# Searching for Large Circulant Graphs 

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March 26, 2015


#### Abstract

We address the problem of constructing large undirected circulant networks with given degree and diameter. First we discuss the theoretical upper bounds and their asymptotics, and then we describe and implement a computer-based method to find large circulant graphs with given parameters. For several combinations of degree and diameter, our algorithm produces the largest known circulant graphs. We summarize our findings in a table, up to degree 15 and diameter 10 , and we perform a statistical analysis of this table, which can be useful for evaluating the performance of our methods, as well as other constructions in the future.


Keywords: Network design, Degree/Diameter Problem, circulant graphs

## 1 Introduction

The Degree/Diameter Problem (or DDP, for short) is one of the main theoretical issues in network design. DDP asks for constructing the largest possible graph, in terms of the number of vertices, subject to an upper bound on the maximum degree $\Delta$ and an upper bound on the diameter $D$. Let $N_{\Delta, D}$ be the number of vertices of the largest graph with maximum degree $\Delta$ and diameter $D$; it is well known that

$$
\begin{align*}
N_{\Delta, D} \leq M_{\Delta, D} & =1+\Delta+\Delta(\Delta-1)+\cdots+\Delta(\Delta-1)^{D-1} \\
& = \begin{cases}1+\Delta \frac{(\Delta-1)^{D}-1}{\Delta-2} & \text { if } \Delta>2 \\
2 D+1 & \text { if } \Delta=2\end{cases} \tag{1}
\end{align*}
$$

The number $M_{\Delta, D}$ is called the Moore bound, and a graph of order $M_{\Delta, D}$ is called a Moore graph [32. Moore graphs are rather scarce: they exist only for a few combinations of $\Delta$ and $D$. For $D=1$ and $\Delta \geq 1$, they are the complete graphs on $\Delta+1$ vertices. For $D \geq 2$ and $\Delta=2$, they are the cycles on $2 D+1$ vertices. For $D=2$, Moore graphs exist for $\Delta=2,3,7$, and possibly 57 .

The Degree/Diameter Problem can also be formulated for digraphs, but in this paper we will only be concerned with the undirected version. On the other hand, we are interested in some particular versions of the problem, namely when the graphs are restricted to a certain class, such as the class of bipartite graphs [9, 7, 8, 16, 17], planar graphs [21, 23, 14, 15, 43, 44], vertex-transitive graphs [27, 40], Cayley graphs [2, 22, 27, 40, 46], Cayley graphs of abelian groups [11], or circulant graphs [47, 36, 29]. In particular, in this paper we are concerned with circulant graphs, i.e. Cayley graphs of finite cyclic groups.

For most of the aforementioned graph classes there exist Moore-like upper bounds, which are usually smaller than the Moore bound for general graphs. Most of the research, both in the general version, as well as in these restricted versions of DDP, falls into one of two main categories:

1. Proving the non-existence of graphs with order close or equal to the upper bound, or
2. Giving constructions of large graphs, whose order approach the upper bounds as much as possible.

Research in the second category has been substantially boosted by the compliation of record graph tables, containing the largest known graphs for several combinations of degree and diameter. These tables provide benchmarks to test construction methods and computer search algorithms. Thus, after the first compilation started by Comellas in 1995 [4, other record graph tables have been collected for general graphs, bipartite graphs, planar graphs, and Cayley graphs 5 .

The study of circulant graphs began in 1970 with Elspas and Turner [13]. Coincidentally, it was also Elspas who had formulated the Degree/Diameter

Problem back in 1964 [12], but apparently he missed the connection between both topics.

Even though the abelian property of the underlying group prevents abelian Cayley graphs in general (and circulant graphs in particular) to grow as large as their non-abelian counterparts, these graphs have been widely used as topologies for computer networks and parallel computers, due to their other nice properties. Paraphrasing [11]: "...the extra structure provided by the groups may provide compensating advantages ..., such as good routing algorithms, easy constructibility, and the ability to map common problems onto the architecture".

However, up to now there were no comprehensive tables for abelian Cayley graphs, or their subfamily of circulant graphs. This is sufficient motivation to start a collection of benchmarks in the class of circulant graphs, which can be used for comparison purposes in the future. Our goals in this paper are twofold:

1. Design and implement a computer search algorithm to find large circulant graphs with small degree and diameter, and
2. Start the compilation of a table containing the largest known circulant graphs for some small values of degree and diameter, including the results obtained with the aforementioned algorithm.

Additionally, we explore the sharpness of the existing upper bounds for some particular combinations of degree and diameter.

## 2 Definitions and basic facts

An undirected circulant graph $C(n ; S)$ is a Cayley graph on the cyclic group $\mathbb{Z}_{n}$, with a symmetric connection set $S$ (i.e. $S=S^{-1}$ ). Since $\mathbb{Z}_{n}$ is abelian, we can switch to additive notation and rephrase the symmetry condition of the connection set as $S=-S$. In order to simplify the notation, we drop the curly brackets $\}$ in the specification of the set $S$ in $C(n ; S)$.

Being a Cayley graph, $C(n ; S)$ is vertex-transitive. The degree of $C(n ; S)$ is $\Delta=|S|$, and its order is obviously $n$. A circulant graph can also be defined as a graph of $n$ vertices whose adjacency matrix is circulant [12].

Regarding the degree, we distinguish two cases:

1. Even degree: $\Delta=2 t$. In that case, $S=\left\{ \pm s_{1}, \ldots, \pm s_{t}\right\}$, where $1 \leq$ $s_{1}<\ldots<s_{t}<\frac{n}{2}$.
2. Odd degree: $\Delta=2 t+1$. In that case, $S=\left\{ \pm s_{1}, \ldots, \pm s_{t}, \frac{n}{2}\right\}$, where $1 \leq s_{1}<\ldots<s_{t}<\frac{n}{2}$. It follows that odd degree is only possible when $n$ is even.
$C(n ; S)$ is connected if, and only if, $\operatorname{gcd}\left(n, s_{1}, \ldots, s_{t}\right)=1$. If $\operatorname{gcd}(n, r)=1$, then $C(n ; S)$ is isomorphic to $C(n ; r S)$, where multiplication is taken modulo $n$. In that case we say that the connection sets $S$ and $r S$ are multiplicatively related. It should be noted, however, that two circulant graphs may be isomorphic without their connection sets being multiplicatively related [12, 37.

Now let $N_{\Delta, D}^{c i r c}$ be the number of vertices of the largest circulant graph with degree $\Delta$ and diameter $D$. It was proved in [3] that, if $\Delta=2 t$, then

$$
\begin{equation*}
N_{\Delta, D}^{c i r c} \leq F(t, D)=\sum_{i=0}^{t} 2^{i}\binom{t}{i}\binom{D}{i} \tag{2}
\end{equation*}
$$

This upper bound was later rediscovered by Muga [36]. The quantity $F(t, D)$ also turns out to be an upper bound for $N_{\Delta, D}^{A C}$, the order of the largest Cayley graph over an abelian group, with degree $\Delta$ and diameter $D$ [11]. It is quite surprising that no better general upper bound (yet) exists for circulant graphs, considering that they are a special case of abelian Cayley graphs.

The numbers $F(t, D)$ of Eq. 2 are known as Delannoy numbers (sequence A008288 of [38]), and they arise in a variety of combinatorial and geometric problems [42]. For example, they correspond to the volume of the ball of radius $D / 2$ in the $L^{1}$ metric in $t$ dimensions [11, 31, 45].

Unaware of the Delannoy connection, Stanton and Cowan had already studied these numbers back in 1970 [41], as a generalization of the binomial coefficients, which satisfy the recurrence:

$$
\begin{align*}
F(t, D) & =F(t-1, D)+F(t, D-1)+F(t-1, D-1), \text { with } \\
F(t, 1) & =2 t+1, \text { for } t \geq 0 . \tag{3}
\end{align*}
$$

They gave several interesting formulas for these numbers, such as:

$$
\begin{equation*}
F(t, D)=\sum_{i=0}^{t}\binom{t}{i}\binom{D+i}{t}=\sum_{i=0}^{t}\binom{D+i}{i}\binom{D}{t-i} \tag{4}
\end{equation*}
$$

In the case of odd $\Delta$ (i.e. $\Delta=2 t+1$ ) we have the generator $\frac{n}{2}$, which is its own inverse. Figure 1 provides a graphical example of that case, for $\Delta=5$ and $D=3$. We have denoted the generators as $a, b, c$, where $c=-c$.


Figure 1: Tree representation of a maximal abelian Cayley graph of degree 5 and diameter 3 .

We can see in this example that the edges labeled with $c$ duplicate every vertex, except those in the lowest level (level $D$ ). Therefore, an upper bound for the maximum number of vertices in this case is:

$$
\begin{equation*}
F^{\prime}(t, D)=F(t, D)+F(t, D-1) \tag{5}
\end{equation*}
$$

From Equations 3 and 5 we can deduce that the numbers $F^{\prime}(t, D)$ also satisfy the same recurrence:

$$
\begin{align*}
F^{\prime}(t, D) & =F^{\prime}(t-1, D)+F^{\prime}(t, D-1)+F^{\prime}(t-1, D-1), \text { with } \\
F^{\prime}(t, 1) & =2 t+2, \text { for } t \geq 0 . \tag{6}
\end{align*}
$$

Additionally, $F(t, D)<F^{\prime}(t, D)<F(t+1, D)$, i.e. the sequence of upper bounds obtained by fixing the diameter is monotonically increasing. Nevertheless, $F(t, D)$ and $F^{\prime}(t, D)$ grow at slightly different rates, as we will see next.

In order to find an explicit formula for $F^{\prime}(t, D)$, we proceed as in 31]: Define the generating function $A_{D}(z)=\sum_{t \geq 0} F^{\prime}(t, D) z^{t}$. Multiplying both sides of Eq. 6 by $z^{t}$ and summing over $t \geq 1$ we get

$$
\begin{equation*}
A_{D}(z)-A_{D}(0)=z A_{D}(z)+\left(A_{D-1}(z)-A_{D-1}(0)\right)+z A_{D-1}(z) \tag{7}
\end{equation*}
$$

whence

$$
\begin{equation*}
A_{D}(z)=\frac{1+z}{1-z} A_{D-1}(z) \tag{8}
\end{equation*}
$$

With the aid of the boundary condition in Eq. 6 we get

$$
\begin{equation*}
A_{D}(z)=\frac{2(1+z)^{D-1}}{(1-z)^{D+1}} \tag{9}
\end{equation*}
$$

Now, $A_{D}(z)$ is the product of $(1+z)^{D-1}=\sum_{t}\binom{D-1}{t} z^{t}$ and $1 /(1-z)^{D+1}=$ $\sum_{t}\binom{D+t}{t} z^{t}=\sum_{t}\binom{D+t}{D} z^{t}$. Then, the series of $A_{D}(z)$ can be obtained as the convolution of the respective factor series, which gives us:

$$
\begin{align*}
F^{\prime}(t, D) & =2 \sum_{i=0}^{t}\binom{D-1}{i}\binom{D+t-i}{t-i} \\
& =2 \sum_{i=0}^{t}\binom{D-1}{i}\binom{D+t-i}{D-i}  \tag{10}\\
& =2 \sum_{i=0}^{t}\binom{D-1}{t-i}\binom{D+i}{i}
\end{align*}
$$

Note that Eq. 10 is the same as Eq. 2 of [31], with the roles of $\Delta$ and $D$ swapped ${ }^{1}$ This symmetry arises as a consequence of the symmetry of Eq. 6 . In the same manner we can derive other formulas for $F(t, D)$ from Eq. 2 of [31]:

$$
\begin{align*}
F(t, D) & =\sum_{i=0}^{t}\binom{D}{i}\binom{D+t-i}{t-i}  \tag{11}\\
& =\sum_{i=0}^{t}\binom{D}{t-i}\binom{D+i}{i}
\end{align*}
$$

With the aid of the methods developed in [48] it can be shown that the numbers $F(t, D)$ and $F^{\prime}(t, D)$ do not have a closed form, meaning that they cannot be represented as a linear combination of a fixed number of hypergeometric terms. However, we can obtain asymptotic formulas for them. From

[^0]Corollary 2.1 of [31], and using the symmetry just discussed, we get that both $F(t, D)$ and $F^{\prime}(t, D)$ grow asymptotically as $\frac{(2 t)^{D}}{D!}+o\left(t^{D}\right)$.

The first few values of $F(t, D)$ and $F^{\prime}(t, D)$ are collected in Table 3. up to degree 15 and diameter 10 . We can fit an exponential function $e^{f(\Delta, D)}$ to these values, where

$$
\begin{align*}
f(\Delta, D)= & -0.8015+0.5612 \Delta+0.5433 D-0.05421 \Delta^{2}+0.1499 \Delta D \\
& -0.09784 D^{2}+0.001574 \Delta^{3}-0.001924 \Delta^{2} D  \tag{12}\\
& -0.003822 \Delta D^{2}+0.004591 D^{3},
\end{align*}
$$

with $R^{2}=0.9986$.
Figure 2 shows a contour plot of $f(\Delta, D)$.


Figure 2: Contour plot of the function $f(\Delta, D)$, that approximates the logarithms of the upper bounds $F(t, D)$ and $F^{\prime}(t, D)$.

If we compute the differences between the values predicted by $f(\Delta, D)$ and the logarithms of the actual upper bounds $F(t, D)$ and $F^{\prime}(t, D)$, we see that the numbers $F(t, D)$ are slightly above $f(\Delta, D)$, while $F^{\prime}(t, D)$ are slightly below $f(\Delta, D)$, as shown in Figure 3. Therefore, it might be useful to compute different approximations for the values with even and odd degree, respectively:

$$
\begin{align*}
f(\Delta, D)= & -0.5686+0.4266 \Delta+0.6491 D-0.03746 \Delta^{2} \\
& +0.1366 \Delta D-0.1009 D^{2}+0.00098 \Delta^{3}  \tag{13}\\
& -0.001492 \Delta^{2} D-0.003578 \Delta D^{2}+0.004598 D^{3}
\end{align*}
$$

(with $R^{2}=0.9999$ ), and

$$
\begin{align*}
f(\Delta, D)= & -0.6153+0.5063 \Delta+0.4993 D-0.04712 \Delta^{2} \\
& +0.1507 \Delta D-0.09576 D^{2}+0.001282 \Delta^{3}  \tag{14}\\
& -0.001776 \Delta^{2} D-0.003974 \Delta D^{2}+0.004584 D^{3},
\end{align*}
$$

with $R^{2}=0.997$.


Figure 3: Predicted (logarithmic) upper bound minus actual (logarithmic) upper bound. Light entries correspond to negative differences. Darker colors correspond to positive differences.

If we normalize the difference at each $(\Delta, D)$ by the logarithm of the actual upper bound at $(\Delta, D)$, the disparity between even and odd rows is still visible, but it fades out as $\Delta$ increases, as shown in Figure 4.

Circulant graphs of the form $C\left(n ; \pm 1, \pm s_{2}, \ldots, \pm s_{t}\right)$ are called multi-loop graphs. In particular, for $t=2$ and $t=3$ they are called double-loop graphs


Figure 4: Normalized difference between the predicted (logarithmic) upper bound minus actual (logarithmic) upper bound. Light entries correspond to negative differences. Darker colors correspond to positive differences.
and triple-loop graphs, respectively. According to [35], the maximum order of a triple-loop network $C\left(n ; \pm 1, \pm s_{2}, \pm s_{3}\right)$ is:

$$
T_{6, D}= \begin{cases}\frac{32}{27} D^{3}+\frac{16}{9} D^{2}+2 D+1 & \text { if } D \equiv 0 \bmod 3  \tag{15}\\ 32\left\lfloor\frac{D}{3}\right\rfloor^{3}+48\left\lfloor\frac{D}{3}\right\rfloor^{2}+30\left\lfloor\frac{D}{3}\right\rfloor+7 & \text { if } D \equiv 1 \bmod 3 \\ 32\left\lfloor\frac{D}{3}\right\rfloor^{3}+80\left\lfloor\frac{D}{3}\right\rfloor^{2}+70\left\lfloor\frac{D}{3}\right\rfloor+21 & \text { if } D \equiv 2 \bmod 3\end{cases}
$$

Many of the graphs found by us here are multi-loop.

## 3 A basic search procedure

Let $n, \Delta$ and $D$ be given. We now describe a systematic search procedure that attempts to find a circulant graph with the given parameters. Our search space consists of all connection sets $S$. The basic idea is to consider a tree-like organization of the search space, and then perform a Depth-First Search with backtracking on the tree, while pruning significant portions of it. To begin with, our search space will be restricted to connection sets with $s_{1}=1$. This will reduce the search space without losing too many potential solutions, and as a bonus, it will relieve us from the burden of testing connectedness.

For even (resp. odd) $\Delta$, a node at depth $t$ in the search tree corresponds to a circulant graph of order $n$ and degree $2 t$ (resp. $2 t+1$ ). For the sake of brevity, we shall make no distinction between a node and its corresponding graph. The root of the search tree is the circulant graph $C(n ; \pm 1\})$ (resp. $C(n ;\{ \pm 1, n / 2))$. Let $C(n ; S)$ be a node of degree smaller than $\Delta$, and let $m$ be the largest element in $S$ such that $1 \leq m<n / 2$. Then $C(n ; S)$ has offspring $C(n ; S \cup\{ \pm g\})$ for every $m+k \leq g \leq(n-k) / 2$ (resp. $m+k \leq$ $g \leq n / 2-k)$, where $k$ is a constant standing for the maximum difference allowed between two elements in $S$. Nodes of degree $\Delta$, appearing at depth $(\Delta-1) / 2$ (resp. $(\Delta-3) / 2)$, are the leaves of the tree.

In the general Degree/Diameter Problem, it is well-known that large graphs tend to have large girth with respect to their diameter. This observation does not apply to circulant graphs, as their girth is always at most 4 when $\Delta \geq 3$. Thus, we have generalized the girth criterion as follows:

For a circulant graph $C(n ; S)$ and a length $d$, define $\mathcal{P}_{w}^{d}(0 \leq w<N)$ as the set of paths of length $d$ from a fixed vertex $v$ (say 0 ) to the vertex $w$. Paths in $\mathcal{P}_{w}^{d}$ are meant to be disjoint, with no repeated vertices (except when $w=$ $v$ ), and they are different up to commutation (that is, $P=Q x(x a)(x a b) R$ and $P^{\prime}=Q x(x b)(x b a) R=Q x(x b)(x a b) R$ are considered to be the same path).

Whether the offspring of a given node $C(n ; S)$ are explored or not depends on a function on the cardinals of the sets $\mathcal{P}_{w}^{d}$. Basically, for each $i$ and $d$ we fix constants $c_{i}^{d}$ (for $0 \leq i \leq d<D$ ) which stand for the maximum number of paths allowed in $\mathcal{P}_{w}^{d}$ whenever $w$ is at distance $i \leq d$ from the vertex 0 . That is, for every vertex $w$ in the graph, if $w$ is at distance $i<D$ from the vertex 0 , we require that $\left|\mathcal{P}_{w}^{d}\right| \leq c_{i}^{d}$ for every $d$ with $i \leq d<D$.

Tuning the constants $c_{i}^{d}$ provides great flexibility on the number of nodes explored, and proved to be very effective in practice. By defining small enough values for the constants $c_{i}^{d}$ it is possible to prune a significant portion of the search tree, especially as $\Delta$ increases. On the other hand, the constants $c_{i}^{d}$ should not be too small, so as not to miss too many potential solutions.

Therefore, a careful choice of the constants $c_{i}^{d}$ is of paramount importance. In order to tune them properly, some degree of experimentation and intuition was involved. Initially, we tested many of the largest known circulant graphs for the values of $\left|\mathcal{P}_{w}^{d}\right|$. Most of these graphs were already known to be optimal.

The parameter $k$, introduced to control the size of the search space, and thus the number of nodes visited by the algorithm, presented similar tradeoffs. Although certainly useful, experimenting with different values for the parameter $k$ provided rather poor improvements, compared to the cut-offs achievable via pruning (unless the ability to find existing solutions was seriously compromised by choosing $k$ to be too large).

Algorithm 1 formalizes the above ideas. Parameters $n, \Delta$ and $D$ are global. The input to the algorithm is the connection set $S$. Initially, the algorithm is called with $S=\{ \pm 1\}$ (resp. $S=\{ \pm 1, n / 2\}$ ). Every time that a new generator is added, the algorithm calls itself recursively with the new connection set $S^{\prime}$. If a circulant graph $C(n ; S)$ with de desired parameters is found, the algorithm will print it out. Otherwise, the algorithm terminates without producing any output.

Although the algorithm is presented in a recursive fashion, it was actually implemented using a stack for optimisation reasons. We omit actual
implementation details here.

```
Algorithm 1: SEARCH
    Input : A set of generators \(S\).
    Output: A circulant graph \(C(n ; S)\) with degree \(\Delta\) and diameter \(D\).
    \(m:=\) Largest element in \(S\);
    for \(g:=m+k\) to \((n-k) / 2\) do
        \(S^{\prime}:=S \cup\{ \pm g\} ;\)
        success := true;
        for each \(g\)-path \(P\) in \(C\left(n ; S^{\prime}\right)\), with \(P \in \mathcal{P}_{w}^{d}\) do
            \(i:=\) Distance from vertex 0 to \(w\) in \(C\left(n ; S^{\prime}\right)\);
        if \(d>i\) and \(\left|\mathcal{P}_{w}^{d}\right|>c_{i}^{d}\) then
            success := false;
            break;
            end
            if \(d=i\) and \(\left|\mathcal{P}_{w}^{j}\right|>c_{i}^{j}\) for some \(j(i \leq j<D)\) then
                success := false;
                break;
            end
        end
        if success then
            if \(\left|S^{\prime}\right|<\Delta\) then
                Call SEARCH \(\left(S^{\prime}\right)\);
            end
            else
                if diameter of \(C\left(n ; S^{\prime}\right)\) is \(D\) then
                    Print \(C\left(n ; S^{\prime}\right)\);
            end
        end
        end
    end
```

With the aid of Algorithm 1 we have been able to find 15 new large circulant graphs of small diameter (ranging from 3 to 5), and degrees between 8 and 15. Additionally, we found two circulant graphs, which although not being record graphs, will be of interest later, since they will be used in the construction of larger graphs. The connection sets for all these graphs are listed in Table 1. Four of them were found independently by Lewis in [25], and proved to be optimal. These four graphs, as well as other graphs in Table 1, up to degree 13, were also reported in [18]. By exhaustive search we also prove the optimality of the graph with degree 11, diameter 3 , and order

210 , as well as the optimality of the previously known graphs of diameter 3 and degrees 9 and 10 .

| $\Delta$ | $D$ | Order / Connection Set |  |
| ---: | ---: | :--- | ---: |
| 8 | 3 | $104\{ \pm 1, \pm 16, \pm 20, \pm 27\}$ | $L, \star$ |
|  | 4 | $248\{ \pm 1, \pm 61, \pm 72, \pm 76\}$ | $L, \star$ |
|  | 5 | $528\{ \pm 1, \pm 89, \pm 156, \pm 162\}$ | $-\star$ |
|  |  | $511\{ \pm 1, \pm 5, \pm 70, \pm 96\}$ | $-\star$ |
|  | 6 | $967\{ \pm 1, \pm 7, \pm 132, \pm 182\}$ | $L, \star$ |
| 9 | 4 | $320\{ \pm 1, \pm 15, \pm 25, \pm 83,160\}$ | $\star$ |
| 10 | 4 | $457\{ \pm 1, \pm 20, \pm 130, \pm 147, \pm 191\}$ | $L$ |
|  | 5 | $1099\{ \pm 1, \pm 53, \pm 207, \pm 272, \pm 536\}$ | $\star$ |
| 11 | 3 | $210\{ \pm 1, \pm 49, \pm 59, \pm 84, \pm 89,105\}$ | $\star$ |
|  | 4 | $576\{ \pm 1, \pm 9, \pm 75, \pm 155, \pm 179,288\}$ | $\star$ |
|  | 5 | $1380\{ \pm 1, \pm 33, \pm 173, \pm 387, \pm 663,690\}$ | $\star$ |
| 12 | 3 | $275\{ \pm 1, \pm 16, \pm 19, \pm 29, \pm 86, \pm 110\}$ | $\star$ |
|  | 4 | $761\{ \pm 1, \pm 12, \pm 184, \pm 235, \pm 334, \pm 362\}$ | $\star$ |
|  | 5 | $1800\{ \pm 1, \pm 30, \pm 64, \pm 384, \pm 761, \pm 841\}$ | $\star$ |
| 13 | 3 | $312\{ \pm 1, \pm 14, \pm 74, \pm 77, \pm 130, \pm 138,156\}$ | $\star$ |
|  | 4 | $920\{ \pm 1, \pm 11, \pm 38, \pm 176, \pm 232, \pm 376,460\}$ | $\star$ |
| 14 | 3 | $381\{ \pm 1, \pm 11, \pm 103, \pm 120, \pm 155, \pm 161, \pm 187\}$ | $\star$ |
| 15 | 3 | $448\{ \pm 1, \pm 10, \pm 127, \pm 150, \pm 176, \pm 189, \pm 217,224\}$ | $\star$ |

Table 1: Connection sets for graphs found by Algorithm 1 labelled with a $\star$. Graphs labelled with an $L$ were found independently by Lewis [25], and proved to be optimal. Graphs labelled with a - symbol are sub-optimal. The graph with order 1099 was also found by Lewis [26].

Unfortunately, for larger values of $\Delta$ and $D$, the execution time of Algorithm 1 becomes prohibitive with the computing power at our disposal. Thus, in order to complete our table of record circulant graphs up to $\Delta=15$ and $D=10$, we must use a combination of Algorithm 1 with Cartesian product, as described in the next section.

## 4 Combining basic search with Cartesian product

Prior to our computer-based search, the main sources of large circulant graphs were:

1. For $t=2$ an optimal circulant graph $C\left(n ; \pm s_{1}, \pm s_{2}\right)$, is achieved for $s_{1}=\left\lfloor\frac{1}{2}(\sqrt{2 n-1}-1)\right\rfloor$ and $s_{2}=s_{1}+1$ [1, 3, 33].
2. Monakhov and Monakhova used an evolutionary algorithm to find dense families of undirected circulant graphs. In particular, with the aid of this algorithm they found some families of large triple-loop graphs [34.
3. For larger degrees we have the construction $C\left(n ; \pm 1, \pm s, \ldots, \pm s^{t-1}\right)$, where $n=s^{t}$, and $s$ is an odd integer, which yields good circulant graphs of diameter $\frac{t}{2}(s-1)=\frac{t}{2} n^{1 / t}-\frac{t}{2}$ [47].
4. Applying the methods described in [11 for abelian Cayley graphs, Charles Delorme has recently obtained several circulant graphs of large order [10].
5. With the aid of computer search, Lewis found several optimal graphs with degrees 8 and 9 [25].
6. With the aid of Algorithm 1, we found some new record graphs, up to degree 13 [18].

Our new computer search method is based on the combination of Algorithm 1 above with Cartesian product of graphs. If $n$ and $m$ are relatively prime, then $\mathbb{Z}_{n} \times \mathbb{Z}_{m} \cong \mathbb{Z}_{n m}$. Given the Cayley graphs $C\left(n ; S_{1}\right)$ and $C\left(m ; S_{2}\right)$, the Cayley graph $C(n m ; S)$ can be obtained as $C\left(n ; S_{1}\right) \square C\left(m ; S_{2}\right)$, where $S=m S_{1} \cup n S_{2}$, and $\square$ represents the Cartesian product of graphs. In this construction, the degree of $C(n m ; S)$ is the sum of the degrees of the factor graphs $C\left(n ; S_{1}\right)$ and $C\left(m ; S_{2}\right)$, and the same holds for the diameter of $C(n m ; S)$. Figure 5 depicts the Cartesian product $C(4 ; 1) \square C(3 ; 1)$, and Figure 6 shows this same graph with a circulant layout. Note that the generator 3 of $\mathbb{Z}_{12}$ corresponds to $(1,0)$ in the -external- direct product of $\mathbb{Z}_{4}$ and $\mathbb{Z}_{3}$, while the generator 4 corresponds to $(0,1)$.

Now we just have to look for appropriate combinations of the largest known graphs in order to fill higher entries of the table. Normally we would be interested in using the largest possible factor graphs, but in order to apply the aforementioned construction we may need to resort to sub-optimal factor graphs, since the optimal factors may have orders which are not relatively prime, hence yielding a non-circulant graph.

Algorithm 2 formalizes the method. The auxiliary function prime $(G)$ determines whether $G$ is the Cartesian product of two circulant graphs whith relative prime orders. With the aid of Algorithm 2 we found 41 new record circulant graphs, listed in Table 2.


Figure 5: Cartesian product $C(4 ; \pm 1) \square C(3 ; \pm 1)$


Figure 6: The graph $C(12 ; \pm 3, \pm 4)$

```
Algorithm 2: COMBINED SEARCH AND CARTESIAN PRODUCT
    Input : A degree \(\Delta \geq 4\) and a diameter \(D \geq 10\).
    Output: Largest graph \(C(n m ; S)=C\left(n ; S_{1}\right) \square C\left(m ; S_{2}\right)\) with degree \(\Delta\)
                and diameter \(D\); where \(C\left(n ; S_{1}\right)\) and \(C\left(m ; S_{2}\right)\) are known
                circulant graphs, or are found by Algorithm 1 .
    \(\max :=0\);
    \(A:=\) Empty array of graphs;
    for \(i:=2\) to \(\lfloor\Delta / 2\rfloor\) do
        for \(j:=1\) to \(\lfloor D / 2\rfloor\) do
            \(G_{1}:=\) Largest known circulant of deg. \(i\) and diam. \(j\);
            \(G_{2}:=\) Largest known graph of deg. \(\Delta-i\) and diam. \(D-j\);
            if \(\left|G_{1}\right|\left|G_{2}\right|>\max\) then
                Insert \(\left|G_{1}\right| \square\left|G_{2}\right|\) in \(A\) so as to keep \(A\) sorted;
                if \(\operatorname{gcd}\left(\left|G_{1}\right|,\left|G_{2}\right|\right)=1\) then
                    \(\max :=\left|G_{1}\right|\left|G_{2}\right| ;\)
                    Remove from \(A\) all the elements after \(\left|G_{1}\right| \square\left|G_{2}\right| ;\)
                end
            end
        end
    end
    while length \((A)>0\) and not \(\operatorname{prime}(A[0])\) do
        \(G:=\left|G_{1}\right| \square\left|G_{2}\right|:=A[0] ;\)
        Remove \(G\) from \(A\);
        \(n^{\prime}:=\left|G_{1}\right|-1\);
        while \(n^{\prime}\left|G_{2}\right|>\max\) do
            if \(\operatorname{gcd}\left(n^{\prime}, m\right)=1\) then
                    \(G_{1}^{\prime}:=\) Circulant of order \(n^{\prime}\), same deg. and diam. as \(G_{1}\);
                    if \(G_{1}^{\prime}\) was found then break;
                \(n^{\prime}:=n^{\prime}-1 ;\)
            end
        end
        \(m^{\prime}:=\left|G_{2}\right|-1 ;\)
        while \(\left|G_{1}\right| m^{\prime}>\max\) do
            if \(\operatorname{gcd}\left(n, m^{\prime}\right)=1\) then
                \(G_{2}^{\prime}:=\) Circulant of order \(m^{\prime}\), same deg. and diam. as \(G_{2}\);
                    if \(G_{2}^{\prime}\) was found then break;
                    \(m^{\prime}:=m^{\prime}-1 ;\)
            end
        end
        \(G^{\prime}:=n^{\prime} m>n m^{\prime} ? G_{1}^{\prime} \square G_{2}: G_{1} \square G_{2}^{\prime} ;\)
        Insert \(G^{\prime}\) in \(A\) so as to keep \(A\) sorted;
        \(\max :=\left|G^{\prime}\right|\);
        Remove from \(A\) all the elements after \(G^{\prime}\);
    end
    if length \((A)>0\) then Print \(A[0]\);
```

| $G_{1} \square G_{2}$ |  |  | $G_{1}$ |  |  | $G_{2}$ |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\Delta$ | $D$ | Order | $\Delta$ | D | Order | $\Delta$ | D | Order |
| 10 | 6 | 1533 | 2 | 1 | 3 | 8 | 5 | 511 |
|  | 7 | 2925 | 4 | 3 | 25 | 6 | 4 | 117 |
|  | 8 | 5136 | 2 | 1 | 3 | 8 | 7 | 1712 |
|  | 9 | 8560 | 2 | 2 | 5 | 8 | 7 | 1712 |
|  | 10 | 13840 | 2 | 2 | 5 | 8 | 8 | 2768 |
| 11 | 6 | 2100 | 2 | 1 | 3 | 9 | 5 | 700 |
|  | 7 | 4088 | 3 | 2 | 8 | 8 | 5 | 511 |
|  | 8 | 7736 | 3 | 2 | 8 | 8 | 6 | 984 |
|  | 9 | 13400 | 4 | 3 | 25 | 7 | 6 | 536 |
|  | 10 | 21976 | 4 | 4 | 41 | 7 | 6 | 536 |
| 12 | 6 | 3297 | 2 | 1 | 3 | 10 | 5 | 1099 |
|  | 7 | 6864 | 4 | 2 | 13 | 8 | 5 | 528 |
|  | 8 | 13200 | 4 | 3 | 25 | 8 | 5 | 528 |
|  | 9 | 24600 | 4 | 3 | 25 | 8 | 6 | 984 |
|  | 10 | 42800 | 4 | 3 | 25 | 8 | 7 | 1712 |
| 13 | 5 | 1828 | 3 | 1 | 4 | 10 | 4 | 457 |
|  | 6 | 4396 | 3 | 1 | 4 | 10 | 5 | 1099 |
|  | 7 | 9100 | 4 | 2 | 13 | 9 | 5 | 700 |
|  | 8 | 18720 | 6 | 4 | 117 | 7 | 4 | 160 |
|  | 9 | 36036 | 6 | 4 | 117 | 7 | 5 | 308 |
|  | 10 | 63700 | 4 | 3 | 25 | 9 | 7 | 2548 |
| 14 | 4 | 825 | 2 | 1 | 3 | 12 | 3 | 275 |
|  | 5 | 2285 | 4 | 1 | 5 | 10 | 4 | 457 |
|  | 6 | 5941 | 4 | 2 | 13 | 10 | 4 | 457 |
|  | 7 | 14287 | 4 | 2 | 13 | 10 | 5 | 1099 |
|  | 8 | 29016 | 6 | 4 | 117 | 8 | 4 | 248 |
|  | 9 | 59787 | 6 | 4 | 117 | 8 | 5 | 511 |
|  | 10 | 113139 | 6 | 4 | 117 | 8 | 6 | 967 |
| 15 | 4 | 1100 | 3 | 1 | 4 | 12 | 3 | 275 |
|  | 5 | 3044 | 3 | 1 | 4 | 12 | 4 | 761 |
|  | 6 | 7524 | 7 | 3 | 76 | 8 | 3 | 99 |
|  | 7 | 17940 | 4 | 2 | 13 | 11 | 5 | 1380 |
|  | 8 | 39564 | 5 | 3 | 36 | 10 | 5 | 1099 |
|  | 9 | 81900 | 6 | 4 | 117 | 9 | 5 | 700 |
|  | 10 | 154720 | 7 | 4 | 160 | 8 | 6 | 967 |
| 16 | 5 | 3805 | 4 | 1 | 5 | 12 | 4 | 761 |
|  | 6 | 10296 | 8 | 3 | 99 | 8 | 3 | 104 |
|  | 7 | 25135 | 6 | 3 | 55 | 10 | 4 | 457 |
|  | 8 | 60445 | 6 | 3 | 55 | 10 | 5 | 1099 |
|  | 9 | 128583 | 6 | 4 | 117 | 10 | 5 | 1099 |
|  | 10 | 269808 | 8 | 58 | 511 | 8 | 5 | 528 |

Table 2: Large circulant graphs obtained by the Cartesian product of two circulant graphs.

## 5 The largest known circulant graphs

Table 3 summarizes our current knowledge about the largest known circulant graphs, including the ones obtained with the aid of our methods. Each entry of the table contains four elements: the order of the largest circulant graph known to-date (upper left), a reference to its source (upper right), the bestknown upper bound (lower left), and the percentage of the upper bound achieved (lower right). This table can also be found in [6].

The actual graphs obtained by Algorithms 1 and 2 are given in tables 4 and 5. The tables also indicate which of these graphs are optimal multi-loop graphs. Optimality has been verified for some small values of $\Delta$ and $D$, by performing a systematic search through all multi-loop graphs with the given parameters $\Delta$ and $D$.

Table 3 can be well approximated by a bi-exponential function, such as $e^{f(\Delta, D)}$, where

$$
\begin{align*}
f(\Delta, D)= & -1.912+0.8845 \Delta+0.8014 D-0.08641 \Delta^{2} \\
& +0.1152 \Delta D-0.1214 D^{2}+0.002799 \Delta^{3}  \tag{16}\\
& +0.002799 \Delta^{2} D-0.001046 \Delta D^{2}+0.005036 D^{3}
\end{align*}
$$

with $R^{2}=0.997$.
Figure 7 shows the approximation of the bi-cubic polynomial $f(\Delta, D)$ to the logarithms of the graph orders.

Fitting a function to the table provides insight in several ways. Obviously, it gives an idea on how the table grows, and how effective the different construction methods are. Second, from this approximation we can figure out which are the table entries where an improvement is more likely to occur in the near future, because their current value lies beneath the value predicted by the function $e^{f(\Delta, D)}$. Figure 8 summarizes this analysis in a graphical way. Entry $(\Delta, D)$ contains a color representation of the predicted value $f(\Delta, D)$ minus the actual value of the logarithmic $(\Delta, D)$ table. The lighter the color, the better the actual value is, in comparison with the value predicted by $f(\Delta, D)$. Dark entries correspond to 'bad' values, which lie below their prediction.

There are several interesting things that pop out immediatlely: First of all, odd rows tend to be darker than even ones, especially for lower degrees. However, this should be no surprise to us, since the upper bounds show the same pattern, as we saw in Section 2. When we look at the percentages (next), we see that even rows actually do not fare better than odd ones.

The best opportunities for improvement seem to lie in rows 10 and 11, from diameters 6 to 10 , and also in the small black region of rows 14,15 ,

|  | Diameter $D$ |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 3 | 8 |  | 12 |  | 16 |  | 20 |  | 24 |  | 28 |  | 32 |  | 36 |  | 40 |  |
|  | 8 | 100\% | 12 | 100\% | 16 | 100\% | 20 | 100\% | 24 | 100\% | 28 | 100\% | 32 | 100\% | 36 | 100\% | 40 | 100\% |
| 4 | 13 |  | 25 |  | 41 |  | 61 |  | 85 |  | 113 |  | 145 |  | 181 |  | 221 |  |
|  | 13 | 100\% | 25 | 100\% | 41 | 100\% | 61 | 100\% | 85 | 100\% | 113 | 100\% | 145 | 100\% | 181 | 100\% | 221 | 100\% |
| 5 | 16 |  | 36 | [27] | 64 | [27) | 100 | [27] | 144 | [27] | 196 | [27] | 256 | [27] | 324 | [27] | 400 | 27 |
|  | 18 | 89\% | 38 | 95\% | 66 | 97\% | 102 | 98\% | 146 | 99\% | 198 | 99\% | 258 | 99\% | 326 | 99\% | 402 | 99\% |
| 6 | 21 | [10] | 55 | 10 | 117 | 10] | 203 | 10] | 333 | [27] | 515 | [27] | 737 | [27] | 1027 | [27] | 1393 | 35] |
|  | 25 | 84\% | 63 | 87\% | 129 | 91\% | 231 | 88\% | 377 | $88 \%$ | 575 | 90\% | 833 | $88 \%$ | 1159 | 89\% | 1561 | 89\% |
| 7 | 26 | 10 | 76 | $\underline{27}$ | 160 | 27 | 308 | $\underline{27}$ | 536 | T 4 | 828 | T4 | 1232 | T 4 | 1764 | T 4 | 2392 | T 4 |
|  | 32 | 81\% | 88 | 86\% | 192 | 83\% | 360 | 86\% | 608 | 88\% | 952 | $87 \%$ | 1408 | $87 \%$ | 1992 | 88\% | 2720 | 88\% |
| 8 | 35 | 10] | 104 | T 4 | 248 | T 4 | 528 | T4 | 984 | [25] | 1712 | [25] | 2768 | [25] | 4280 | [25] | 6320 | [25] |
|  | 41 | 85\% | 129 | 77\% | 321 | 75\% | 681 | $77 \%$ | 1289 | 76\% | 2241 | 76\% | 3649 | 76\% | 5641 | 76\% | 8361 | $76 \%$ |
| $\Delta \quad 9$ | 42 | [10] | 130 | [27] | 320 | T 4 | 700 | 25] | 1416 | [25] | 2548 | (25) | 4304 | 25] | 6804 | (25) | 10320 | [25] |
|  | 50 | 84\% | 170 | 76\% | 450 | $71 \%$ | 1002 | 70\% | 1970 | $72 \%$ | 3530 | $72 \%$ | 5890 | $73 \%$ | 9290 | $73 \%$ | 14002 | $74 \%$ |
| 10 | 51 | [10] | 177 | [27] | 457 | T 4 | 1099 | [26] | 1533 | T4 | 2925 | T4 | 5136 | T4 | 8560 | T4 | 13840 | T4 |
|  | 61 | 84\% | 231 | 77\% | 681 | $67 \%$ | 1683 | 65\% | 3653 | $42 \%$ | 7183 | $40 \%$ | 13073 | 39\% | 22363 | 38\% | 36365 | $38 \%$ |
| 11 | 56 | 10 | 210 | T 4 | 576 | T 4 | 1380 | T4 | 2100 | T 4 | 4088 | T4 | 7736 | T 4 | 13400 | T4 | 21976 | T4 |
|  | 72 | 78\% | 292 | $72 \%$ | 912 | 63\% | 2364 | 58\% | 5336 | 39\% | 10836 | $37 \%$ | 20256 | 38\% | 35436 | 38\% | 58728 | $37 \%$ |
| 12 | 67 | [10] | 275 | T4 | 761 | T 4 | 1800 | T4 | 3297 | T4 | 6864 | T4 | 13200 | T4 | 24600 | T4 | 42800 | T4 |
|  | 85 | $79 \%$ | 377 | $73 \%$ | 1289 | 59\% | 3653 | 49\% | 8989 | 36\% | 19825 | 34\% | 40081 | 33\% | 75517 | 32\% | 134245 | $32 \%$ |
| 13 | 80 | T 5 | 312 | T 5 | 920 | T5 5 | 1828 | T 5 | 4396 | T 5 | 9100 | T5 | 18720 | T5 | 36036 | T 5 | 63700 | T 5 |
|  | 98 | 82\% | 462 | 68\% | 1666 | 55\% | 4942 | $37 \%$ | 12642 | 35\% | 28814 | 31\% | 59906 | 31\% | 115598 | 31\% | 209762 | 30\% |
| 14 | 90 | T5 | 381 | T5 | 825 | T5 | 2285 | T5 | 5941 | T5 | 14287 | T5 | 29016 | T5 | 54120 | T 5 | 113139 | T5 |
|  | 113 | $80 \%$ | 575 | $66 \%$ | 2241 | $37 \%$ | 7183 | 32\% | 19825 | 30\% | 48639 | 30\% | 108545 | $27 \%$ | 224143 | 24\% | 433905 | $26 \%$ |
| 15 | 96 | T5 | 448 | T5 | 1100 | T5 | 2880 | T5 | 7488 | T5 | 17584 | T5 | 39564 | T5 | 81900 |  | 154720 | T5 |
|  | 128 | $75 \%$ | 688 | $65 \%$ | 2816 | 39\% | 9424 | $30 \%$ | 27008 | $28 \%$ | 68464 | 25\% | 157184 | $25 \%$ | 332688 | 24\% | 658048 | 23\% |
| 16 | 112 | T 4 | xxx | T5 | 936 | T 5 | 3640 | T 5 | 9597 | T5 | 25135 | T 5 | 60445 | T 5 | 128583 |  | 239816 | T5 |
|  | 145 | 25\% | 833 | 11\% | 3649 | $25 \%$ | 13073 | 28\% | 40081 | $24 \%$ | 108545 | 23\% | 265729 | 23\% | 598417 | 21\% | 1256465 | 19\% |

Table 3: Orders of the largest known circulant graphs.

| $\Delta$ | $D$ | Circulant graph |
| :--- | :--- | :--- |
| 7 | 6 | $536\{ \pm 1, \pm 231, \pm 239,268\} \star$ |
| 7 | 7 | $828\{ \pm 1, \pm 9, \pm 91,414\} \star$ |
| 7 | 8 | $1232\{ \pm 1, \pm 11, \pm 111,616\} \star$ |
| 7 | 9 | $1764\{ \pm 1, \pm 803, \pm 815,882\} \star$ |
| 7 | 10 | $2392\{ \pm 1, \pm 13, \pm 183,1196\} \star$ |
| 8 | 3 | $104\{ \pm 1, \pm 16, \pm 20, \pm 27\} \star$ |
| 8 | 4 | $248\{ \pm 1, \pm 61, \pm 72, \pm 76\} \star$ |
| 8 | 5 | $528\{ \pm 1, \pm 89, \pm 156, \pm 162\}$ |
| 8 | 6 | $967\{ \pm 1, \pm 7, \pm 132, \pm 182\}$ |
| 8 | 7 | $1545\{ \pm 1, \pm 170, \pm 178, \pm 468\}$ |
| 9 | 4 | $320\{ \pm 1, \pm 15, \pm 25, \pm 83,160\} \star$ |
| 9 | 5 | $684\{ \pm 1, \pm 111, \pm 145, \pm 279,342\}$ |
| 9 | 6 | $1284\{ \pm 1, \pm 36, \pm 163, \pm 342,642\}$ |
| 9 | 7 | $2340\{ \pm 1, \pm 149, \pm 157, \pm 645,1170\}$ |
| 10 | 4 | $457\{ \pm 1, \pm 20, \pm 130, \pm 147, \pm 191\}$ |
| 10 | 5 | $1099\{ \pm 1, \pm 53, \pm 207, \pm 272, \pm 536\}$ |
| 10 | 6 | $1533\{ \pm 3, \pm 15, \pm 210, \pm 288, \pm 511\}$ |
| 10 | 7 | $2925\{ \pm 25, \pm 351, \pm 400, \pm 468, \pm 550\}$ |
| 10 | 8 | $5136\{ \pm 3, \pm 645, \pm 1712, \pm 1824, \pm 1848\}$ |
| 10 | 9 | $8560\{ \pm 5, \pm 1075, \pm 1712, \pm 3040, \pm 3080\}$ |
| 10 | 10 | $13840\{ \pm 5, \pm 1032, \pm 2768, \pm 5360, \pm 5400\}$ |
| 11 | 3 | $210\{ \pm 1, \pm 49, \pm 59, \pm 84, \pm 89,105\} \star$ |
| 11 | 4 | $576\{ \pm 1, \pm 9, \pm 75, \pm 155, \pm 179,288\}$ |
| 11 | 5 | $1380\{ \pm 1, \pm 33, \pm 173, \pm 387, \pm 663,690\}$ |
| 11 | 6 | $2100\{ \pm 3, \pm 15, \pm 591, \pm 669, \pm 700,1050\}$ |
| 11 | 7 | $4088\{ \pm 8, \pm 40, \pm 511, \pm 560, \pm 768,2044\}$ |
| 11 | 8 | $7736\{ \pm 8, \pm 56, \pm 967, \pm 1056, \pm 1456,3868\}$ |
| 11 | 9 | $13400\{ \pm 25, \pm 1608, \pm 2144, \pm 5775, \pm 5975,6700\}$ |
| 11 | 10 | $21976\{ \pm 41, \pm 2144, \pm 2680, \pm 9471, \pm 9799,10988\}$ |
| 12 | 3 | $275\{ \pm 1, \pm 16, \pm 19, \pm 29, \pm 86, \pm 110\}$ |
| 12 | 4 | $761\{ \pm 1, \pm 12, \pm 184, \pm 235, \pm 334, \pm 362\}$ |
| 12 | 5 | $1800\{ \pm 1, \pm 30, \pm 64, \pm 384, \pm 761, \pm 841\}$ |
| 12 | 6 | $3297\{ \pm 3, \pm 159, \pm 621, \pm 816, \pm 1099, \pm 1608\}$ |
| 12 | 7 | $6864\{ \pm 13, \pm 1056, \pm 1157, \pm 1584, \pm 2028, \pm 2106\}$ |
| 12 | 8 | $13200\{ \pm 25, \pm 1584, \pm 2112, \pm 2225, \pm 3900, \pm 4050\}$ |
| 12 | 9 | $24600\{ \pm 25, \pm 2952, \pm 3936, \pm 4075, \pm 8700, \pm 8850\}$ |
| 12 | 10 | $42800\{ \pm 25, \pm 5136, \pm 5375, \pm 6848, \pm 15200, \pm 15400\}$ |
|  |  |  |

Table 4: New circulant networks obtained by Algorithms 1 and 2 . The graphs marked with $\star$ are optimal.

| $\Delta$ | $D$ | Circulant graph |
| :--- | :--- | :--- |
| 13 | 2 | $80\{ \pm 1, \pm 3, \pm 9, \pm 20, \pm 25, \pm 33,40\}$ |
| 13 | 3 | $312\{ \pm 1, \pm 14, \pm 74, \pm 77, \pm 130, \pm 138,156\}$ |
| 13 | 4 | $920\{ \pm 1, \pm 11, \pm 38, \pm 176, \pm 232, \pm 376,460\}$ |
| 13 | 5 | $1828\{ \pm 4, \pm 80, \pm 457, \pm 520, \pm 588, \pm 764,914\}$ |
| 13 | 6 | $4396\{ \pm 4, \pm 212, \pm 828, \pm 1088, \pm 1099, \pm 2144,2198\}$ |
| 13 | 7 | $9100\{ \pm 13, \pm 65, \pm 1400, \pm 2100, \pm 2561, \pm 2899,4550\}$ |
| 13 | 8 | $18720\{ \pm 117, \pm 160, \pm 585, \pm 2560, \pm 3520, \pm 3627,9360\}$ |
| 13 | 9 | $36036\{ \pm 117, \pm 308, \pm 819, \pm 4928, \pm 5031, \pm 6776,18018\}$ |
| 13 | 10 | $63700\{ \pm 25, \pm 175, \pm 7644, \pm 10192, \pm 13025, \pm 14275,31850\}$ |
| 14 | 2 | $90\{ \pm 1, \pm 4, \pm 10, \pm 17, \pm 26, \pm 29, \pm 41\} \star$ |
| 14 | 3 | $381\{ \pm 1, \pm 11, \pm 103, \pm 120, \pm 155, \pm 161, \pm 187\} \star$ |
| 14 | 4 | $825\{ \pm 3, \pm 48, \pm 57, \pm 87, \pm 258, \pm 275, \pm 330\} \star$ |
| 14 | 5 | $2285\{ \pm 5, \pm 100, \pm 457, \pm 650, \pm 735, \pm 914, \pm 955\} \star$ |
| 14 | 6 | $5941\{ \pm 13, \pm 260, \pm 914, \pm 1371, \pm 1690, \pm 1911, \pm 2483\} \star$ |
| 14 | 7 | $14287\{ \pm 13, \pm 689, \pm 2198, \pm 2691, \pm 3297, \pm 3536, \pm 6968,\} \star$ |
| 14 | 8 | $29016\{ \pm 117, \pm 248, \pm 3968, \pm 5456, \pm 7137, \pm 8424, \pm 8892\} \star$ |
| 14 | 9 | $54120\{ \pm 55, \pm 984, \pm 4920, \pm 8965, \pm 19140, \pm 19470, \pm 20664\}$ |
| 14 | 10 | $113139\{ \pm 117, \pm 819, \pm 967, \pm 15444, \pm 15472, \pm 21274, \pm 21294\}$ |
| 15 | 2 | $96\{ \pm 1, \pm 3, \pm 5, \pm 11, \pm 24, \pm 31, \pm 39,48\}$ |
| 15 | 3 | $448\{ \pm 1, \pm 10, \pm 127, \pm 150, \pm 176, \pm 189, \pm 217,224\} \star$ |
| 15 | 4 | $1100\{ \pm 4, \pm 64, \pm 76, \pm 116, \pm 275, \pm 344, \pm 440,550\}$ |
| 15 | 5 | $2880\{ \pm 5, \pm 45, \pm 375, \pm 576, \pm 775, \pm 895, \pm 1152,1440\}$ |
| 15 | 6 | $7488\{ \pm 13, \pm 117, \pm 975, \pm 1152, \pm 1728, \pm 2015, \pm 2327,3744\}$ |
| 15 | 7 | $17584\{ \pm 16, \pm 848, \pm 1099, \pm 3297, \pm 3312, \pm 4352, \pm 8576,8792\}$ |
| 15 | 8 | $39564\{ \pm 36, \pm 1099, \pm 1908, \pm 5495, \pm 7452, \pm 9792, \pm 19296,19782\}$ |
| 15 | 9 | $81900\{ \pm 117, \pm 585, \pm 700, \pm 11200, \pm 15400, \pm 23049, \pm 26091,40950\}$ |
| 15 | 10 | $154720\{ \pm 160, \pm 967, \pm 1120, \pm 4835, \pm 21120, \pm 29120, \pm 29977,77360\}$ |

Table 5: New circulant networks obtained by Algorithms 1 and 2 . The graphs marked with $\star$ are optimal.


Figure 7: Contour plot of the bi-cubic polynomial $f(\Delta, D)$, compared to the logarithmic Degree/Diameter table


Figure 8: Predicted (logarithmic) table values minus actual (logarithmic) values. Light entries correspond to negative differences. Darker colors correspond to positive differences.
columns 4,5. On the other hand we get a light triangular area in the low diameters, in rows $10-15$. That is where we have been able to perform a more detailed search with Algorithm 1 .

Another important analysis tool is given by the table of percentages, which indicates for each $\Delta$ and $D$ the percentage of the upper bound that has been achieved by the largest known graph. Figure 9 shows the table of percentages as a contour plot.


Figure 9: Table of percentages shown as a contour plot
It is not unreasonable to assume that the percentages should behave smoothly, therefore we can subject the table of percentages to the same analysis that we have used for the table of upper bounds and the table of graph orders. In this case, a bi-cubic polynomial is not flexible enough to approximate the table of percentages, therefore, we have fitted the bi-quartic polynomial

$$
\begin{align*}
q(\Delta, D)= & 98.77-13.16 \Delta+17.23 D+1.214 \Delta^{2}+4.512 \Delta D \\
& -6.777 D^{2}+0.03356 \Delta^{3}-0.89 \Delta^{2} D+0.2302 \Delta D^{2} \\
& +0.6634 D^{3}-0.003327 \Delta^{4}+0.02822 \Delta^{3} D  \tag{17}\\
& +0.00937 \Delta^{2} D^{2}-0.01317 \Delta D^{3}-0.02335 D^{4}
\end{align*}
$$

to the table of percentages. The contour plot of $q(\Delta, D)$ is given in Figure 10.


Figure 10: Contour plot of $q(\Delta, D)$, which approximates the table of percentages

Now, for each $\Delta$ and $D$ we can construct the difference between the predicted value $q(\Delta, D)$ and the actual percentage. Figure 11 shows these differences, normalized by the actual percentages. Again, the lighter the color, the better the graph is, in comparison with its expected percentage. Figure 11 confirms the main conclusions drawn from the analysis of Figure 8

## 6 Open problems

The apparent simplicity of circulant graphs is deceiving, and they are a reservoir of interesting open problems. The main theoretical question here has to do with finding sharper upper bounds for circulant graphs. The bounds $F(t, D)$ and $F^{\prime}(t, D)$ given by Equations 2, 4, 10, and 11 are clearly not sharp. All graphs in Table 3, from degrees 5 to 8 are known to be optimal, and yet they lie below the upper bounds. Some sharper lower bounds have been found for specific degrees or diameters, such as Eq. 15, but no general sharper lower bound is known up to date.

The upper bounds $F(t, D)$ and $F^{\prime}(t, D)$ have been obtained only by using the commutativity of the underlying group. However, circulant graphs are not even optimal in the class of abelian Cayley graphs (see [11] and also [19]),


Figure 11: Normalized differences between the predicted percentages and the actual percentages. Light entries correspond to negative differences. Darker colors correspond to positive differences.
despite some papers claiming so [20].
As for the lower bounds, there are few constructions for $\Delta>8$. Our Cartesian product construction may clearly be generalized to obtain a general lower bound, which may then be compared analytically with other existing constructions.

Regarding computer-based search, this problem poses several challenges. The search space grows very quickly with $\Delta$ and $D$, making a systematic search unfeasible. This problem could be alleviated by combining the search procedure with some isomorph rejection sieve, or some powerful heuristics. Additionally, other computer-based methods in the style of 34] could be devised, to obtain families of large circulant graphs with low diameter.

In this paper we have only addressed the construction of undirected circulants, but in principle, the methods described here can be extended to directed, or even mixed graphs.

## Acknowledgements

We feel indebted to Charles Delorme for sharing his unpublished results with us.

## References

[1] Bermond, J.C., G. Illiades, and C. Peyrat: An Optimization Problem in Distributed Loop Computer Networks. Annals of the New York Academy of Sciences 555, 45-55 (1989).
[2] Branković, L., M. Miller, J. Plesník, J. Ryan, J. Širán: A note on constructing large Cayley graphs of given degree and diameter by voltage assignments. The Electronic Journal of Combinatorics 5, \#R9 (1998).
[3] Boesch, F.T., and J.F. Wang: Reliable circulant networks with minimal transmission delay. IEEE Transactions on Circuits and Systems 32, 12861291 (1985).
[4] Comellas, F.: The (Degree,Diameter) Problem for Graphs. http:// maite71.upc.es/grup_de_grafs/grafs/taula_delta_d.html.
[5] The Degree/Diameter Problem. http://combinatoricswiki.org/ wiki/The_Degree/Diameter_Problem.
[6] The Degree/Diameter Problem For Circulant Graphs. http: //combinatoricswiki.org/wiki/The_Degree_Diameter_Problem_ for_Circulant_Graphs.
[7] Delorme, C., L.K. Jorgensen, M. Miller, G. Pineda-Villavicencio: On bipartite graphs of diameter 3 and defect 2. Journal of Graph Theory 61, 271-288 (2009).
[8] Delorme, C., L.K. Jorgensen, M. Miller, G. Pineda-Villavicencio: On bipartite graphs of defect 2. European Journal of Combinatorics 30, 798808 (2009).
[9] Delorme, C.: Large bipartite graphs with given degree and diameter. Journal of Graph Theory 8, 325-334 (1985).
[10] Delorme, C.: Some remarks about circulant Cayley graphs. Personal communication (2013).
[11] Dougherty, R. and V. Faber: The Degree Diameter Problem for Several Varieties of Cayley Graphs I: The Abelian Case. SIAM Journal of Discrete Mathematics 17(3), 478-519 (2004).
[12] Elspas, B.: Topological constraints on interconnection-limited logic. Procs. of the 5th Annual IEEE Symposium on Switching Circuit Theory and Logical Design, Princeton, New Jersey, USA, 133-137 (1964).
[13] Elspas, B. and J. Turner: Graphs with circulant adjacency matrices. Journal of Combinatorial Theory 9, 297-307 (1970).
[14] Fellows, M.R., P. Hell, K. Seyffarth: Large planar graphs with given diameter and maximum degree. Discrete Applied Mathematics 61, 133153 (1995).
[15] Fellows, M.R., P. Hell, K. Seyffarth: Constructions of Dense Planar Networks. Networks 32, 275-281 (1998).
[16] Feria-Puron, R. and G. Pineda-Villavicencio: On bipartite graphs of defect at most 4. Discrete Applied Mathematics 160, 140-154 (2012).
[17] Feria-Puron, R., M. Miller, G. Pineda-Villavicencio: On large bipartite graphs of diameter 3. Discrete Mathematics 313, 381-390 (2013).
[18] Feria-Puron, R., J. Ryan, and H. Pérez-Rosés: Searching for Large Multi-Loop Networks. Elec. Notes Disc. Math. 46 (2014), 233-240.
[19] Fiol, M.A: Comments on "Extremal Cayley digraphs of finite Abelian groups" [Intercon. Networks 12 (2011), no. 1-2, 125135]. Journal of Interconnection Networks 14 (4) (2013).
[20] Gail-Mask, A., J. Schneider, and X. Jia: Extremal Cayley Digraphs of Finite Abelian Groups. Journal of Interconnection Networks 12 (2011), 125-135.
[21] Göbel, F. and W. Kern: Planar regular graphs with prescribed diameter. Applied Math. Memorandum No. 1183, Univ. of Twente (The Netherlands), 1993.
[22] Hafner, P.R.: Large Cayley graphs and digraphs with small degree and diameter. Research Report CDMTCS-005, University of Auckland, New Zealand (1995).
[23] Hell, P. and K. Seyffarth: Largest planar graphs of diameter two and fixed maximum degree. Discrete Mathematics 111, 313-322 (1993).
[24] Hwang, F.K.: A survey on multi-loop networks. Theoretical Computer Science 299, 107-121 (2003).
[25] Lewis, R.: The degree-diameter problem for circulant graphs of degree 8 and 9, arXiv:1404.3948v1, 2014.
[26] Lewis, R.: Personal communication, 2014.
[27] Machbeth, H., J. Šiagiová, J. Širáň, T. Vetrík: Large Cayley graphs and vertex-transitive non-Cayley graphs of given degree and diameter. Journal of Graph Theory 64, 87-98 (2009).
[28] Mans, B., I. Shparlinski: Number theoretical methods in graph theory and networks. ARC Grant (2000).
[29] Martínez, C., R. Beivide, C. Izu, J.M. Alonso: Characterization of the Class of Optimal Dense Circulant Graphs of Degree Four. Proceedings of the XIV Jornadas de Paralelismo, Leganés, Madrid, Spain (2003).
[30] Meijer, P.T.: Connectivities and diameters of circulant graphs. Master's Thesis, Simon Fraser University (1991).
[31] Miller, M., H. Pérez-Rosés and J. Ryan: The maximum degree and diameter-bounded subgraph in the mesh. Discrete Applied Mathematics 160, 1782-1790 (2012).
[32] Miller, M. and J. Širáň: Moore graphs and beyond: A Survey of the Degree-Diameter Problem, Electronic Journal of Combinatorics, Dynamic Survey 14, 1-61 (2013).
[33] Monakhova, E.A.: On analytical representation of optimal twodimensional Diophantine structures of homogeneous computer systems (in Russian). Computing systems 90, 81-91 (1981).
[34] Monakhov, O. and E.A. Monakhova: Using evolutionary algorithm for generation of dense families of circulant networks. Proceedings of the IEEE Congress on Evolutionary Computation, Honolulu, Hawai, 18541859 (2002).
[35] Monakhova, E.A.: A survey on undirected circulant graphs. Discrete Mathematics, Algorithms and Applications 4(1) (2012).
[36] Muga, F.P. II: Undirected circulant graphs. Procs. of the IEEE Int. Symp. on Parallel Architectures, Algorithms and Networks (ISPAN) 113118 (1994).
[37] Muzychuk, M.: A solution of the isomorphism problem for circulant graphs. Procs. of the London Mathematical Society 3 (88) 1-41 (2004).
[38] OEIS: The On-Line Encyclopedia of Integer Sequences. http://oeis. org/classic/index.html.
[39] Pérez-Rosés, H.: Algebraic and Computer-Based Methods in the Undirected Degree/Diameter Problem - A Brief Survey, Electronic Journal of Graph Theory and Applications 2(2), 166-190, 2014.
[40] Šiagiová, J. and T. Vetrík: Large vertex-transitive and Cayley graphs with given degree and diameter. Electronic Notes in Discrete Mathematics 28, 365-369 (2007).
[41] Stanton, R.G. and D.D. Cowan. "Note on a square functional equation". SIAM Review 12 (1970), 277-279.
[42] Sulanke, R. "Objects counted by the central Delannoy numbers". J. Integer Sequences 6 (2003), Art. 03.1.5.
[43] Tischenko, E.A.: Maximum size of a planar graph with given degree and diameter. Electronic Notes in Discrete Mathematics 31, 157-159 (2008).
[44] Tischenko, E.A.: Maximum size of a planar graph with given degree and even diameter. European Journal of Combinatorics 33, 380-396 (2012).
[45] Vassilev-Missana, M.V. and K.T. Atanassov. "On Delanoy [sic] numbers". Annuaire Univ. Sofia Fac. Math. Inform. 81 (1987), 153-162.
[46] Vetrík, T.: Cayley graphs of given degree and diameters 3, 4 and 5. Discrete Mathematics 313, 213-216 (2013).
[47] Wong, C.K. and D. Coppersmith: A combinatorial problem related to multimodule memory organizations. Journal of the ACM 21, 392-402 (1974).
[48] M. Petkovšek, H. Wilf, and D. Zeilberger. $A=B$. AK Peters, 1996.


[^0]:    ${ }^{1}$ More precisely, $t$ takes the value $p$ (which corresponds to $\lfloor D / 2\rfloor$ in 31), and $D$ takes the value $k$ (which corresponds to $\Delta / 2$ ).

