\hat{s}$ . To see why this

100 holds, consider any RLSLP for  $\hat{s}$ . Since  $\hat{s}$  is cubefree, for any rule of the form  $X \rightarrow Y^\ell$  it must be the case that  $\ell = 2$ . Then, we can convert all rules of this kind to the form  $X \rightarrow YY$  and obtain a SLP for  $\hat{s}$  of the same size.

Let  $s = x^{k_1}|_1x^{k_2}|_2\dots|_{p-1}x^{k_p}$ . Assume we have a grammar of size  $g$  for  $\hat{s}$ . Replacing all the terminals  $(-1, 0, 1)$  by  $x$  gives us a grammar for  $s$  of size  $g$ . Thus the smallest grammar for  $\hat{s}$  must be at least the size of the smallest grammar for  $s$ . From Lemma 3 we know that there exist integers  $k_1, \dots, k_q$ , with  $q \in \Theta(\log k_1)$  and  $k_1$  being the largest integer in the sequence, such that the smallest grammar for  $s$  has size  $\Omega\left(\frac{\log^2 k_1}{\log \log k_1}\right)$ . It follows that the smallest SLP (and thus RLSLP, for the above considerations) for  $\hat{s}$  has size at least

$$\Omega\left(\frac{\log^2 k_1}{\log \log k_1}\right).$$

*Size of LZ77 parse.* The LZ77 parse for the Thue-Morse sequence of length  $n$  has size  $O(\log n)$  [17]. Now consider the string  $\hat{s}$ , and let  $z_1$  be the LZ77 parse of  $t(k_1)|_1$ , of size  $O(\log k_1)$ . The LZ77 parse of  $\hat{s}$  is then  $z_1$  followed by  $(1, k_2)|_2\dots|_{p-1}(1, k_p)$ . The size of the parse is  $O(\log k_1 + p) = O(\log k_1)$ . The ratio between the smallest RLSLP and the length of the LZ77 parse is therefore

$$\Omega\left(\frac{\log k_1}{\log \log k_1}\right) = \Omega\left(\frac{\log n}{\log \log n}\right).$$

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