

Journal of Integer Sequences, Vol. 21 (2018), Article 18.5.6

# Computation of Maximal Determinants of Binary Circulant Matrices

Richard P. Brent Mathematical Sciences Institute Australian National University Canberra, ACT 2601 Australia circulants@rpbrent.com

Adam B. Yedidia Electrical Engineering and Computer Science Massachusetts Institute of Technology Cambridge, MA 02139 USA adamyedidia@gmail.com

#### Abstract

We describe algorithms for computing maximal determinants of binary circulant matrices of small orders. Here "binary matrix" means a matrix whose elements are drawn from  $\{0, 1\}$  or  $\{-1, 1\}$ . We describe efficient parallel algorithms for the search, using Duval's algorithm for generation of necklaces and the well-known representation of the determinant of a circulant in terms of roots of unity. Tables of maximal determinants are given for orders  $\leq 52$ . Our computations extend earlier results and disprove two plausible conjectures.

# 1 Introduction

A *circulant* matrix  $A = (a_{j,k})$  of order n is an  $n \times n$  matrix whose elements  $a_{j,k}$  depend only on  $(k-j) \mod n$ . Thus, an  $n \times n$  circulant is a matrix of the form  $A = (a_{(k-j) \mod n})_{0 \le j,k < n}$ . Circulants arise in various applications in signal processing and combinatorics, and have a close connection with Fourier transforms. The set of all circulants of order n (with elements in some fixed ring R) form a commutative algebra, since the sum and product of two circulants is a circulant, and it is easy to see that multiplication of circulants is commutative.

We write  $\operatorname{circ}(a_0, a_1, \ldots, a_{n-1})$  for the circulant  $(a_{(k-j) \mod n})_{0 \le j,k < n}$  whose first row is  $(a_0, a_1, \ldots, a_{n-1})$ .

By a *binary* matrix we mean a matrix whose elements are in one of the sets  $S_{01} := \{0, 1\}$  or  $S_{\pm 1} := \{-1, 1\}$ . It will be clear from the context which of these two cases is being considered. A *binary circulant* is a circulant matrix whose elements are in  $S_{01}$  or  $S_{\pm 1}$ .

There is a natural correspondence between the integers  $\{0, 1, \dots, 2^n - 1\}$  and the binary circulant matrices of order n. If  $N \in \{0, 1, \dots, 2^n - 1\}$  has the representation

$$N = \sum_{j=0}^{n-1} 2^{n-1-j} b_j,$$

so may be written in binary as  $b_0 \dots b_{n-1}$ , we associate N with  $\operatorname{circ}(a_0, \dots, a_{n-1})$ , where  $a_j = b_j$  in the case of  $S_{01}$ , and  $a_j = 2b_j - 1$  in the case of  $S_{\pm 1}$ .

The maximal determinant problem is concerned with the maximal value of  $|\det A|$  for an  $n \times n$  binary matrix A. The Hadamard bound [20] states that, in the case of binary matrices A over  $\{\pm 1\}$ , we have

$$|\det A| \le n^{n/2}.\tag{1}$$

Moreover, Hadamard's inequality is sharp for infinitely many n, for example, powers of two (Sylvester [38]), or n of the form q + 1 where  $q \equiv 3 \pmod{4}$  and q is a prime power (Paley [32]).

There is a well-known connection between the determinants of  $\{0, 1\}$ -matrices of order n and  $\{\pm 1\}$ -matrices of order n + 1. This implies that an  $(n + 1) \times (n + 1)$   $\{\pm 1\}$ -matrix always has determinant divisible by  $2^n$ . See Neubauer and Radcliffe [28] for details. We give an example with n = 3, starting with an  $n \times n$  binary matrix B and ending with an  $(n + 1) \times (n + 1)$   $\{\pm 1\}$ -matrix A, with det  $A = 2^n \det B$ .

The doubling step is the only step where the determinant changes, and there it is multiplied by  $2^{n}$ .

Thus, Hadamard's bound (1) gives the bound

$$|\det B| = 2^{-n} |\det A| \le 2^{-n} (n+1)^{(n+1)/2},$$
(2)

which applies for all  $\{0, 1\}$ -matrices B of order n. We shall refer to both (1) and (2) as Hadamard's inequality, since it will be clear from the context which inequality is intended.<sup>1</sup>

The mapping from  $\{0, 1\}$ -matrices to  $\{\pm 1\}$ -matrices is reversible if we are allowed to normalize the first row and column of the  $\{\pm 1\}$ -matrix by changing the signs of rows/columns as necessary.

The transformation illustrated above (or its reverse) does *not* preserve any circulant structure.

Hadamard matrices are square matrices with entries in  $S_{\pm 1}$  and mutually orthogonal rows. The order of a Hadamard matrix is 1, 2, or a multiple of 4. It is not known whether a Hadamard matrix of order 4k exists for every positive integer k — this is the Hadamard conjecture.

Various constructions for Hadamard matrices use circulant matrices. For example, the first Paley construction (Paley [32]) uses a circulant matrix of order p, where p is a prime,  $p \equiv 3 \pmod{4}$ , to construct a Hadamard matrix of order p + 1. (The Paley construction also works for prime powers, e.g.,  $27 = 3^3$ , but does not involve circulants in such cases.) Fletcher, Gysin and Seberry [16] use two circulants and a border of width two to construct Hadamard matrices. The Williamson construction (Williamson [40]) requires four matrices  $A, \ldots, D$  which satisfy certain conditions, and for computational reasons these matrices are usually taken to be circulants.

Circulant matrices also play an important role in noisy convolutional Gaussian channels. Given a channel in which the output vector is given by the convolution of the input vector with a chosen mask vector, in the presence of additive Gaussian noise, the choice of mask that maximizes the mutual information of the channel in high-SNR regimes is the first row of a  $\{0, 1\}$ -circulant with near-flat Fourier spectrum, and this circulant is often one with maximal or close to maximal determinant. This has important applications in X-ray and gamma ray astronomy, optics, and computational imaging [1, 2, 11, 15, 25, 42].

It is well-known that the (unnormalized) eigenvectors of  $\operatorname{circ}(a_0, \ldots, a_{n-1})$  are given by  $v_j = (1, \omega^j, \omega^{2j}, \ldots, \omega^{(n-1)j})^T$ ,  $0 \leq j < n$ , where  $\omega$  is a primitive *n*-th root of unity. For example, in  $\mathbb{C}$  we can take  $\omega := \exp(2\pi i/n)$ . It follows that the eigenvalues are

$$\lambda_j = a_0 + a_1 \omega^j + \dots + a_{n-1} \omega^{(n-1)j}, \ 0 \le j < n,$$
(3)

and the determinant is

$$\prod_{j=0}^{n-1} \lambda_j = \prod_{j=0}^{n-1} f(\omega^j),$$
(4)

<sup>&</sup>lt;sup>1</sup>In fact, Hadamard in [20] proved a more general inequality than (1), and as far as we are aware he never stated (2) explicitly. A simple proof of (1) is given by Cameron [9].

where

$$f(z) := \sum_{k=0}^{n-1} a_k z^k.$$

The polynomial f(z) is called the *associated polynomial* of the circulant. Also, f(z) is called a *Littlewood polynomial* if the coefficients  $a_k \in \{\pm 1\}$ , and a *Newman polynomial* if the  $a_k \in \{0, 1\}$  and  $a_0 = 1$ .

If  $A = \operatorname{circ}(a_0, \ldots, a_{n-1})$  is nonsingular, then (4) gives

$$\frac{\log|\det A|}{n} = \frac{1}{n} \sum_{j=0}^{n-1} \log|f(e^{2\pi i j/n})|$$

This may be regarded as a discrete analogue of the *Mahler measure* [36]

$$m(f) := \int_0^1 \log |f(e^{2\pi i t})| \, \mathrm{d}t \, .$$

Using (4) to compute det A for a circulant matrix A takes  $O(n^2)$  arithmetic operations, whereas Gaussian elimination does not take advantage of the circulant structure and takes of order  $n^3$  operations. If we are considering binary matrices, whose determinants are integers, it is necessary to perform the operations in  $\mathbb{C}$  to sufficient precision to obtain a result with absolute error less than 1/2, so that the correct result can be found by rounding to the nearest integer. From the Hadamard bounds (1)–(2), this means that we may have to work with of order  $n \log n$  bits of precision.

To avoid the problem of rounding errors altogether, we can work over a finite field. If p is a prime such that  $p \equiv 1 \pmod{n}$ , and  $\rho$  is a primitive root (mod p), then<sup>2</sup>

$$\omega := \rho^{(p-1)/n} \bmod p$$

is a primitive *n*-th root of unity in the finite field  $F_p$ , and we can use (4) to compute  $(\det A) \mod p$ . If U is an upper bound on  $|\det A|$ , and  $p \ge 2U + 1$ , then the result is sufficient to determine det A. Thus, if we use a Hadamard bound for U, the prime p should have of order  $n \log n$  bits. Alternatively, we could use several smaller primes with a sufficiently large product, and reconstruct the result using the Chinese Remainder Theorem.<sup>3</sup>

<sup>&</sup>lt;sup>2</sup>It is not necessary to know a primitive root (mod p). We can choose a random a, compute  $\omega = a^{(p-1)/n}$ , and check if  $1, \omega, \omega^2, \ldots, \omega^{n-1}$  are distinct (mod p). If not, reject  $\omega$  and repeat with another random a. In this way we work in a (small) group of order n, instead of a (large) group of order p-1, and there is no need to factor p-1. The expected number of iterations is  $n/\phi(n) = O(\log \log n)$ .

<sup>&</sup>lt;sup>3</sup>Tests indicate that, at least for  $n \leq 50$ , it is faster to use a single prime. One reason for this is that the value det A needs to be reconstructed for each circulant A, so the cost of the reconstruction steps is not negligible.

### 2 Lyndon words and necklaces

The usual definition of a Lyndon word is a nonempty string that is strictly smaller in lexicographic order than all of its proper rotations. Thus, the first six Lyndon words over  $S_{01}$  are 0, 1, 11, 101, 111, and 1111. Lyndon words were introduced by Shirshov [34] (who called them "regular words") and Lyndon [26] (who called them "standard lexicographic sequences").

Since we consider words of a fixed length n, it is convenient to use the concept of a (binary) necklace. We say that  $w = w_0 \dots w_{n-1}$  is a necklace of length n if w is not larger (in the lexicographic order) than any of its rotations. This corresponds to Duval's "representative of a class of words of length n" [12, (3) on p. 258], where two words are said to be in the same class if one is a rotation of the other.

For example, according to our definition, the six necklaces of length 4 over  $S_{01}$  are 0000, 0001, 0011, 0101, 0111, and 1111. It can be seen that, if we strip off leading zeros, we obtain the first six Lyndon words. Thus, the concepts of "Lyndon word" and "necklace" are closely related, and algorithms for one may often by modified to apply to the other.

The number K(n) of necklaces of length n over a binary alphabet is

$$K(n) = \frac{1}{n} \sum_{d|n} 2^{n/d} \phi(d) = \frac{2^n}{n} + O\left(\frac{2^{n/2}}{n}\right),$$
(5)

where  $\phi$  is Euler's phi function. K(n) is tabulated in OEIS <u>A000031</u>.

If A is a circulant, then  $|\det A|$  is invariant under rotations of the first row  $(a_0, \ldots, a_{n-1})$ . Thus, when searching for circulants of order n with maximal determinants, it is sufficient to consider circulants whose first row is a necklace of length n. From (5), this saves a factor of approximately n.

In our computations we use two nontrivial algorithms related to Lyndon words/necklaces. One is the algorithm of Booth [5], which determines in linear time if a word  $w = w_0 \dots w_{n-1}$ is in fact a necklace.<sup>4</sup> Booth's algorithm is closely related to the initial phase of the Knuth, Morris and Pratt fast pattern-matching algorithm [22].

The other algorithm that we use is Duval's algorithm [12] which, given a necklace of length n, returns the next necklace (of length n) in lexicographic order<sup>5</sup>, in amortized (i.e., average) constant time, see [4]. Using Duval's algorithm we can cycle through all necklaces of length n in time  $O(2^n/n)$ .

Other algorithms could be used. For example, Shiloach [33] gives an algorithm that reduces the number of comparisons used by Booth's algorithm. We used Booth's algorithm because it was sufficient for our purposes, and simpler to implement than Shiloach's algorithm. The overall complexity of our algorithms is dominated by the time required to evaluate determinants using (4), not by the time required to check or enumerate necklaces.

<sup>&</sup>lt;sup>4</sup>We use a simplified version of Booth's algorithm since we do not need to know the rotation that would convert w into a necklace.

<sup>&</sup>lt;sup>5</sup>Duval's paper [12] considers Lyndon words but, using [12, comment (3) on p. 258], we easily get a similar algorithm for necklaces.

#### **3** Fast evaluation of circulant determinants

Standard algorithms of linear algebra, such as Gaussian elimination, require of order  $n^3$  operations to evaluate the determinant of an  $n \times n$  matrix A. Using formula (4), this can be reduced to order  $n^2$  if A is a circulant. In fact, using the fast Fourier transform (FFT),  $O(n \log n)$  operations suffice.

However, in our application we can do even better. Because Duval's algorithm takes constant time (on average), the number of symbols that are changed as we go from one necklace to the next is O(1) on average.<sup>6</sup> Thus, each  $\lambda_j$  value given by (3) can be updated in O(1) operations (on average), and the determinant, given by (4), can be updated with O(n)operations (on average). Since there are  $\simeq 2^n/n$  necklaces of length n, the computation of all the relevant determinants can be done with  $O(2^n)$  operations. The cost of precomputing a table of powers  $\omega^{jk}$  ( $0 \le j, k < n$ ) is negligible.

Note that we used the term "operations" rather than "time", because the arithmetic operations need to be performed using of order  $n \log n$  bits of precision, as noted above. Thus, the overall complexity is  $O(2^n M(n \log n))$ , where M(N) is the time required to multiply N-bit numbers.

In theory, a slightly better complexity can be attained by using several small primes and reconstructing the result via the Chinese Remainder Theorem. However, the cost of  $O(2^n/n)$  reconstructions must be taken into account. In practice, *n* is never large, because of the exponentially growing factor  $2^n$  in the complexity, so the difference between the two approaches is essentially an implementation-dependent constant factor.

#### 4 Parallel algorithms

Suppose we wish to use  $P \geq 1$  processors in parallel. If the  $K = K(n) \simeq 2^n/n$  necklaces of length n are  $W_0 = 0 \dots 0, W_1, W_2, \dots, W_{K-1} = 1 \dots 1$ , we would like processor q ( $0 \leq q < P$ ) to compute the determinants corresponding (approximately) to necklaces  $W_{\lfloor qK/P \rfloor}, \dots, W_{\lfloor (q+1)K/P \rfloor - 1}$ . The problem is how to determine the starting point for processor q, without enumerating  $W_1, W_2, \dots, W_{\lfloor qK/P \rfloor}$ . Kociumaka et al. [23] sketch a deterministic polynomial-time algorithm for this problem, but it is very complicated. We used a simpler, randomized algorithm.<sup>7</sup>

The idea is to take a random sample of T necklaces, each of length n. Sort the sample, and then divide it into P equal-sized segments. Modify the initial segment to start with  $W_0 = 0 \dots 0$  and the final segment to end with  $W_{K-1} = 1 \dots 1$ . Thus, each processor has approximately  $\mu = K/P$  of words to process. Also, we know the necklace starting each segment, so we can use Duval's algorithm to enumerate all necklaces in a segment.

<sup>&</sup>lt;sup>6</sup>We find experimentally that the mean number of symbols changed is  $2 + O(n/2^n)$  as  $n \to \infty$ . The limiting value 2 is the same as the mean number of bits changed when counting up in binary.

<sup>&</sup>lt;sup>7</sup>A similar algorithm, although not specifically intended for parallel computation, is described by Briggs and Ying [7]. For related references, see Ghosh and Pasupathy [17].

How large does the sample size T need to be? Suppose the procedure just described gives the q-th processor  $S_q$  necklaces to process, where  $0 \le q < P$  and  $S_0 + \cdots + S_{P-1} = K = P\mu$ . Define  $\varepsilon_q$  by  $S_q = (1 + \varepsilon_q)\mu$ , so  $\varepsilon_q$  measures the relative difference between  $S_q$  and the mean  $\mu$ . Using extreme-value theory it can be shown that, as  $\min(P, T/(P \ln P), 2^n/T) \to \infty$ , we have

$$\mathbb{E}[\max\{\varepsilon_0,\ldots,\varepsilon_{P-1}\}] \sim \sqrt{\frac{2P\ln P}{T}}.$$
(6)

Simulations show that (6) gives a reasonable approximation even for small P, provided  $2^n \ge T \ge P > 1$ . Thus, for a given (one-sided) tolerance  $\varepsilon > 0$ , we should take

$$T \approx \frac{2P\ln P}{\varepsilon^2} \,. \tag{7}$$

With this choice <sup>8</sup> of T we can expect that, on average, the slowest processor will take only about  $1 + \varepsilon$  times as long as the average processor.<sup>9</sup>

We now describe how to randomly and uniformly sample the set of all necklaces of length n. Generate a random binary string of length n, and test (using Booth's algorithm) if it corresponds to a necklace. If so, accept the string. Otherwise, reject the string and try again.<sup>10</sup> This process is repeated until we have the desired number T of necklaces (not necessarily distinct). Clearly each necklace is equally likely to appear in the final list. Since the probability of a random binary string of length n being a necklace is  $K/2^n$ , the expected number of random binary strings that are needed is  $T/(K/2^n) = nT(1 + O(2^{-n/2}))$ . The algorithm that we have described is an example of Von Neumann's rejection method [29]. Other examples may be found in Devroye's book [10].

For  $n \ge 2$  we can speed up the generation of random necklaces, if we exclude the special cases  $0 \dots 0$  and  $1 \dots 1$ , and take advantage of the fact that all other necklaces have the form  $0x \dots y1$ , where  $x, \dots, y \in \{0, 1\}$ .

#### 5 Computational results

Our computations extend some entries in the OEIS [30]. Tables 1–2 give computational results for the maximal determinants  $D_{01}(n)$  of  $\{0,1\}$ -circulants of orders  $n \leq 52$ . The third column of each table gives the ratio  $D_{01}(n)/U_{01}(n)$ , where  $D_{01}(n)$  is the maximum of  $|\det(B)|$  for  $\{0,1\}$ -circulants B of order n, and  $U_{01}(n)$  is an upper bound on  $D_{01}(n)$ .

Similarly, Tables 3–4 give computational results for the maximal determinants  $D_{\pm 1}(n)$  of  $\{\pm 1\}$ -circulants of orders  $n \leq 52$ . Here the third column is the ratio  $D_{\pm 1}(n)/U_{\pm 1}(n)$ ,

<sup>&</sup>lt;sup>8</sup>In fact, our program used simply T = 4000P, equivalent to taking  $\varepsilon = \sqrt{\ln(P)/2000}$  in (7). We had  $P \leq 416$ , so  $\varepsilon \leq \sqrt{\ln(416)/2000} < 0.06$ .

<sup>&</sup>lt;sup>9</sup>This ignores any random variations in speed due to other users in a shared multi-processor computer system. In practice such variations may be larger than the variations caused by random sampling.

<sup>&</sup>lt;sup>10</sup>It is not sufficient to rotate the string until we obtain a necklace. This would not give each necklace an equal probability of selection. Consider, for example, the case n = 2, where the three necklaces 00, 01, and 11 would be selected with probabilities 1/4, 1/2, and 1/4 respectively.

where  $U_{\pm 1}(n)$  is an upper bound on  $D_{\pm 1}(n)$ . In Tables 3–4 we scale the determinants of  $\{\pm 1\}$ -circulants by dividing by the known factor  $2^{n-1}$ . In the last column of Table 3, "-" and "+" are used as abbreviations for -1 and +1 respectively.

The bounds  $U_{01}(n)$  and  $U_{\pm 1}(n)$  are defined as follows. Let

$$H_{BE}(n) := \begin{cases} n^{n/2}, & \text{if } n \equiv 0 \pmod{4}; \\ 2(n-1)(n-2)^{(n-2)/2}, & \text{if } n \equiv 2 \pmod{4}; \\ (2n-1)^{1/2}(n-1)^{(n-1)/2}, & \text{otherwise.} \end{cases}$$
(8)

Then  $H_{BE}(n)$  is an upper bound on  $|\det A|$  for  $\{\pm 1\}$ -matrices A of order n. The case  $n \equiv 0 \pmod{4}$  is due to Hadamard [20]; the case  $n \equiv 2 \pmod{4}$  is due to Ehlich [13] and Wojtas [41]; and the remaining case (n odd) is due to Barba [3], Ehlich [13], and Wojtas [41]. We do not use Ehlich's slightly sharper, but more complicated, bound that applies when  $n \equiv 3 \pmod{4}$ . For this bound, see Ehlich [14] or Orrick [31].

In view of the discussion in  $\S1$ , we take

$$U_{\pm 1}(n) := 2^{n-1} \lfloor \mathcal{H}_{\rm BE}(n)/2^{n-1} \rfloor$$
(9)

and

$$U_{01}(n) := \lfloor H_{BE}(n+1)/2^n \rfloor.$$
(10)

It is an open question whether  $D_{\pm 1}(n)$  attains the bound  $U_{\pm 1}(n)$  for any n > 13. (If we restrict attention to the cases  $n \equiv 0 \pmod{4}$ , this is the *circulant Hadamard* problem.) On the other hand,  $D_{01}(p) = U_{01}(p)$  for all primes  $p \equiv 3 \pmod{4}$ . This follows from the first *Paley construction* [32], which constructs a Hadamard matrix of order p + 1 with a circulant submatrix of order p. Inspection of Tables 1–2 reveals that  $D_{01}(n) = U_{01}(n)$  in some other cases, specifically  $n \in \{1, 2, 4, 15, 35\}$ .

Table 2 extends the list of  $D_{01}(n)$  values given for  $n \leq 37$  in OEIS <u>A086432</u> and the associated b-file. Table 4 extends the list of  $D_{\pm 1}(n)/2^{n-1}$  values given for  $n \leq 28$  in OEIS <u>A215897</u>. This implies a corresponding extension for OEIS <u>A215723</u>, which lists the unscaled values  $D_{\pm 1}(n)$ .

As an indication of the time required to compute the tables, we note that the computation of  $D_{01}(52)$  using our parallel program (implemented in C using GMP [19]) took 11 processoryears using 128 Intel Xeon3 (2.2GHz) and 224 Xeon4 (2.6GHz) processors. The computation time for order n was roughly proportional to  $2^n$ .

For verification, all the values given in the tables for orders n < 50 were computed at least twice, using different programs and/or different prime moduli p. No discrepancies were found.

In Sections 6–8 we discuss some plausible conjectures that motivated our computations.

### 6 Conjecture A

From the third column of Table 1, the determinant of a  $\{0, 1\}$ -circulant can attain the upper bound  $U_{01}(n)$  in the cases  $n \in \{1, 2, 3, 4, 7, 11, 15, 19, 23\}$ . The Paley construction explains this for n = 3, 7, 11, 19, 23, and larger cases where n is a prime and  $n \equiv 3 \pmod{4}$ . However, it does not explain the case  $n = 15 = 3 \times 5$ . Also, the upper bound is not attained for  $n = 27 = 3^3$ . Thus, a plausible conjecture is that the upper bound can be attained whenever  $n \equiv 3 \pmod{4}$  is the product of at most two distinct primes. Support is provided by the computation for  $n = 35 = 5 \times 7$ , since  $D_{01}(35) = U_{01}(35)$ .

Our computation for n = 39 disproves this conjecture, since  $39 = 3 \times 13$  is a product of two distinct primes, but  $D_{01}(39) < U_{01}(39)$ . Another counter-example is  $n = 51 = 3 \times 17$ . We find that  $D_{01}(51) < U_{01}(51)/2$ .

After our computations were completed, we found an explanation for the cases n = 15and n = 35. In each case n has the form p(p+2), where p and p+2 are both prime. Such n are covered by case (2) of the following theorem, which we quote (with a change in notation) from Kotsireas et al. [24]. Note that a "circulant core" of order n refers to a  $\{0, 1\}$ -circulant matrix of order n which can be used to construct a Hadamard matrix of order n + 1 using the correspondence between  $\{0, 1\}$ -matrices and  $\{\pm 1\}$ -matrices described in §1.

**Theorem 1** (Hadamard circulant core construction). A Hadamard matrix of order n + 1with circulant core of order n exists if

- (1)  $n \equiv 3 \pmod{4}$  is a prime;
- (2) n = p(p+2), where p and p+2 are prime;
- (3)  $n = 2^k 1$ , where k is a positive integer; or
- (4)  $n = 4k^2 + 27$ , where k is a positive integer and n is a prime.

*Proof.* Case (1) is due to Paley [32]; case (2) is due to Stanton and Sprott [37] and also Whiteman [39]; case (3) is due to Singer [35]; and case (4) is due to Hall [21, Theorem 2.2].  $\Box$ 

Hall [21, p. 980] remarks that case (4) is subsumed by case (1), since  $4k^2 + 27 \equiv 3 \pmod{4}$ , but we mention case (4) since Hall's construction is different from that of Paley.

We do not know if the list given by Theorem 1 is exhaustive. The computational results given in Tables 1–2 show that, for  $1 \le n \le 52$ , only those *n* given by Theorem 1 can provide a Hadamard matrix of order n + 1 with a circulant core. Also, a circulant  $\{0, 1\}$ -matrix of order  $n \le 52$  can achieve the upper bound (10) if and only if  $n \le 4$  or *n* satisfies condition (1), (2) or (3) of Theorem 1.

# 7 Conjecture B, case [0,1]

When considering maximal determinants of matrices with real elements in the interval [0, 1], we can see that the maximum occurs at extreme points of the polytope.<sup>11</sup> To prove this, we

<sup>&</sup>lt;sup>11</sup>This is already implicit in Hadamard [20].

need only note that the determinant det A of a square matrix  $A = (a_{j,k})$  is a linear function of each variable  $a_{j,k}$  considered separately. Thus, if a local maximum of det A occurs for some  $a_{j,k} \in (0,1)$ , we can replace  $a_{j,k}$  by (at least one of) 0 or 1 without decreasing det A.

This argument does not apply if A is restricted to be a circulant of order n > 1, because then the free parameters are just the elements  $a_0, \ldots, a_{n-1}$  of the first row of A, and det A is not a linear function of each  $a_j$  considered separately. For example, if n = 2 we have det  $A = a_0^2 - a_1^2$ . Nevertheless, inspection of small cases suggests the conjecture that the maximum of  $|\det A|$  occurs at extreme points of the *n*-dimensional polytope.

We were unable to prove the conjecture, so wrote a program to check it numerically, and found that, in general, the conjecture is false.

The idea is as follows. Consider all possible circulants A of order n with entries in  $\{0, 1\}$ . If det  $A = \pm D_{01}(n)$ , check if a small perturbation of  $a_0$  towards the interior of the polytope would increase  $|\det A|$ . Although such behaviour is rare, it does occur.<sup>12</sup>

The smallest examples occur for n = 9. Consider  $A = \operatorname{circ}(a_0, \ldots, a_8)$  with  $(a_0, \ldots, a_8) = (0, 0, 0, 1, 1, 1, 1, 0, 1)$ . We have det  $A = 95 = D_{01}(9)$ , but  $\partial \det A/\partial a_0 = 9$ . If  $a_0 = \varepsilon$  for some small  $\varepsilon$ , then  $|\det A(\varepsilon)| = 95 + 9\varepsilon + O(\varepsilon^2)$ , so  $|\det A(\varepsilon)| > 95$  for sufficiently small  $\varepsilon > 0$ . In fact,  $|\det A(0.241)| > 96.757$ .

For n = 10, an example is A = circ(0, 0, 1, 0, 0, 1, 1, 1, 1, 0), det A = 275. Replacing  $a_0$  by  $\varepsilon = 0.112$ , we obtain det  $A(\varepsilon) > 279.4$ .

We found examples of such behaviour for n = 9, 10, and no other n up to the limit of Table 2. However, there is a different class of examples that occur when n = 4k + 1 > 5 is a prime, e.g., n = 13, 17, 29, 37, 41, etc. For this class we make a small modification to the Uniformly Redundant Arrays (URAs) of [8, 15], which are equivalent to Abelian difference sets [21].<sup>13</sup> Define

$$A_n(x) := \operatorname{circ}\left(x, \frac{1+\chi(1)}{2}, \frac{1+\chi(2)}{2}, \dots, \frac{1+\chi(n-1)}{2}\right)$$

where  $\chi$  is a quadratic character, defined by the Legendre symbol

$$\chi(j) = \left(\frac{j}{n}\right) := \begin{cases} +1, & \text{if } j \text{ is a quadratic residue modulo } n, j \not\equiv 0 \pmod{n}; \\ -1, & \text{if } j \text{ is a quadratic non-residue modulo } n; \\ 0, & \text{if } j \equiv 0 \pmod{n}. \end{cases}$$

Then  $A_n(0)$  corresponds to a 1-D URA, but det  $A_n(0)$  is not generally maximal in the class of circulant determinants. However, det  $A_n(\frac{1}{2})$  may be larger than the corresponding entry in Tables 1–2. It may be shown<sup>14</sup> that, for n = 4k + 1 an odd prime,

$$\det A_n(x) = (x+2k)(x^2 - x - k)^{2k}.$$
(11)

<sup>&</sup>lt;sup>12</sup>For reasons of efficiency, our program takes as input a list (generated during the computation of Tables 1–2) of necklaces that define circulants A with maximal  $|\det A|$ , then considers all possible rotations of these circulants.

<sup>&</sup>lt;sup>13</sup>Our construction is also close to the "modified" URAs (MURAs) of [18].

<sup>&</sup>lt;sup>14</sup>The proof uses the identity  $A_n(0)^2 + A_n(0) = k(I+J)$ .

In particular, det  $A_n(0) = 2k^{2k+1}$ , det  $A_n(1) = (2k+1)k^{2k}$ , and

$$\det A_n(\frac{1}{2}) = 2^{-n} n^{(n+1)/2}.$$

It may be verified numerically that det  $A_n(\frac{1}{2})$  exceeds the maximal determinant given in Tables 1–2 for n = 13, 17, 29, 37, and 41. The next possibility, n = 53, is beyond the range of Table 2.

We observe that the maximum of det  $A_n(x)$  for  $x \in [0, 1]$  is not at  $x = \frac{1}{2}$ . One can show, by logarithmic differentiation of (11), that a local maximum occurs at

$$x = x_k := \frac{\sqrt{1+4k^2+1-2k}}{2} = \frac{1}{2} + \frac{1}{8k} + O(k^{-3}),$$

and

$$\max_{0 \le x \le 1} \det A_n(x) = \det A_n(x_k) = \det A_n(\frac{1}{2}) \left( 1 + \frac{1}{8kn} + O(k^{-4}) \right).$$

For example, if k = 3, n = 13, we have  $x_3 = (\sqrt{37} - 5)/2 \approx 0.5414$ , and  $U_{01}(13) = 9477 > \det A_{13}(x_3) \approx 7684.16 > \det A_{13}(\frac{1}{2}) \approx 7659.73 > D_{01}(13) = 6561 > \det A_{13}(1) = 5103 > \det A_{13}(0) = 4374$ .

# 8 Conjecture B, case [-1, 1]

Replacing [0,1] by [-1,1], we find analogous behaviour to that described in §7, for n = 2, 9, 10, 11, 18, 22, and no other n up to the limit of Table 4.

The case n = 2 is trivial because, for circulants of order 2 over  $S_{\pm 1}$ , we necessarily have det A = 0 at the extreme points  $(a_0, a_1) = (\pm 1, \pm 1)$ .

The other cases are non-trivial. For example, if n = 9, consider

$$A(\varepsilon) := \operatorname{circ}(1 - \varepsilon, 1, -1, 1, -1, -1, 1, 1, 1).$$

We find that

$$\det A(\varepsilon) = 6912 + 4608\varepsilon + O(\varepsilon^2),$$

so sufficiently small  $\varepsilon > 0$  gives det  $A(\varepsilon) > 6912 = D_{\pm 1}(9)$ . Indeed, we can take  $\varepsilon = 1$ , as det A(1) = 8582 > 6912.

If n = 10, we find that

det circ
$$(1 - \varepsilon, -1, 1, 1, -1, -1, -1, -1, -1, -1) = -(22528 + 2560\varepsilon + O(\varepsilon^2)),$$

and

$$\det \operatorname{circ}(-1 + \varepsilon, -1, -1, 1, -1, 1, 1, -1, -1, -1) = 22528 + 7680\varepsilon + O(\varepsilon^2),$$

so in both cases a sufficiently small  $\varepsilon > 0$  disproves the conjecture. A different type of exceptional case is illustrated by

$$A(x) := \operatorname{circ}(x, -1, 1, -1, 1, 1, -1, -1, -1, -1),$$

where we find that  $\det A(x)$  is an even polynomial in x, and

$$-\det A(0) = 33489 > -\det A(\pm 1) = 22528 = D_{\pm 1}(10).$$

Similarly, for order 22, consider

Then

$$-\det A(0) = 216409254831025 > -\det A(\pm 1) = 215055782117376.$$

Since 215055782117376 =  $D_{\pm 1}(22) = 2^{21} \times 102546588$  (see Table 3), we have  $|\det A(0)| > D_{\pm 1}(22)$ .

Our search was not exhaustive, so there may be other n within the range of Tables 3–4 for which the maximum determinant does not occur at an extreme point of  $[-1, 1]^n$ .

#### 9 Remarks on periodic autocorrelations

It is hard to discern a pattern in the lex-least words given in Tables 1–4. It seems more fruitful to consider the *periodic autocorrelations* of the first rows of the corresponding circulants. Equivalently, we can consider the first rows of the *Gram matrices*  $G = A^T A$ , where A is the relevant circulant.

In the case of (0, 1)-circulants, it can be useful to map  $(0, 1) \mapsto (-1, 1)$ , and consider the first row of  $G' = (2A - J)^T (2A - J)$ . Provided n > 4, the upper bound is achieved in Tables 1–2 if and only if the first row of G' is  $(n, -1, -1, \ldots, -1)$ . See, for example, MacWilliams and Sloane [27].

In some cases the maximal determinants given in Tables 1–4 have only small prime factors. For example, the entry for n = 52 in Table 4 factors as  $2^{49} \times 3^{24} \times 5^4$ , and this can be explained if we observe that the first row of G is  $(52, 0, 0, 0, 4, \ldots, 0, 0, 0, 4, 0, 0, 0)$ . Thus, we can write  $G = 52I + 4E^4 + 4E^8 + \cdots + 4E^{48}$ , where E is the "circular shift" matrix. Similarly, the entry for n = 48 in Table 4 is  $2^{49} \times 3^6 \times 5^{12}$ , and here  $G = 48I + 4E^{12} + 8E^{24} + 4E^{36}$ .

#### 10 Acknowledgements

We thank Jörg Arndt for correcting our terminology, Alex Arkhipov for his helpful comments about Hadamard matrices with circulant cores and related group theory, and the authors of Magma [6] and GMP [19] for their invaluable software. An anonymous referee helped us to clarify several points in §2 and §4. Computing resources were provided by the Australian National University and the University of Newcastle (Australia). The first author was supported in part by Australian Research Council grant DP140101417.

# 11 Appendix: tables of maximal determinants

order	maximal	ratio	lex-least	lex-least	
n	determinant	$D_{01}(n)/$	word	word	
	$D_{01}(n)$	$U_{01}(n)$	(decimal)	$(\text{over } \{0,1\})$	
1	1	1.0000	1	1	
2	1	1.0000	1	01	
3	2	1.0000	3	011	
4	3	1.0000	7	0111	
5	4	0.8000	15	01111	
6	9	0.7500	11	001011	
7	32	1.0000	23	0010111	
8	45	0.6923	47	00101111	
9	95	0.6597	47	000101111	
10	275	0.6152	55	0000110111	
11	1458	1.0000	183	00010110111	
12	2240	0.6145	439	000110110111	
13	6561	0.6923	1527	0010111110111	
14	19952	0.5759	751	00001011101111	
15	131072	1.0000	2479	000100110101111	
16	214245	0.5691	2935	0000101101110111	
17	755829	0.6784	2935	00000101101110111	
18	2994003	0.6505	9903	000010011010101111	
19	19531250	1.0000	22427	0000101011110011011	
20	37579575	0.6010	28023	00000110110101110111	
21	134534444	0.6560	45999	000001011001110101111	
22	577397064	0.6178	117623	0000011100101101110111	
23	4353564672	1.0000	340831	00001010011001101011111	
24	10757577600	0.7060	843119	000011001101110101101111	
25	31495183733	0.5787	638287	0000010011011110101001111	

Table 1: Maximal determinants of  $\{0,1\}$ -circulants of order  $n \leq 25$ .

order	maximal	ratio to	lex-least word
n	determinant	upper bound	(decimal)
26	154611524732	0.5744	957175
27	738139162166	0.5442	1796839
28	3124126889325	0.6101	5469423
29	11937232425585	0.6069	6774063
30	65455857159975	0.6271	37463883
31	562949953421312	1.0000	77446231
32	1395230053365015	0.6148	47828907
33	5687258414265018	0.6123	196303815
34	30551195956571643	0.5827	95151003
35	300189270593998242	1.0000	1324935477
36	809028975189744400	0.6309	1822895095
37	3198686446402685263	0.5760	430812063
38	19288701806345611347	0.5825	2846677239
39	103227456252120723684	0.5161	10313700815
40	529663503370085366373	0.5885	6269629671
41	2311393009109010944326	0.5638	26764629467
42	15469925980869995489631	0.6023	22992859983
43	162805498773679522226642	1.0000	92035379515
44	402826140168935435652453	0.5245	162368181483
45	2268175963362305735661143	0.6192	226394696439
46	12738408112895861486972391	0.5307	631304341299
47	158993694406781688266883072	1.0000	4626135339999
48	483776963047101724429782080	0.6179	924925407055
49	2226275734022433928055705600	0.5715	1588449170843
50	15940963431893953997118039375	0.5992	5455102172067
51	86343902346653136953496818019	0.4706	12463552538547
52	471252255596620483490068604560	0.5013	23418838481755

Table 2: Maximal determinants of  $\{0, 1\}$ -circulants,  $25 < n \le 52$ .

order	maximal	ratio	lex-least	lex-least	
n	scaled  det	$D_{\pm}(n)/$	word	word	
	$D_{\pm 1}(n)/2^{n-1}$	$U_{\pm}(n)$	(decimal)	(over $\{\pm 1\}$ )	
1	1	1.0000	0	-	
2	0	0.0000	0		
3	1	1.0000	1	+	
4	2	1.0000	1	+	
5	3	1.0000	1	+	
6	4	0.8000	1	+	
7	8	0.6667	11	++	
8	18	0.5625	11	+++	
9	27	0.4154	11	+++	
10	44	0.3056	11	+++	
11	267	0.5973	39	+++	
12	1024	0.7023	83	++	
13	3645	1.0000	83	++	
14	6144	0.6483	83	++	
15	23859	0.6886	359	+-+++++++	
16	50176	0.3828	691	+++++++++++++++++++++++++++++++++++	
17	187377	0.4977	1643	+++++++++++++++++++++++++++++++++	
18	531468	0.4770	2215	++++++	
19	3302697	0.7176	9895	+	
20	10616832	0.5436	6483	+++-+++++++++++++++++++++++++++++	
21	39337984	0.6291	67863	++-++++	
22	102546588	0.5000	21095	+++++++++++++++++++++++++++++++++++	
23	568833245	0.6087	72519	+++-++-++-+++++++++++++++++++++++	
24	3073593600	0.7060	144791	+++++++++++++++++++++++++++++++++++	
25	8721488875	0.5724	108199	+++++++++++++++++++++++++++++++++++	

Table 3: Maximal scaled determinants of  $\{\pm 1\}$ -circulants of order  $n \leq 25$ .

order	maximal scaled det	ratio to	lex-least word
n	$D_{\pm 1}(n)/2^{n-1}$	upper bound	(decimal)
26	32998447572	0.6064	355463
27	164855413835	0.6125	604381
28	572108938470	0.4218	1289739
29	2490252810073	0.4863	1611219
30	10831449635712	0.5507	1680711
31	68045615234375	0.6520	6870231
32	282773291271138	0.5023	12817083
33	1592413932070703	0.7017	18635419
34	5234078743146888	0.5635	55100887
35	33374247484277975	0.6366	149009085
36	198124573871046186	0.6600	160340631
37	787413957917252603	0.6140	415804239
38	3195257068570067448	0.5754	829121815
39	22999238901574021485	0.6946	4737823097
40	117140061677844350646	0.5857	1446278811
41	536469708946538168543	0.5961	3001209959
42	2417648227367853639168	0.5897	19153917469
43	14611334654738350617599	0.5689	52222437727
44	65738632907943707712320	0.4038	20159598251
45	438910341492340511320163	0.5715	166482220965
46	2010768410464246499566152	0.5489	90422521191
47	12779930756727248097293989	0.5324	115099593371
48	1001929970810880000000000000000000000000000000	0.6302	242235026743
49	408375323859124630659059549	0.5216	1416138805685
50	2152519997519833685106486024	0.5526	2380679727935
51	14098690136202107270366810369	0.5300	2716242515341
52	99371059004238555166801920000	0.5416	1758408815375

Table 4: Maximal scaled determinants of  $\{\pm 1\}$ -circulants,  $25 < n \le 52$ .

### References

- J. G. Ables, Fourier transform photography: a new method for X-ray astronomy, Proc. Astron. Soc. Austral. 1 (1968), 172–173.
- [2] M. S. Asif, A. Ayremlou, A. Sankaranarayanan, A. Veeraraghavan, and R. Baraniuk, Flatcam: Thin, bare-sensor cameras using coded aperture and computation, *IEEE Trans. Comput. Imaging*, to appear. Preprint, 2015, available at http://arxiv.org/abs/1509.00116.

- G. Barba, Intorno al teorema di Hadamard sui determinanti a valore massimo, Giorn. Mat. Battaglini 71 (1933), 70–86.
- [4] J. Berstel and M. Pocchiola, Average cost of Duval's algorithm for generating Lyndon words, *Theoret. Comput. Sci.* **132** (1994), 415–425.
- [5] K. S. Booth, Lexicographically least circular substrings, *Inform. Process. Lett.* 10 (1980), 240–242.
- [6] W. Bosma, J. Cannon, and C. Playoust, The Magma algebra system. I. The user language, J. Symbolic Comput. 24 (1997), 235–265.
- [7] K. Briggs and F. Ying, How to estimate quantiles easily and reliably, Math. Today (Southend-on-Sea) 54, 1 (Feb. 2018), 26–29.
- [8] A. Busboom, H. Elders-Boll, and H. D. Schotten, Uniformly redundant arrays, *Experimental Astronomy* 8 (1998), 97–123.
- P. J. Cameron, Hadamard Matrices, in *Encyclopaedia of Design Theory*, Queen Mary, University of London, 2006.
   Available at http://www.maths.qmul.ac.uk/~lsoicher/designtheory.org/library/encyc/top:
- [10] L. Devroye, Non-Uniform Random Variate Generation, Springer-Verlag, New York, 1986, §II.3. Available from http://luc.devroye.org/rnbookindex.html.
- [11] R. H. Dicke, Scatter-hole cameras for X-rays and gamma rays, Astrophys. J. 153 (1968), L101–L106.
- [12] J.-P. Duval, Génération d'une section des classes de conjugaison et arbre des mots de Lyndon de longueur bornée, *Theoret. Comput. Sci.* 60 (1988), 255–383.
- [13] H. Ehlich, Determinantenabschätzungen für binäre Matrizen, Math. Z. 83 (1964), 123– 132.
- [14] H. Ehlich, Determinantenabschätzungen für binäre Matrizen mit  $n \equiv 3 \pmod{4}$ , Math. Z. 84 (1964), 438–447.
- [15] E. E. Fenimore and T. M. Cannon, Coded aperture imaging with uniformly redundant arrays, Applied Optics 17 (1978), 337–347.
- [16] R.J. Fletcher, M. Gysin, and J. Seberry, Application of the discrete Fourier transform to the search for generalised Legendre pairs and Hadamard matrices, *Australas. J. Combin.* 23 (2001), 75–86.
- [17] S. Ghosh and R. Pasupathy, Low-storage online estimators for quantiles and densities, Proc. 2013 Winter Simulation Conference, IEEE, New York, 2013, 778–789.

- [18] S. R. Gottesman and E. E. Fenimore, New family of binary arrays for coded aperture imaging, Applied Optics 28 (1989), 4344–4352.
- [19] T. Granlund, The GNU MP Bignum Library, http://gmplib.org/, 2016.
- [20] J. Hadamard, Résolution d'une question relative aux déterminants, Bull. des Sci. Math. 17 (1893), 240–246. Reprinted in Oeuvres de Jacques Hadamard, Tome 1, CNRS, Paris, 1968, 239–245.
- [21] M. Hall, Jr., A survey of difference sets, Proc. Amer. Math. Soc. 7 (1956), 975–986.
- [22] D. E. Knuth, J. H. Morris, and V. Pratt, Fast pattern matching in strings, SIAM J. Comput. 6 (1977), 323–350.
- [23] T. Kociumaka, J. Radoszewski, and W. Rytter, Computing k-th Lyndon word and decoding lexicographically minimal de Bruijn sequence, CPM 2014, Lect. Notes in Comp. Sci., Vol. 8486, Springer, 2014, pp. 202–211.
- [24] I. S. Kotsireas, C. Koukouvinos, and J. Seberry, Hadamard ideals and Hadamard matrices with circulant core, J. Combin. Math. Combin. Comput. 57 (May 2006), 47–63.
- [25] A. Levin, R. Fergus, F. Durand, and W. Freeman, Image and depth from a conventional camera with a coded aperture, ACM Trans. Graph. 26.3 (2007), 70.
- [26] R. C. Lyndon, On Burnside's problem, Trans. Amer. Math. Soc. 77 (1954), 202–215.
- [27] F. J. MacWilliams and N. J. A. Sloane, Pseudo-random sequences and arrays, Proc. IEEE 64 (1976), 1715–1729.
- [28] M. G. Neubauer and A. J. Radcliffe, The maximum determinant of {±1}-matrices, Linear Algebra Appl. 257 (1997), 289–306.
- [29] J. von Neumann, Various techniques used in connection with random digits, in Monte Carlo Method, Appl. Math. Series 12, US Nat. Bureau of Standards, 1951, 36–38 (summary written by G. E. Forsythe); reprinted in John von Neumann Collected Works, Vol. 5, Pergamon Press, New York, 1963, pp. 768–770.
- [30] OEIS Foundation Inc., The On-Line Encyclopedia of Integer Sequences, http://oeis.org, 2018.
- [31] W. Orrick, The Hadamard maximal determinant problem, preprint. Available at http://www.indiana.edu/~maxdet/, 2018.
- [32] R. E. A. C. Paley, On orthogonal matrices, J. Mathematics and Physics 12 (1933), 311–320.
- [33] Y. Shiloach, Fast canonization of circular strings, J. Algorithms 2 (1981), 107–121.

- [34] A. I. Shirshov, Subalgebras of free Lie algebras, Mat. Sbornik N.S. 33 (1953), 441–452.
- [35] J. Singer, A theorem in finite projective geometry and some applications to number theory, Trans. Amer. Math. Soc. 43 (1938), 377–385.
- [36] C. Smyth, The Mahler measure of algebraic numbers: a survey, in *Number Theory and Polynomials*, J. McKee and C. Smyth (eds.), Cambridge Univ. Press, New York, 2008, 322–349.
- [37] R. G. Stanton and D. A. Sprott, A family of difference sets, Can. J. Math. 10 (1958), 73–77.
- [38] J. J. Sylvester, Thoughts on inverse orthogonal matrices, simultaneous sign-successions, and tessellated pavements in two or more colours, with applications to Newton's rule, ornamental tile-work, and the theory of numbers, *London Edinburgh and Dublin Philos. Mag. and J. Sci.* **34** (1867), 461–475.
- [39] A. L. Whiteman, A family of difference sets, *Illinois J. Math.* 6 (1962), 107–121.
- [40] J. Williamson, Hadamard's determinant theorem and the sum of four squares, Duke Math. J. 11 (1944), 65–81.
- [41] M. Wojtas, On Hadamard's inequality for the determinants of order non-divisible by 4, Colloq. Math. 12 (1964), 73–83.
- [42] A. Yedidia, C. Thrampoulidis, and G. Wornell, Analysis and optimization of aperture design in computational imaging, preprint, 2017. Available at http://arxiv.org/abs/1712.04541.

2010 Mathematics Subject Classification: Primary 05A15; Secondary 05A19, 65T50. Keywords: binary matrix, Booth's algorithm, circulant, circulant core, computational imaging, convolutional Gaussian channel, difference set, discrete Mahler measure, Duval's algorithm, Hadamard bound, Hadamard matrix, Lyndon word, maximal determinant, modular computation, MURA, necklace, parallel algorithm, parallel computation, quantile estimation, URA.

(Concerned with sequences <u>A000031</u>, <u>A086432</u>, <u>A215723</u>, <u>A215897</u>.)

Received April 25 2018; revised version received June 6 2018. Published in *Journal of Integer Sequences*, June 10 2018.

Return to Journal of Integer Sequences home page.