# Computing Periodicities in Strings — A New Approach

# Bill Smyth\*<sup>†</sup>

The most efficient methods for computing repetitions or repeats in a string x = x[1..n] all depend on the prior computation of a suffix tree/array  $ST_x/SA_x$ . Although these data structures can be computed in asymptotic  $\Theta(n)$ time, nevertheless in practice they involve significant overhead, both in time and space. Since the number of repetitions/repeats in x can be reported in a way that is at most linear in string length, it should therefore be possible to devise less roundabout means of computing repetitions/repeats that take advantage of their infrequent occurrence. This talk provides background for these ideas and explores the possibilities for more efficient computation of periodicities in strings.

\* Algorithms Research Group, Department of Computing & Software, McMaster University

<sup>†</sup> Department of Computing, Curtin University

# Why are Periodicities Interesting?

- Often long sections of DNA are copied, exactly or approximately, from one section of the genome to another; it is important to identify these copies and their context in a gene or chromosome.
- Many data compression algorithms depend on identifying repeating sections of text that are either long or frequent or both; these can be coded into shorter substrings that allow the text to be compressed.
- Repeating substrings, exact or approximate, may be of interest in decryption.
- Repeating motifs/phrases, exact or approximate, are studied by musicologists.

# Kinds of Periodicity

In this talk, we confine ourselves to substrings that repeat **exactly**:

- repetitions (adjacent repeating substrings);
- runs ("super-repetitions");
- **repeats** (repeating substrings, not necessarily adjacent).

Computing approximate repetitions is much harder: the best algorithm is a stringological *tour de force* that requires  $O(n^2 \log n)$  time.

Even exact repetitions require a lot of work; all the algorithms use **suffix trees/arrays**.

# What is a Suffix Tree/Array?



4

#### Repetitions

Suppose a string x = x[1..n] is given:

repetition:	a substring $x[ii+pe-1] = u^e$ ,
	$ oldsymbol{u} =p$ and $e\geq 2.$
$u^e$ irreducible:	$m{u}$ itself is not a repetition.
$u^e$ maximal:	neither $x[i\!-\!pi\!-\!1]$ nor
	x[i+pei+p(e+1)-1] = u.

All repetitions discussed are both irreducible and maximal; they are fully specified by the triple (i, p, e).

generator:uperiod:pexponent:e

Repetitions  $(1,3,2) = (aba)^2$ ,  $(3,1,2) = a^2$ ,  $(4,2,2) = (ab)^2$ , and  $(5,2,2) = (ba)^2$ , all squares.

# **Repetitions** (continued)

A naïve reporting of all the squares in a string would require  $\Theta(n^2)$  time in the worst case — reporting all squares in  $x = a^6$  necessitates  $\lfloor 6^2/4 \rfloor$  outputs:

 $x[i]^2, 1 \le i \le 5; \ x[i..i+1]^2, 1 \le i \le 3; \ x[1..3]^2.$ 

There are three "classical"  $O(n \log n)$  algorithms [Crochemore (1981), Apostolico & Preparata (1983), Main & Lorentz (1984)] for computing all repetitions in the (i, p, e) encoding. [C81] & [AP83] essentially use suffix trees, [ML84] is divide-&-conquer. All are (in a sense) asymptotically optimal because the Fibostring  $f_K$ 

 $f_0 = b, f_1 = a; f_k = f_{k-1}f_{k-2}, k = 2, 3, \dots, K$ actually contains  $\Theta(|f_K| \log |f_K|)$  repetitions.

#### <u>Runs</u>

Consider

$$x = \cdots b$$
 abaabaab b $\cdots$ 

We report repetitions (i, 3, 2), (i+1, 3, 2), (i+2, 3, 2). But (i, 3, 2) implies the other two because  $(aba)^2ab$  is followed by ab, a prefix of the generator aba.

Given a (maximal, irreducible) repetition (i, p, e):

- (*i*, *p*, *e*) is left-extendible (LE) if (*i*−1, *p*, 2) is a square; otherwise NLE.
- The **tail** is the greatest integer t satisfying  $\forall j \in 0..t$ , (i+j, p, e) is a repetition.

Then a **run** (maximal periodicity) [Main 1989] is a 4-tuple (i, p, e, t) where (i, p, e) is an NLE repetition of tail t. **<u>Runs</u>** (continued)

Let  $\rho(n)$  be the maximum number of runs that can occur in any string of length n. Then [Kolpakov & Kucherov (2000)]

$$\rho(n) \leq k_1 n - k_2 \sqrt{n} \log_2 n,$$

where  $k_1 \& k_2$  are universal positive constants of unknown size. K&K show that all runs in xcan be computed in linear time (on an **indexed** (integer) alphabet):

- compute the suffix tree  $T_x$  [Farach (1997)];
- compute the LZ-factorization [Lempel-Ziv (1976)];
- compute the leftmost runs [Main (1989)];
- compute the remaining runs [K&K (2000)].

#### Repeats

A **repeat** in x is a tuple

 $M_{x,u} = (p; i_1, i_2, ..., i_e),$ where  $e \ge 2$ ,  $1 \le i_1 < i_2 < \cdots < i_e \le n$ , and  $u = x[i_1..i_1+p-1] = x[i_2..i_2+p-1] = \cdots = x[i_e..i_e+p-1],$ with generator u, period p, exponent e.

Note that possibly, for some  $j \in 1..e-1$ ,  $i_{j+1}-i_j = p$  (repetition) or  $i_{j+1}-i_j < p$  (overlap).

#### • $M_{\boldsymbol{x},\boldsymbol{u}}$ is **maximal** if for every

 $i \in 1..n$  and  $i \notin \{i_1, i_2, \dots, i_e\}$ , we are assured that  $x[i..i+p-1] \neq u$ .

•  $M_{\boldsymbol{x},\boldsymbol{u}}$  is left-extendible (LE) if

 $(p; i_1 - 1, i_2 - 1, \dots, i_e - 1)$ 

is a repeat.

•  $M_{\boldsymbol{x},\boldsymbol{u}}$  is **right-extendible** (RE) if

$$(p; i_1+1, i_2+1, \ldots, i_e+1)$$

is a repeat.

# BUT:

• maybe  $k_1 = 10^{10}$  — the K&K proof is nonconstructive;

• K&K provide convincing experimental evidence that in fact  $\rho(n) < n$ ;

• the algorithm is complicated and not spaceefficient (though better using suffix arrays).

### Recall:

If  $\sigma(n)$  is the maximum number of *distinct* squares that can occur in a string of length n, then [Fraenkel & Simpson (1998), Ilie (2005)]:  $\sigma(n) < 2n$ .

So here is the problem:  $\sigma(n) \leq \rho(n) < ???$ 

# Hope:

By resolving the fundamental theoretical problem, we will (finally) understand periodicity better and therefore be able to design a simple direct all-runs algorithm.

# In order that $\rho(n) > n$ , it is necessary that two runs (squares) occur at some positions i — we therefore suppose that two squares occur at iand seek to restrict the squares that can occur in a neighbourhood of i. There seems to be only one result of this kind:

**Lemma 1** [Lothaire (2002)] Let  $u^2$  be a repetition, and suppose  $w \neq u^k$  for any  $k \geq 1$ . If  $u^2$  is a prefix of  $w^2$ , in turn a proper prefix of  $v^2$ , then  $w \leq v-u$ .

(We use x for the string, x for its length.)

**Definition 2** A square  $u^2$  is said to be irreducible if u is not a repetition.

**Definition 3** A square  $u^2$  is said to be regular if no prefix of u is a square.

**Definition 4** A square  $u^2$  is said to be minimal if no proper prefix of  $u^2$  is a square.

**Lemma 5** If  $u^2$  is minimal, then  $u^2$  is regular; if  $u^2$  is regular, then  $u^2$  is irreducible.

**Lemma 6** If  $v^2$  is irreducible with regular proper prefix  $u^2$ , then

$$v > \max\{u+1, 3u/2\}.$$

**Lemma 7** If  $x = v^2$  is irreducible with regular proper prefix  $u^2$ , v < 2u, then

 $x = u_1 u_2 u_1 u_1 u_2 u_1 u_2 u_1 u_1 u_2,$ 

where  $u_1 = 2u - v, u_2 = 2v - 3u$ .

Pièce de Résistance:

**Lemma 8** (NPL) If x has regular prefix  $u^2$  and irreducible prefix  $v^2$ , u < v < 2u, then for every  $w \in u+1..v-1$  and for every  $k \in 0..v-u-1$ , x[k+1..k+2w] is not a square.

Case I (easy case: k small):



#### <u>Notes</u>

• Lemma 8 extends in an obvious way to runs.

• Lemma 8 applies only trivially to the cases u = 1 and u = 2: for u = 1,  $v \ge 3 > 2u$ , while for u = 2,  $v \ge 5 > 2u$ , contrary to the requirement of the lemmas that v < 2u.

• For all  $u \ge 3$ , the hypothesis of the lemma can be satisfied — for example, if u = aba of length 3, v may be abaab of length  $5 < 2 \times 3$ .

• Thus Lemma 8 can be thought of as restricting the occurrences of squares when the second square at some position is small.

• We have extended to cases where  $w \in v - u + 1...u - 1$ .

• Our next project is to apply the NPL!