Two lower bounds for branching programs

Miklós Ajtai
IBM Almaden Research, San Jose CA

László Babai
University of Chicago and
Eötvös University, Budapest

Péter Hajnal
University of Chicago and
Eötvös University, Budapest

János Komlós
Univ. California San Diego and
Hungarian Academy of Sciences, Budapest

Pavel Pudlák
Mathematical Institute
Czechoslovak Academy of Sciences, Prague

Vojtěch Rödl
Department of Mathematics
FJFI ČVUT, Prague

Endre Szemerédi
University of Chicago and
Hungarian Academy of Sciences, Budapest

György Turán
University of Illinois at Chicago and
Hungarian Academy of Sciences, Szeged

Abstract.

The first result concerns branching programs having *width* $(\log n)^{O(1)}$. We give an $\Omega(n \log n / \log\log n)$ lower bound for the size of such branching programs computing almost any *symmetric* Boolean function and in particular the following explicit function: "the sum of the input variables is a quadratic residue mod p" where p is any given prime between $n^{1/4}$ and $n^{1/3}$. This is a strengthening of previous nonlinear lower bounds obtained by Chandra, Furst, Lipton and by Pudlák. We mention that by iterating our method the result can be further strengthened to $\Omega(n \log n)$.

The second result is a C^n lower bound for read-once-only branching programs computing an explicit Boolean function. For $n = \binom{v}{2}$, the function computes the parity of the number of triangles in a graph on v vertices. This improves previous $\exp(c\sqrt{n})$ lower bounds for other graph functions by Wegener and Zák. The result implies a linear lower bound for the space complexity of this Boolean function on "eraser machines", i.e. machines that erase each input bit immediately after having read it.

1. Introduction.

1.1. Branching programs.

A Boolean function in n variables is a mapping from the set of 2^n (0,1) input strings to $\{0, 1\}$. Several models of computation of such functions have been considered in the literature (Turing machine, Boolean circuit, decision tree, Boolean formula, etc.). Branching programs are a model generalizing decision trees. The program is a directed acyclic graph. To avoid confusion we shall use the terms *nodes* and *arcs* to refer to the elements of this digraph. (We shall use branching programs to do computation on graphs; these graphs (input objects) will have *vertices* and *edges*.)

One of the nodes of the branching program is a source (has fan-in zero) and is called START, some other nodes are sinks (fan-out zero) and are called *terminal* nodes. All non-terminal nodes have fan-out two. The two arcs leaving a non-terminal node are labeled 0 and 1. Each non-terminal node is labeled by an input variable and each terminal node is labeled 0 or 1. We shall assume that the program is *leveled*, START is on level one and arcs go from each level to the next level only. This causes no loss of generality to the result in Section 3. We shall discuss the effect on the result in Section 2 there.

Each input string $\alpha = \alpha_1 ... \alpha_n$ defines a unique path from START to a terminal node: the *computation path* determined by α. This path, after entering a nonterminal node labeled x_i, proceeds along the arc labeled α_i. The path ends at a terminal node. The function f computed by this branching program is defined by setting $f(\alpha)$ equal to the label of this terminal node.

The *size* of a branching program is the number of nodes. The *width* of the program is the maximum number of nodes on any level. The *length* is the number of levels. The *multiplicity of reading* is the maximum number of times any particular variable is encountered as a node label along any computation path.

An easy counting argument shows that most Boolean functions require exponential size branching programs. It is desirable to find nontrivial lower bounds for explicit Boolean functions (functions that belong to P or at least to NP).

The only known lower bound for the size of an unrestricted branching program computing an explicit Boolean function is due to Nečiporuk [Ne], [Sa] and is $\Omega(n^2/\log^2 n)$. P. Beame and S. Cook observed [BC] that Nečiporuk's technique actually applies to the "element distinctness" problem in the following sense. Let $x_1, \ldots, x_m$ be m integers between 1 and m^2. Written in binary, they form the input string of length $n = 2m \log m$. Then any branching program deciding whether or not all the x_i are distinct must have size $\Omega(m^2) = \Omega(n^2/\log^2 n)$.

Another approach that has recently gained popularity is proving lower bounds for branching programs with bounds on various "resources" (width, multiplicity of reading). A similar approach to Boolean circuits has been quite successful recently [Ya2], [An], [Ra], [Ha], [AB], [Be].

Our aim is to present two more results of this kind — one under each type of restriction.

1.2. Bounded width branching programs for symmetric functions

Bounded width branching programs have first been promoted by Borodin, Dolev, Fich and Paul [BDFP]. Their main result, completed by Yao [Ya1] , is a superpolynomial lower bound for width-2 branching programs computing the majority function. Shearer [Sh] recently proved an exponential lower bound for for width-2 branching programs computing the "0 mod 3" function. These functions are *symmetric* (invariant under permutations of the variables). Interest in such functions was in part motivated by the conjecture stated in [BDFP] that any bounded width branching program computing the majority function would require exponential size. This conjecture has been proved false by David Barrington's surprising result [Ba1] that the class of Boolean functions computed by polynomial size, width-5 branching programs coincides with nonuniform NC^1 (log-depth, fan-in 2 Boolean circuits) and thus contains all symmetric functions. This may be part of the reason why it is so difficult to find even *nonlinear* lower bounds for bounded width branching programs for symmetric functions.

The first such lower bound was derived by a beautiful Ramsey argument by Chandra, Furst, and Lipton [CFL] for the function $\sum_{i=1}^{n} x_i = n/2$. Unfortunately, as it tends to be the case with Ramsey arguments, the bound is barely nonlinear: it is $\Omega(nw(n))$ where $w(n)$ is the inverse function of van der Waerden numbers (see [GRS]).

A more effective lower bound was obtained by P. Pudlák [Pu]. Using a different Ramsey argument, he proves $\Omega(n \log\log n/\log\log\log n)$ lower bounds for threshold functions and separates (by the same amount) the power of width k and width $k+1$ branching programs for each k. He also proves a nonlinear lower bound *under no width constraint* for the majority function as well as an $\Omega(n \log\log n/\log\log\log n)$ lower bound for bounded width branching programs for all but a bounded number of symmetric Boolean functions.

The first result of this paper gives a more effective, $\Omega(n \log n/\log\log n)$ lower bound for bounded width branching programs computing any member of a large class of symmetric Boolean functions (Section 2). In this range, Ramsey methods no longer seem to help and we have to establish some "global" structure. The width bound we impose is not a constant, only $(\log n)^{O(1)}$. We hope that it will be possible to eliminate this width bound altogether.

1.3. Limited reading

A *read-k-times-only* branching program is allowed to encounter each variable at most k times along any computation path. This hierarchy of classes of branching programs was introduced by Masek [Ma]. Wegener [We] conjectures an exponential gap between the levels of this hierarchy and gives candidate Boolean functions computable with polynomial size read-k-times-only programs but conjectured to require exponential size read $(k-1)$-times-only programs.

No superpolynomial lower bounds are known, however, even for read-twice-only branching programs computing an explicit Boolean function, and no such bound will appear in this paper.

In connection with the history of read-once-only branching programs we should mention a paper by Fortune, Hopcroft and Schmidt [FHS]. In the context of program schemes, they gave an $\exp(c\sqrt{n})$ lower bound for computing an explicit function by read-once-only branching programs satisfying the additional restriction that the variables have to be examined in precisely the same order along each computation path. Without this restriction, however, their function is computable by a read-once-only branching program of polynomial size and is indeed defined by such a program.

Wegener [We] and Zák [Za] independently prove an $\exp(c\sqrt{n})$ lower bound for read-once-only branching programs computing certain, clique related graph properties. Wegener's property is NP-complete (presence of a clique of size $v/2$ where v is the number of vertices), Zák's is polynomial time decidable (recognizing the graphs that consist of a clique of size $v/2$ and $v/2$ isolated vertices.) We shall improve the lower bound to C^n (for a different function, also a polynomial time decidable graph property) (Section 3).

1.4. Space-complexity: the eraser RAM

It has been noted ([Ma], [BFKLT], [Pu]) that a lower bound $S(n)$ on the size of the smallest branching program computing a Boolean function f_n of n variables implies an $\Omega(\log S(n))$ lower bound on the space complexity of the family $\{ f_n : n = 1, 2, \dots \}$ on any reasonable model of computation.

The Fortune-Hopcroft-Schmidt result mentioned above corresponds to *on-line space complexity:* the input bits are read once and in a given order only. The [FHS] result provides an $\Omega(\sqrt{n})$ space lower bound for such computation (independently of the given order of input bits).

General read-once-only branching programs suggest the following machine model which we call *eraser RAM.* This is a RAM with a special read-only input tape. The machine decides in the course of the computation in what order to read the input but once an input cell has been read, it is erased. Let us measure the space required by a computation by the number of *bits* stored at any given time on the worktape.

The following is immediate.

Proposition. *If a language L can be recognized by an eraser RAM in space $S(n)$ then the set $L_n = L \cap \{ 0, 1 \}^n$ can be recognized by a read-once-only branching program of size* $\exp(O(S(n))$.

The results of Wegener and Zák thus imply an $\Omega(\sqrt{n})$ lower bound for the eraser RAM space complexity of their respective Boolean functions. Our result implies a linear lower bound on the same model.

2. Bounded width branching programs: the result

The value of a symmetric Bolean function f is fully determined by the sum of the input variables. Let $N(f)$ denote the set of those integers from zero to n corresponding to output 1.

The term "almost all symmetric Boolean functions" refers to a $(1 - o(1))$ fraction of the 2^n possible choices of the set $N(f)$.

We shall prove a lower bound for a class of of symmetric Boolean functions. This class includes almost all symmetric functions as well as the following constructive example: Let p be a prime, $n^{1/4} < p < n^{1/3}$, and let $N(f)$ consist of the quadratic residues mod p.

Theorem. *Let f be almost any symmetric Boolean function or the example given above. Suppose a leveled branching program of width $< (\log n)^c$ computes f where c is an arbitrary constant. Then the size of this branching program is at least $n \log n / C \log \log n$ for some positive constant C.*

Comments. C1. In a more complete version of this paper, we shall improve the lower bound to $\Omega(n \log n)$, using the method of the present proof iteratively.

C2. The constraint that a program of width w is *leveled* can be eliminated at the cost of reducing the size bound by a factor of w. This makes no difference for bounded width programs but is not permissible in our more general case.

C3. We hope that it will be possible to eliminate both the width constraint and the restriction of leveledness and still obtain a reasonable lower bound (say $\Omega(n\sqrt{\log n})$).

Proof. For a contradiction, we shall assume that a branching program of size $N < \varepsilon n \log n / \log\log n$ computes our Boolean function, where ε is a small constant to be specified later.

At the cost of adding at most 2 to the width and at most tripling the size, we may assume that all terminal nodes are on the last level.

We say that two sets A, B of variables are *levelwise disjoint* if no $x_i \in A$ and $x_j \in B$ appear on the same level of the program. (In particular, these sets must be disjoint.) Given such a pair of sets, we define A-levels and B-levels inductively: a level is an A-level if it has no B-nodes and either it has at least one A-node or it is the first level or the preceding level is an A-level. Otherwise it is a B-level. An *alternation* occurs at level L if L is either the first level or the last level or L is an A-level followed by a B-level or conversely.

Lemma 1. *There exist levelwise disjoint sets A, B of variables such that $|A| = |B| > n^{1-5\varepsilon}$, and the number of alternations is less than $2\varepsilon \log n / \log\log n$.*

Proof. Let H be the set of those variables which appear as node labels no more than $2N/n$ times. Clearly, $|H| \geq n/2$.

Let us now divide the levels of the branching program into $k = \log^2 n$ blocks $B_1, \ldots, B_k$ such that each block contains at most $2N/k$ nodes. With each variable $x_i \in H$ we associate a $(0,1)$-string $\mathrm{code}(x_i) = \alpha = \alpha_1 \ldots \alpha_k$ where $\alpha_j = 1$ precisely if x_i appears as a node label in block B_j. For each variable in H, the number of 1's in a code string is at most $2N/n \leq 2\varepsilon \log n / \log\log n$, therefore the number of distinct code strings for H is at most $k^{2N/n} = n^{4\varepsilon}$. Let α be the most frequent code string for H and let $A' \subset H$ be the set of those variables with code α. We have $|A'| \geq n^{1-4\varepsilon}/2$; let $A \subset A'$ have cardinality $|A| = n^{1-5\varepsilon}$.

A block B_i is an α-block if $\alpha_i = 1$. The number of nodes in the union of the α-blocks is at most

$$4N^2/nk \leq 4\varepsilon^2 n/(\log\log n)^2 < n/4.$$

Let K be the set those variables appearing in α-blocks. ($K \supseteq A$.)

Now, let us consider the codes of those, at least $n/4$, variables not in $H \cup K$. They will all be disjoint from α. Using the most frequent code β we obtain, as before, a set B of variables, $|B| = n^{1-5\varepsilon}$, queried in β-blocks only. The number of alternations between A-blocks and B-blocks is at most $2N/n$. ∎

Let $m = |A| = |B| = n^{1-5\varepsilon}$. Let us set all the variables not in $A \cup B$ to zero. We are left with a set of 2^{2m} possible truth assignments.

Let $\delta = \varepsilon c/(1-6\varepsilon)$.

Lemma 2. *There exist a set E of $\geq m^{-\delta} 2^{m+1}$ truth assigments to A and a set F of $\geq m^{-\delta} 2^{m+1}$ truth assignments to B such that all truth assignments from the set $E \times F$ assign the same value to f.*

Proof. Let $L_0, \ldots, L_s$ be those levels where alternation occurs (including the first and the last levels). Select nodes $l_i \in L_i$ inductively as follows.

Let l_0 be the START node. To define l_i, consider the set $T(i-1)$ of all truth assignments defining computation paths which pass through $l_0, \ldots, l_{i-1}$. Let l_i be a node in L_i to which at least $|T(i-1)|/|L_i|$ of these truth assignments lead.

If w denotes the width of the program then $T(i) \geq w^{-i}2^{2m}$. Moreover, the set $T(i)$ is clearly a Cartesian product $T(i) = E(i) \times F(i)$ where $E(i)$ is a set of truth assignments $A \to \{0,1\}$ and $F(i)$ is a set of truth assignments $B \to \{0,1\}$. Let $E = E(s)$, $F = F(s)$. Clearly, $|E|, |F| \geq w^{-(s+1)/2}2^m$. Now, $w \leq (\log n)^c$ and $s \leq 2\varepsilon \log n / \log\log n$ therefore $w^s \leq n^{2\varepsilon c}$ and $|E|, |F| \geq n^{-2\varepsilon c}2^m \geq m^{-\delta}2^{m+1}$. The node l_s determines the value of f on $E \times F$. ∎

The independence of assigning truth values to the variables in A and in B is our main structural tool. Let $N(E)$ stand for the set of those integers which occur as the number of A-variables evaluated to 1 by some truth assignment in E. We define $N(F)$ similarly. By possibly interchanging f with its negation, we obtain:

Observation 3. *$N(E) + N(F)$ is a subset of $N(f)$.* ∎

Let q be an integer, $n^{1/4} < 2q + 1 < n^{1/3}$.

We observe that in some interval of length q, the set $N(E)$ cannot be too sparse, and the same holds for $N(F)$. This is a consequence of the following observation.

Lemma 4. *Let $u_0 \leq \ldots \leq u_d$ be a nondecreasing sequence of positive numbers and $\sigma = \sum_{i=0}^{d} u_i$. Let further $\lambda > 0$ and $\epsilon_0, \ldots, \epsilon_d$ be nonnegative coefficients such that $\sum_{i=0}^{d} \epsilon_i u_i \geq 2\lambda\sigma$. Then, for each positive integer $k \leq \sigma/u_d$, there exists an interval I of k consecutive integers such that $\sum_{i\in I} \epsilon_i > \lambda k$.*

Proof. Let us extend the definitions of the u_i and the ϵ_i to all integral subscripts, setting $u_i = \epsilon_i = 0$ for subscripts $i < 0$ and $i > d$. Let $\alpha_i = \sum_{t=0}^{\infty}(u_{i-kt} - u_{i-kt-1})$. Clearly, $\sum_{j=i-k+1}^{i} \alpha_j = u_i$, and for $j \leq d$ we have $\alpha_j \geq 0$. For $j < 0$, $\alpha_j = 0$.

Assume, for a contradiction, that $\sum_{i=j}^{j+k-1} \epsilon_i \leq \lambda k$ for every j. It follows that $\lambda k \sum_{j=0}^{d} \alpha_j \geq \sum_{j=-\infty}^{\infty} \alpha_j \sum_{i=j}^{j+k-1} \epsilon_i = \sum_{i=0}^{d} \epsilon_i \sum_{j=i-k+1}^{i} \alpha_j = \sum_{i=0}^{d} \epsilon_i u_i \geq 2\lambda\sigma$ and therefore $\sum_{j=0}^{d} \alpha_j \geq 2\sigma/k$.

On the other hand, $\sum_{j=0}^{d} \alpha_j = \sum_{t=0}^{\infty} \sum_{j=d-(t+1)k+1}^{d-tk} \alpha_j = \sum_{t=0}^{\infty} u_{d-tk} < u_d + \sigma/k$.

A combination of the last two inequalities yields $k > \sigma/u_d$, a contradiction. ∎

Corollary 5. *Let M be the set of integers $\{1, \ldots, m\}$ and let G be a subset of 2^M. Suppose $|G| \geq \lambda 2^{m+1}$ where $0 \leq \lambda \leq 1$. Let $k < \sqrt{m}/2$ be a positive integer. Then there exists an interval I of length k in M such that $N(G)$ contains at least λk members of I. Here $N(G)$ is the set of cardinalities of sets in G.*

Proof. Without loss of generality we may assume that sets of size $\leq m/2$ comprise the greater half of $|G|$. Let us now apply Lemma 4 to the sequence $u_i = \binom{m}{i}$, $i \leq m/2$, with coefficients $\epsilon_i = 1$ if $|X| = i$ for some $X \in G$; $\epsilon_i = 0$ otherwise. ∎

An application of Corollary 5 with $\lambda = m^{-\delta}$ to both E and F yields intervals I, J of length q in M such that, setting $P = I \cap N(E)$ and $Q = J \cap N(F)$, we obtain

(a) $|P|, |Q| > q^{1-\delta}$;
(b) $P + Q$ is a subset of $N(f)$.

Assuming $\delta < 1/2$ (i.e. $\epsilon < 1/(2c+6)$), one can show, using the method of trigonometric sums, that this situation is impossible for most sets $N(f)$ and in particular in the

case hen $p = 2q - 1$ is a prime and $N(f)$ consists of the quadratic residues (nonresidues) mod p. (See [Va] or [Vi] as general references for the method of trigonometric sums.)

Let $R = N(f) \cap (I + J)$. Note that $I + J$ is an interval of length p.

According to (b), the equation

$$x + y = z, \qquad x \in P, \quad y \in Q, \quad z \in R \tag{1}$$

has $|P||Q|$ solutions. We show that the actual number of solutions is substantially less: approximately $|P||Q||R|/p$ only, assuming certain bound for the discrete Fourier coefficients of R. This bound is valid for most sets including such random-looking explicit ones as quadratic residues mod p.

Note that by our definition of the sets P, Q and R, the solutions of (1) are precisely the solutions of the congruence

$$x + y \equiv z \bmod p, \qquad x \in P, \quad y \in Q, \quad z \in R. \tag{2}$$

For a finite set T of integers mod p, let

$$\varphi_T(j) = \sum_{t \in T} \omega^{tj} \qquad (j = 0, \dots, p-1) \tag{3}$$

where $\omega = \exp(2\pi i/p)$ is a primitive p^{th} root of unity. Let

$$\Phi_T = \max_{1 \le j \le p-1} |\varphi_T(j)|. \tag{4}$$

Although the method of trigonometric sums has been widely used in additive number theory, the following simple lemma does not seem to have been stated explicitly. A similar lemma (with a similar comment) appears in Ruzsa [Ru].

Lemma 6. *Let ν denote the number of solutions of (2) where P, Q and R are arbitrary sets of* mod p *residue classes for a positive integer p (not necessarily prime). Then*

$$|\nu - \frac{|P||Q||R|}{p}| \le \Phi_R \sqrt{|P||Q|}. \tag{5}$$

Proof. The number of solutions of (2) is precisely

$$\frac{1}{p} \sum_{j=0}^{p-1} \varphi_P(j) \varphi_Q(j) \varphi_R(-j). \tag{6}$$

The dominant term here corresponds to $j = 0$ and gives the expected number $|P||Q||R|/p$. In order to estimate the error term, we observe that for any set T,

$$\sum_{j=0}^{p-1} |\varphi_T(j)|^2 = p|T| \tag{7}$$

(because the matrix $(\omega^{ij}/\sqrt{p})_{p\times p}$ is unitary).

The error term is

$$\frac{1}{p}\sum_{j=1}^{p-1}|\varphi_P(j)\varphi_Q(j)\varphi_R(-j)| \le \frac{1}{p}\Phi_R\sum_{j=0}^{p-1}|\varphi_P(j)||\varphi_Q(j)|.$$

We estimate the right hand side using the Cauchy inequality and the above identity. We obtain that the error term is

$$\le \frac{1}{p}\Phi_R((\sum_{j=0}^{p-1}|\varphi_P(j)|^2)(\sum_{j=0}^{p-1}|\varphi_Q(j)|^2))^{1/2} = \Phi_R(|P||Q|)^{1/2}. \qquad \blacksquare$$

It is easy to see that $\Phi_R = O(\sqrt{p\log p})$ for almost every set R and $\Phi_R \le (1+\sqrt{p})/2$ when p is a prime and R is the set of quadratic residues (non-residues). Therefore Lemma 6 implies that the contribution of the error terms is indeed negligible, thus completing the proof of the Theorem. $\blacksquare$

3. Read-once-only branching programs: the result

Let $n = \binom{v}{2}$ and let us fix a bijection between the set $\{1,\dots,n\}$ and the set of pairs from $\{1,\dots,v\}$. Each string $x = x_1\dots x_n \in \{0,1\}^n$ can be thought of as representing a graph $G(x)$ on the vertex set $\{1,\dots,v\}$. The value of each input variable corresponds to the presence or absence of an edge between a given pair of vertices in $G(x)$.

Let $f_n(x)$ denote the number of triangles in $G(x)$ modulo 2.

Theorem. *There exists a positive constant α such that every read-once-only branching program computing f_n has size at least $2^{\alpha n}$.*

First we outline the idea of the proof.

We shall use the term "edge" to mean any of the $\binom{v}{2}$ pairs of vertices. (These are the edges of the complete graph K_v.) Let P be a path in a branching program. We shall say that an arc of P labeled 1 from a node labeled x_e has the effect of *accepting* the edge e; the arc labeled 0 from the same node *rejects* e. The edges accepted by P form the graph $A(P)$, the rejected edges form the graph $R(P)$. The union of these two edge sets constitutes the set $D(P)$ of edges *determined* by P.

Assume f_n is computed by a read-once-only branching program of size less than $2^{\varepsilon n}$ for some appropriately selected small positive constant ε. From this assumption we shall derive

(8) *the existence of a node w in the program, two paths P_0 and P_1 both leading from START to w, and an edge e not determined by either P_i, such that the parity of the number of triangles containing e in the graph $A(P_i)$ is i.*

The read-once-only property implies that after w, the program follows the same path of computation for input graphs $A(P_0)\cup e$ and $A(P_1)\cup e$ and thus leads to the same terminal node. This means these two graphs have the same number of triangles mod 2; the same holds for $A(P_0)$ and $A(P_1)$. This contradicts the choice of the P_i and e.

We proceed to showing how w, e, P_0, and P_1 satisfying (8) are found.

The *depth* of a node is its distance from START.

Proposition 1. *Let P be a path from START to a terminal node. If three edges are undetermined by this path, they cannot form a triangle.*

Proof. Suppose, to the contrary, that the edges e_1, e_2, e_3 of a triangle are left undetermined by P. Then the parity of the number of triangles in each graph $A(P) \cup e_i$ must agree with the parity of the number of triangles in $A(P)$. But then adding all the three edges at once will change the parity, a contradiction. ∎

Corollary 2. *The depth of each terminal node is at least $v(v-2)/4$.*

Proof: by Turán's Theorem in graph theory (cf. [Lo, Probl.10.30,34]). Any path of length less than $v(v-2)/4$ leaves more than $v^2/4$ edges undetermined, forcing the graph of undetermined edges to contain a triangle. ∎

It follows that for any constant $c < 1/4$, there are precisely 2^{cn} computation paths of length cn beginning at START. Consequently there exists a node w such that at least $2^{(c-\varepsilon)n}$ paths of length cn connect START to w.

Let us fix c at a quite small value; any $c \leq 10^{-5}$ will be safe. Then, ε must be even smaller; let us set $\varepsilon = c^{3/2}$.

Using w as a "checkpoint", we shall classify the edges according to their status at the time various computation paths pass through w. We shall see that these classes exhibit a strong structure.

Let D denote the set of edges determined by at least one path from START to w. Let U denote the set of the remaining (undetermined) edges; $|D| + |U| = n$.

Proposition 3. *Let P be any path from START to w. It is impossible that three edges e_1, e_2, e_3 form a triangle, where $e_1 \in D - D(P)$, $e_2, e_3 \notin D(P)$.*

Proof. The proof is similar to that of Proposition 1. Suppose the contrary. The read-once-only property implies that e_1 is not tested along any path starting at w and therefore the parity of the number of triangles in $A(P)$ and $A(P) \cup \{ e_1 \}$ is the same. In other words, e_1 is contained in an even number of triangles in $A(P) \cup \{ e_1 \}$. Similarly we infer that the number of triangles containing e_1 in the graph $A(P) \cup \{ e_1, e_2, e_3 \}$ is even. But this number is precisely one greater than the number just shown to be even, a contradiction. ∎

Let AR denote the set of those edges which are accepted along some path from START to w and are rejected along some other. Clearly, $AR \subseteq D$.

Proposition 4. *There is no triangle e_1, e_2, e_3 with $e_1 \in AR$, $e_2, e_3 \in U$.*

Proof: a parity argument similar to the proofs of Propositions 1 and 3. ∎

One can deduce from Proposition 3 that most edges determined along any path between START and w are actually determined along P, i.e. the set $D - D(P)$ is small. Moreover, most edges determined by some path to w are both accepted and rejected along paths to w, i.e. $D - AR$ is a small set. More specifically:

Lemma 5. (a) $|D - D(P)| < 3c^{3/2}n$.
(b) $|U| > (1 - c - 3c^{3/2})n$.
(c) $|AR| \geq (c - \varepsilon)n$.
(d) $|D - AR| \leq 4c^{3/2}n$.

Proof. For a set A of edges, let $\deg_A(p)$ denote the degree of p with respect to the graph formed by A.

(a) Let $e = pq$ be any edge in $D - D(P)$. By Proposition 3, every vertex is adjacent in $D(P)$ to at least one end of e. Therefore,

$$\deg_{D(P)}(p) + \deg_{D(P)}(q) \geq (v-2).$$

Adding up these inequalities for all $pq \in D - D(P)$ we obtain

$$\sum_p \deg_{D-D(P)}(p)\deg_{D(P)}(p) \geq (v-2)|D - D(P)|. \tag{9}$$

On the other hand, also by Proposition 3, the neighborhood in $D - D(P)$ of any vertex p induces a clique in $D(P)$. Therefore

$$\binom{\deg_{D-D(P)}(p)}{2} \leq |D(P)| = cn = c\binom{v}{2}.$$

Consequently,

$$\deg_{D-D(P)}(p) \leq 1 + c^{1/2}v. \tag{10}$$

Combining (9) and (10),

$$|D - D(P)| \leq \frac{1 + c^{1/2}v}{v-2} \sum_p \deg_{D(P)}(p) = \frac{2 + 2c^{1/2}v}{v-2}|D(P)| \leq 3c^{3/2}n.$$

(b) follows immediately from (a) since $|U| = n - |D|$.

(c) Clearly, the logarithm of the number of START-to-w paths is a lower bound for $|AR|$.

(d) By (a), $|D| \leq |D - D(P)| + |D(P)| \leq 3c^{3/2}n + cn$. Combining this inequality with (c) we obtain $|D - AR| \leq (\varepsilon + 3c^{3/2})n = 4c^{3/2}n$. ∎

Lemma 5(b) implies that the graph U has a vertex p_0 of degree greater than $d = (1 - c - 4c^{3/2})v$. Let S be a set of precisely d neighbors of p_0 in U and let T be the complement of S ($|T| + |S| = v$).

Proposition 4 implies that no edge in AR has both of its endpoints in S. From this, it follows that AR is "mostly" bipartite, with bipartition (S, T). We can actually deduce even more structure: most vertices in T are adjacent in AR to either almost all or to almost no vertices in S (about half of the vertices will satisfy each alternative). More precisely, let us divide T into three classes, T_0, T_1, T_2. We shall refer to a moderately large constant K, $20 \leq K \leq 1/(8c^{1/2})$.

Let T_0 consist of those $p \in T$ which have more than $Kc^{1/2}v$ neighbors in S in the graph $D - AR$. We put $p \in T - T_0$ into T_1 or T_2 according to whether p has more AR-neighbors in S than U-neighbors or not. Let $\deg^S_{AR}(p)$ denote the number of AR-neighbors of p in S and analogously for other classes.

Lemma 6. (a) $|T_0| < 2cv/K$.
(b) *For each* $p \in T_1$, $\deg_U^S(p) \le 5c^{3/2}v$.
(c) *For each* $p \in T_2$, $\deg_{AR}^S(p) \le 5c^{3/2}v$.

Proof. By Lemma 5(d),

$$|T_0|Kc^{1/2}v \le |D - AR| \le 4c^{3/2}n.$$

Claim (a) is now immediate.

To prove (b) and (c), let $p \in T - T_0$. Let N_1 and N_2 denote the sets of U-neighbors and AR-neighbors of p in S, resp.; let $n_i = |N_i|$. Since $p \notin T_0$, we have

$$n_1 + n_2 \ge |S| - Kc^{1/2}v > 6v/7. \tag{11}$$

On the other hand, by Proposition 4, all edges between N_1 and N_2 belong to $D - AR$. By Lemma 5(d) it follows that $n_1 n_2 \le 4c^{3/2}n < 2c^{3/2}v^2$. Consequently,

$$\min\{n_1, n_2\} \le \frac{2n_1n_2}{n_1 + n_2} < 5c^{3/2}v. \qquad \blacksquare$$

Let X denote the set of AR-edges between T_1 and S.

Corollary 7. (a) $(1 - \frac{8c}{K})cv/2 \le |T_1| \le (1 + 4c^{1/2})cv/2$.
(b) $|AR - X| < \frac{3c}{K}v^2$.

Proof. We begin with (b). Clearly,

$$|AR - X| < |T|^2 + |T_2|\max_{p \in T_2} \deg_{AR}^S(p) + |T_0||S|.$$

By definition, $|T| \le (c + 4c^{3/2})v$. We use Lemma 6(c) to estimate the second term and Lemma 6(a) and the fact $|S| < v$ for the last term.

For the upper bound in (a), we obtain from Lemma 6(b) that

$$|T_1| \le \frac{|D|}{\min_{p \in T_1} \deg_D^S(p)} \le \frac{|D|}{|S| - 5c^{3/2}v}.$$

Lemma 5(a) provides the bound $|D| \le (c + 3c^{3/2})n$. By the definition of S (after the proof of Lemma 5), $|S| = (1 - c - 4c^{3/2})v$. A combination of these estimates yields the desired upper bound.

For the lower bound we first observe that $|X| > (c - \varepsilon - 7c/K)v^2/2 > (1 - 8/K)cv^2/2$. This follows from Lemma 5(c) and part (b) of this Corollary. On the other hand, trivially, $|T_1| \ge |X|/v$. $\blacksquare$

The structural consequence of Lemma 6 and Corollary 7 for the AR graph is that the subgraph X induced between T_1 and S is a nearly complete bipartite graph, and X contains almost all edges of AR.

In order to focus on X, let us make a decision on the value of each input variable (edge) in $AR - X$. There are $2^{|AR-X|} < 2^{(3/K)cv^2}$ possible outcomes (by Corollary 7(b)). Let us choose the one that is the most frequent among the START to w computation paths. Having fixed these values,we still have at least

$$2^{(c-\varepsilon)n-(3/K)cv^2} > 2^{\frac{c}{2}v^2(1-7/K)} \tag{12}$$

computation paths left. Let Π denote the set of these paths:

$$\log|\Pi| \geq \frac{c}{2}v^2(1-7/K). \tag{13}$$

(The base of the log is 2.)

Let $t = |T_1|$ and $s = |S|$. We see, that $\log|\Pi|$ is nearly ts. In order to complete the proof, we show, that, unless situation (8) arises, the number of subgraphs of X arising from paths $P \in \Pi$ must be substantially less than 2^{ts}: only about $2^{ts/2}$. This is impossible because different paths define different subgraphs of X. (This in turn is true since the possible branchings on variables in $AR - X$ have been eliminated.)

The proof is based on a counting lemma in mod 2 linear algebra.

Let A, B, C be $(0,1)$-matrices of the same dimensions.

We shall say that $A \equiv C \bmod B$ if for every i, j, $B[i,j] = 0$ implies $A[i,j] = C[i,j]$.

Lemma 8. *Let $A_1, \ldots, A_N$ be $t \times s$ matrices over the two-element field $GF(2)$. Let further B and C be $s \times s$ matrices over $GF(2)$. Let β be the number of 1's in B. Assume that $A_i^T A_i \equiv C$ mod B for every i. Then*

$$\log N < \beta + \frac{t}{2}(s + t + \log s). \tag{14}$$

Proof. First we estimate the number of $t \times s$ matrices of rank $\leq t/2$ over $GF(2)$. There are less than $2^{t^2/2}$ possible choices of the column space. Given the column space of dimension $\leq t/2$, there are $\leq 2^{t/2}$ choices for each column, giving a total of $\leq 2^{t(s+t)/2}$ matrices.

Next, we estimate the number of those A_i having rank $> t/2$. Such a matrix has a set of $t/2$ linearly independent columns; they are positioned in any of $\binom{s}{t/2} < s^{t/2}$ ways. Let us fix their positions, say columns $1, \ldots, t/2$, and decide their entries. Let us estimate, how many ways the remaining columns can be filled. For each pair (i,j) where $1 \leq j \leq t/2 < i \leq s$ and $B[i,j] = 0$, we have a linear condition $\sum_{k=1}^{t} x_{ik}A[k,j] = C[i,j]$ for the prospective entries x_{ik}. All these equations are linearly independent and their number is $\geq t(2s-t)/4 - \beta$. This reduces the number of candidates (2^{ts}) by a factor of $2^{-t(2s-t)/4+\beta}$. The number of those A_i of rank $> t/2$ is thus

$$< s^{t/2}2^{ts-t(2s-t)/4+\beta} = 2^{\beta+\frac{t}{2}(s+\frac{t}{2}+\log s)}. \tag{15}$$

Add the bound $2^{t(s+t)/2}$ on the number of low rank matrices to this; the figure in (14) is a generous overestimate of logarithm of the sum. ∎

Let now $s = |S|$, $t = |T_1|$ and for each $P \in \Pi$ let A_P be the $t \times s$ adjacency matrix of the bipartite subgraph of X defined by P. (This graph is the restriction to $T_1 \times S$ of $A(P)$.) Let B be the $s \times s$ adjacency matrix of the induced subgraph of $D - AR$ on S. (Recall that the complement, relative to S, of this graph belongs entirely to U by Proposition 4.) Observe that the entries of $A_P^T A_P$ count the number of common neighbors of each pair of vertices in S. The falsity of (8) is thus precisely the statement that all the $A_P^T A_P \equiv C \bmod B \bmod 2$ for some fixed $s \times s$ matrix C. The number of 1's in B is $\beta = |D - AR| \leq 4c^{3/2}n < 2c^{3/2}v^2$ by Lemma 5(b). Using the upper bound of Lemma 7(a) for t we now infer from Lemma 8 that

$$(16) \qquad \log|\Pi| < \beta + \frac{t}{2}(s + t + \log s) < \beta + \frac{t}{2}(v + \log v) < \frac{c}{4}v^2(1 + 12c^{1/2} + \frac{2\log v}{v}).$$

This contradicts (13) for large v, completing the proof of the Theorem. ∎

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