Synthesis of Reversible Logic Circuits

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Abstract—Reversible or information-lossless circuits have applications in digital signal processing, communication, computer graphics, and cryptography. They are also a fundamental requirement in the emerging field of quantum computation. We investigate the synthesis of reversible circuits that employ a minimum number of gates and contain no redundant input-output line-pairs (temporary storage channels). We prove constructively that every even permutation can be implemented without temporary storage using NOT, CNOT, and TOFFOLI gates. We describe an algorithm for the synthesis of optimal circuits and study the reversible functions on three wires, reporting the distribution of circuit sizes. We also study canonical circuit decompositions where gates of the same kind are grouped together. Finally, in an application important to quantum computing, we synthesize oracle circuits for Grover's search algorithm, and show a significant improvement over a previously proposed synthesis algorithm.

Index Terms—Circuit optimization, combinational logic circuits, logic synthesis, quantum computing, reversible circuits.

I. INTRODUCTION

N MOST computing tasks, the number of output bits is relatively small compared with the number of input bits. For example, in a decision problem, the output is only one bit (yes or no) and the input can be as large as desired. However, computational tasks in digital signal processing, communication, computer graphics, and cryptography require that all of the information encoded in the input be preserved in the output. Some of those tasks are important enough to justify adding new microprocessor instructions to the HP PA-RISC (MAX and MAX-2), Sun SPARC (VIS), PowerPC (AltiVec), IA-32, and IA-64 (MMX) instruction sets [13], [18]. In particular, new bit-permutation instructions were shown to vastly improve performance of several standard algorithms, including matrix transposition and DES, as well as two recent cryptographic algorithms Twofish and Serpent [13]. Bit permutations are a special case of reversible functions, that is, functions that permute the set of possible input values. For example, the butterfly operation $(x,y) \rightarrow (x+y,x-y)$ is reversible but is not a bit permutation. It is a key element of fast Fourier transform algorithms and has been used in application-specific Xtensa processors from Tensilica. One might expect to get further

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speed-ups by adding instructions to allow computation of an arbitrary reversible function. The problem of chaining such instructions together provides one motivation for studying reversible computation and reversible logic circuits, that is, logic circuits composed of gates computing reversible functions.

Reversible circuits are also interesting because the loss of information associated with irreversibility implies energy loss [2]. Younis and Knight [22] showed that some reversible circuits can be made asymptotically energy-lossless as their delay is allowed to grow arbitrarily large. Currently, energy losses due to irreversibility are dwarfed by the overall power dissipation, but this may change if power dissipation improves. In particular, reversibility is important for nanotechnologies where switching devices with gain are difficult to build.

Finally, reversible circuits can be viewed as a special case of quantum circuits because quantum evolution must be reversible [14]. Classical (nonquantum) reversible gates are subject to the same "circuit rules," whether they operate on classical bits or quantum states. In fact, popular universal gate libraries for quantum computation often contain as subsets universal gate libraries for classical reversible computation. While the speed-ups which make quantum computing attractive are not available without purely quantum gates, logic synthesis for classical reversible circuits is a first step toward synthesis of quantum circuits. Moreover, algorithms for quantum communications and cryptography often do not have classical counterparts because they act on quantum states, even if their action in a given computational basis corresponds to classical reversible functions on bit-strings. Another connection between classical and quantum computing comes from Grover's quantum search algorithm [6]. Circuits for Grover's algorithm contain large parts consisting of NOT, CNOT, and TOFFOLI gates only [14].

We review existing work on classical reversible circuits. Toffoli [20] gives constructions for an arbitrary reversible or irreversible function in terms of a certain gate library. However, his method makes use of a large number of temporary storage channels, i.e., input-output wire-pairs other than those on which the function is computed (also known as ancilla bits). Sasao and Kinoshita show that any conservative function [f(x)]is conservative if x and f(x) always contain the same number of 1's in their binary expansions] has an implementation with only three temporary storage channels using a certain fixed library of conservative gates, although no explicit construction is given [16]. Kerntopf uses exhaustive search methods to examine small-scale synthesis problems and related theoretical questions about reversible circuit synthesis [9]. There has also been much recent work on synthesizing reversible circuits that implement nonreversible Boolean functions on some of their outputs, with the goal of providing the quantum phase shift

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operators needed by Grover's quantum search algorithm [8], [12], [21]. Some work on local optimization of such circuits via equivalences has also been done [8], [12]. In a different direction, group theory has recently been employed as a tool to analyze reversible logic gates [19] and investigate generators of the group of reversible gates [5].

Our paper pursues synthesis of optimal reversible circuits which can be implemented without temporary storage channels. In Section III, we show by explicit construction that any reversible function which performs an even permutation on the input values can be synthesized using the CNTS (CNOT, NOT, TOFFOLI, and SWAP) gate library and no temporary storage. An arbitrary (possibly odd) permutation requires, at most, one channel of temporary storage for implementation. By examining circuit equivalences among generalized CNOT gates, we derive a canonical form for CNT-circuits. In Section IV, we present synthesis algorithms for implementing any reversible function by an optimal circuit with gates from an arbitrary gate library. Besides branch-and-bound, we use a dynamic programming technique that exploits reversibility. While we use gate count as our cost function throughout, this method allows for many different cost functions to be used. Applications to quantum computing are examined in Section V.

II. BACKGROUND

In conventional (irreversible) circuit synthesis, one typically starts with a universal gate library and some specification of a Boolean function. The goal is to find a logic circuit that implements the Boolean function and minimizes a given cost metric, e.g., the number of gates or the circuit depth. At a high level, reversible circuit synthesis is just a special case in which no fanout is allowed and all gates must be reversible.

A. Reversible Gates and Circuits

Definition 1: A gate is reversible if the (Boolean) function it computes is bijective.

If arbitrary signals are allowed on the inputs, a necessary condition for reversibility is that the gate have the same number of input and output wires. If it has k input and output wires, it is called a $k \times k$ gate, or a gate on k wires. We will think of the mth input wire and the mth output wire as really being the same wire. Many gates satisfying these conditions have been examined in the literature [15]. We will consider a specific set defined by Toffoli [20].

Definition 2: A k-CNOT is a $(k+1) \times (k+1)$ gate. It leaves the first k inputs unchanged, and inverts the last if and only if all others are 1. The unchanged lines are referred to as control lines.

Clearly, the k-CNOT gates are all reversible. The first three of these have special names. The zero-CNOT is just an inverter or NOT gate, and is denoted by N. It performs the operation $(x) \rightarrow (x \oplus 1)$, where \oplus denotes XOR. The one-CNOT, which performs the operation $(y, x) \rightarrow (y, x \oplus y)$ is referred to as a Controlled-NOT [7], or CNOT (C). The two-CNOT is normally called a TOFFOLI (T) gate, and performs the operation $(z, y, x) \rightarrow (z, y, x \oplus yz)$. We will also be using another reversible gate, called the SWAP (S) gate. It is a 2 × 2 gate which

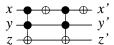


Fig. 1. 3×3 reversible circuit with two T gates and two N gates.

x	у	z	<i>x</i> ′	y'	z'
0	0	0	0	0	0
0	0	1	0	0	1
0	1	0	0	1	1
0	1	1	0	1	0
1	0	0	1	0	0
1	0	1	1	0	1
1	1	0	1	1	1
1	1	1	1	1	0

Fig. 2. Truth table for the circuit in Fig. 1.

exchanges the inputs; that is, $(x, y) \rightarrow (y, x)$. One reason for choosing these particular gates is that they appear often in the quantum computing context, where no physical "wires" exist, and swapping two values requires nontrivial effort [14]. We will be working with circuits from a given, limited-gate library. Usually, this will be the CNTS gate library, consisting of the CNOT, NOT, and TOFFOLI, and SWAP gates.

Definition 3: A well-formed reversible logic circuit is an acyclic combinational logic circuit in which all gates are reversible, and are interconnected without fanout.

As with reversible gates, a reversible circuit has the same number of input and output wires; again we will call a reversible circuit with n inputs an $n \times n$ circuit, or a circuit on n wires. We draw reversible circuits as arrays of horizontal lines representing wires. Gates are represented by vertically-oriented symbols. For example, in Fig. 1, we see a reversible circuit drawn in the notation introduced by Feynman [7]. The \oplus symbols represent inverters and the \bullet symbols represent controls. A vertical line connecting a control to an inverter means that the inverter is only applied if the wire on which the control is set carries a 1 signal. Thus, the gates used are, from left to right, TOFFOLI, NOT, TOFFOLI, and NOT.

Since we will be dealing only with bijective functions, i.e., permutations, we represent them using the cycle notation where a permutation is represented by disjoint cycles of variables. For example, the truth table in Fig. 2 is represented by (2,3)(6,7) because the corresponding function swaps 010 (2) and 011 (3), and 110 (6) and 111 (7). The set of all permutations of n indexes is denoted S_n , so the set of bijective functions with n binary inputs is S_{2^n} . We will call (2,3)(6,7) CNT-constructible since it can be computed by a circuit with gates from the CNT gate library. More generally:

Definition 4: Let L be a (reversible) gate library. An L-circuit is a circuit composed only of gates from L. A permutation $\pi \in S_{2^n}$ is L-constructible if it can be computed by an $n \times n$ L-circuit.

Fig. 3(a) indicates that the circuit in Fig. 1(a) is equivalent to one consisting of a single C gate. Pairs of circuits computing the same function are very useful, since we can substitute one for the other. On the right, we see similarly that three C gates can

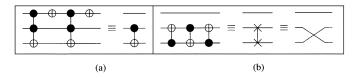


Fig. 3. Reversible circuit equivalences (a) $T_{1,2}^3 \cdot N^1 \cdot T_{1,2}^3 \cdot N^1 = C_2^3$ and (b) $C_3^2 \cdot C_3^2 \cdot C_3^2 = S^{2,3}$; subscripts identify "control bits" while superscripts identify bits whose values actually change.

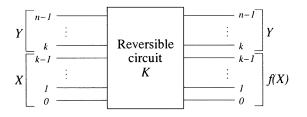


Fig. 4. Circuit C with n - k wires Y of temporary storage.

be used to replace the S gate appearing in the middle circuit of Fig. 3(b). If allowed by the physical implementation, the S gate may itself be replaced with a wire swap. This, however, is not possible in some forms of quantum computation [14]. Fig. 3, therefore, shows us that the C and S gates in the CNTS gate library can be removed without losing computational power. We will still use the CNTS gate library in synthesis to reduce gate counts and potentially speed up synthesis. This is motivated by Fig. 3, which shows how to replace four gates with one C gate, and, thus, up to 12 gates with one S gate.

Fig. 4 illustrates the meaning of "temporary storage" [20]. The top n - k lines transfer n - k signals, collectively designated Y, to the corresponding wires on the other side of the circuit. The signals Y are arbitrary in the sense that the circuit K must assume nothing about them to make its computation. Therefore, the output on the bottom k wires must be only a function of their input values X and not of the "ancilla" bits Y, hence, the bottom output is denoted f(X). While the signals Y must leave the circuit holding the same values they entered it with, their values may be changed during the computation as long as they are restored by the end. These wires usually serve as an essential workspace for computing f(X). An example of this can be found in Fig. 3(a): the C gate on the right needs two wires, but if we simulate it with two N gates and two T gates, we need a third wire. The signal applied to the top wire emerges unaltered.

Definition 5: Let L be a reversible gate library. Then, L is universal if for all k and all permutations $\pi \in S_{2^k}$, there exists some l such that some L-constructible circuit computes π using l wires of temporary storage.

The concept of universality differs in the reversible and irreversible cases in two important ways. First, we do not allow ourselves access to constant signals during the computation, and second, we synthesize whole permutations rather than just functions with one output bit.

B. Prior Work

It is a result of Toffoli's that the CNT gate library is universal; he also showed that one can bound the amount of temporary storage required to compute a permutation in S_{2^n} by n - 3. Indeed, much of the reversible and quantum circuit literature allows the presence of polynomially many temporary storage bits for circuit synthesis. Given that qubits are a severely limited resource in current implementation technologies, this may not be a realistic assumption. We are, therefore, interested in trying to synthesize permutations using no extra storage. To illustrate the limitations this puts on the set of computable permutations, suppose we restrict ourselves to the C gate library. The following results are well known in the quantum circuits literature [3], [15]. We provide proofs both for completeness and to accustom the reader to techniques we will require later.

Definition 6: A function $f : \{0,1\}^n \to \{0,1\}^m$ is linear if and only if $f(\mathbf{x} \oplus \mathbf{y}) = f(\mathbf{x}) \oplus f(\mathbf{y})$, where \oplus denotes bitwise XOR.

This is just the usual definition of linearity where we think of $\{0,1\}^n$ as a vector space over the two-element field \mathbb{F}_2 . In our paper, n = m because of reversibility. Thus, f can be thought of as a square matrix over \mathbb{F}_2 . The composition of two linear functions is a linear function.

Lemma 7: [3] Every C-constructible permutation computes an invertible linear transformation. Moreover, every invertible linear transformation is computable by a C-constructible circuit. No C-circuit requires more than n^2 gates.

Proof: To show that all C-circuits are linear, it suffices to prove that each C gate computes a linear transformation. Indeed, $C(x_1 \oplus y_1, x_2 \oplus y_2) = (x_1 \oplus y_1, x_1 \oplus y_1 \oplus x_2 \oplus y_2) = (x_1, x_1 \oplus y_1) \oplus (x_2, x_2 \oplus y_2) = C(x_1, y_1) \oplus C(x_2, y_2)$. In the basis $10 \dots 0, 01 \dots 0, \dots, 0 \dots 01$, a C gate with the control on the *i*th wire and the inverter on the *j*th applied to an arbitrary vector will add the *i*th entry to the *j*th. Thus, the matrices corresponding to individual C gates account for all the elementary row-addition matrices. Any invertible matrix in $GL(\mathbb{F}_2)$ can be written as a product of these. Thus, any invertible linear transformation can be computed by a C-circuit. Finally, any matrix over \mathbb{F}_2 may be row-reduced to the identity using fewer than n^2 row operations.

One might ask how inefficient the row-reduction algorithm is in synthesizing C-circuits. A counting argument can be used to find asymptotic lower bounds on the longest circuits [17].

Lemma 8: Let L be a gate library; let $K_n \subset S_{2^n}$ be the set of L-constructible permutations on n wires, and let k_i be the cardinality of K_i . Then, the longest gate-minimal L-circuit on nwires has more than $\log k_n / \log b$ gates, where b is the number of one-gate circuits on n wires. b = poly(n), so for large n, worst case circuits have length $\Omega(\log k_n / \log n)$.

Proof: Suppose the longest gate-minimal L-circuit has x - 1 gates. Then every permutation in K_n is computed by an L-circuit of, at most, x - 1 gates. The number of such circuits is $\sum_{i=1}^{x-1} b^i \leq b^x$. Therefore, $k_n < b^x$, and it follows that $x > \log k_n / \log b$.

Finally, let G be a gate in L with the largest number of inputs, say p. Then, on n wires, there are, at most, $n(n-1) \dots (n-p+1) < n^p$ ways to make a 1-gate circuit using G. If L has q gates in total, then $b \le qn^p = poly(n)$. Hence, $x > \log k_n/(p\log n + \log q) = \Omega(\log k_n/\log n)$.

We now need to count the number of C-constructible permutations. On two wires, there are six, corresponding to the six circuits in Fig. 5.



Fig. 5. Optimal C-circuits for C-constructible permutations on two wires.

Corollary 9: [17] S_{2^n} has $\prod_{i=0}^{n-1}(2^n - 2^i)$ C-constructible permutations. Therefore, worst case C-circuits require $\Omega(n^2/\log n)$ gates.

Proof: A linear mapping is fully defined by its values on basis vectors. There are $2^n - 1$ ways of mapping the 2^n -bit string 10...0. Once we have fixed its image, there are $2^n - 2$ ways of mapping 010...0, and so on. Each basis bit-string cannot map to the subspace spanned by the previous bit-strings. There are $2^n - 2^i$ choices for the *i*th basis bit-string. Once all basis bit-strings are mapped, the mapping of the rest is specified by linearity. The number of C-constructible permutations on n wires is greater than $2^{n^2}/2$. By Lemma 8, worst case C-circuits require $\Omega(n^2/\log n)$ gates.

Let us return to CNT-constructible permutations. A result similar to Lemma 7 requires Definition 10.

Definition 10: A permutation is called even if it can be written as the product of an even number of transpositions. The set of even permutations in S_n is denoted A_n .

It is well known that if a permutation can be written as the product of an even number of transpositions, then it may not be written as the product of an odd number of transpositions. Moreover, half the permutations in S_n are even for n > 1.

Lemma 11: [20] Any $n \times n$ circuit with no $n \times n$ gates computes an even permutation.

Proof: It suffices to prove this for a circuit consisting of only one gate, as the product of even permutations is even. Let G be a gate in an $n \times n$ circuit. By hypothesis, G is not $n \times n$, so there must be at least one wire which is unaffected by G. Without loss of generality, let this be the high-order wire. Then $2^{n-1} \oplus G(k) = G(2^{n-1} \oplus k)$, and $k < 2^{n-1}$ implies $G(k) < 2^{n-1}$. Thus, every cycle in the cycle decomposition of G appears in duplicate: once with numbers less than 2^{n-1} , and once with the corresponding numbers with their high-order bits set to one. But these cycles have the same length, and so their product is an even permutation. Therefore, G is the product of even permutations, and, hence, is even.

To illustrate this result, consider the following example. A 2×2 circuit consisting of a single S gate performs the permutation (1,2), as the inputs 01 and 10 are interchanged, and the inputs 00 and 11 remain fixed. This permutation consists of one transposition, and is, therefore, odd. On the other hand, in a 3×3 circuit, one can check that a swap gate on the bottom two wires performs the permutation (1,2)(5,6), which is even.

III. THEORETICAL RESULTS

Since the CNTS gate library contains no gates of size greater than three, Lemma 11 implies that every CNTS-constructible (without temporary storage) permutation is even for $n \ge 4$. The main result of this section is that the converse is also true.

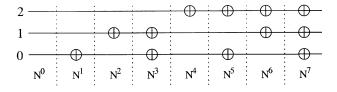


Fig. 6. Circuits N^i for i < 8. The superscript is interpreted as a binary number, whose nonzero bits correspond to the location of inverters.

Theorem 12: Every even permutation is CNT-constructible. Before beginning the proof, we offer the following two corollaries. These give a way to synthesize circuits computing odd permutations using temporary storage, and also extend Theorem 12 to an arbitrary universal gate library.

Corollary 13: Every permutation, even or odd, may be computed in a CNT-circuit with, at most, one wire of temporary storage.

Proof: Suppose we have an $n \times n$ gate G computing $\pi \in S_{2^n}$, and we place it on the bottom n wires of an $(n+1) \times (n+1)$ reversible circuit; let $\tilde{\pi}$ be the permutation computed by this new circuit. Then, by Lemma 11, $\tilde{\pi}$ is even. By Theorem 12, $\tilde{\pi}$ is the CNT-constructible. Let C be a CNT-circuit computing $\tilde{\pi}$. C computes π with one line of temporary storage.

Corollary 14: For any universal gate library L and sufficiently large n, permutations in A_{2^n} are L-constructible, and those in A_{2^n} are realizable with, at most, one wire of temporary storage.

Proof: Since L is universal, there is some number k such that we can compute the permutations corresponding to the NOT, CNOT, and TOFFOLI gates using a total of k wires. Let n > k, and let $\pi \in A_{2^n}$. By Theorem 12, we can find a CNT-circuit C computing π , and can replace every N, C, or T gate with a circuit computing it. The second claim follows similarly from Theorem 12 and Corollary 13.

To prove Theorem 12, we begin by asking which permutations are C-, N-, and T-constructible. The first of these questions was answered in Section II. We now summarize the properties of N-constructible permutations. In what follows, \oplus denotes bitwise XOR.

Definition 15: Given an integer i, we denote by N^i the circuit formed by placing an N gate on every wire corresponding to a 1 in the binary expansion of i.

We will use N^i to signify both the circuit described above, and the permutation which this circuit computes. Technically, the latter is not uniquely determined by the N^i notation, but also depends on the number n of wires in the circuit; however, n will always be clear from context. The N^i notation is illustrated for the case of three wires in Fig. 6.

Lemma 16: Let $\pi \in S_{2^n}$ be N-constructible. There exists an i such that $\pi(x) = x \oplus i$. Moreover, the gate-minimal circuit for π is N^i . There are 2^n N-constructible permutations in S_{2^n} .

Proof: Clearly, N^i computes the permutation $\pi(x) = x \oplus i$. It now suffices to show that an arbitrary N-circuit may be reduced to one of the N^i circuits. Any pair of consecutive N gates on the same wire may be removed without changing the permutation computed by the circuit. Applying this transformation until no more gates can be removed must leave a circuit with, at most, one N gate per wire; that is, a circuit of the form N^i . \Box

A. T-Constructible Permutations

Characterizing the T-constructible permutations is more difficult. We will begin by extending the N^i notation defined above.

Definition 17: Let N^h be an N-circuit as defined above. Let k be an integer such that the bitwise Boolean product hk = 0. Let there be p 1's in the binary expansion of h, and q in the binary expansion of k. Define N_k^h to be the reversible circuit composed of p q-CNOT gates, with control bits on the wires specified by the binary expansion of k, and inverters as specified by the binary expansion of h. N_k^h performs N^h if and only if the wires specified by k have the value 1.

In a 3 × 3 circuit, there are three possible T gates, namely N_6^1 , N_5^2 , and N_3^4 . They compute the permutations (6,7), (5,7), (3,7), respectively. By composing these three transpositions in all possible ways, we may form all 24 permutations of 3,5,6,7. These are precisely the nonnegative integers less than 8 which are not of the form 0 or 2^i . Clearly, no T gate can affect an input with fewer than two 1's in its binary expansion.

Lemma 18: Every T-circuit fixes 0 and 2^i for all *i*.

For $k \times k$ T-circuits, k > 3, there is an added restriction. As T gates are 3×3 , there can be no $k \times k$ gates in the circuit, so by Lemma 11, the circuit must compute an even permutation. On the other hand, we will show that these are the only restrictions on T-constructible permutations. We will do this by choosing an arbitrary even permutation, and then giving an explicit construction of a circuit which computes it using no temporary storage. The first step is to decompose the permutation into a product of pairs of disjoint transpositions.

Lemma 19: For n > 4, any even permutation in S_n may be written as the product of pairs of disjoint transpositions. If a permutation π moves k indexes, it may be decomposed into no more than (k + 1)/2 pairs of transpositions.

Proof: By a pair of disjoint transpositions, mean something of the form (a,b)(c,d)we where a, b, c, and d are distinct. For k>3, $(x_0, x_1, \dots, x_k) = (x_0, x_1)(x_{k-1}, x_k)(x_0, x_2, x_3, \dots, x_{k-1}).$ Now, $(x_0, x_1)(x_{k-1}, x_k)$ are disjoint, iteratively applying this decomposition process will convert an arbitrary cycle into a product of pairs of disjoint transpositions with a final two-cycle or three-cycle. transpositions possibly followed by a single transposition, a three-cycle or both.

Consider an arbitrary permutation π $= c_0 c_1 \dots c_k,$ where $c_0 \ldots c_k$ are the disjoint cycles in its cycle decomposition. As shown above, we may rewrite this as $\pi = \kappa_1 \dots \kappa_m \tau_1 \dots \tau_p \sigma_1 \dots \sigma_q$, where the κ_i are pairs of disjoint transpositions, the τ_i are transpositions, and the σ_i are 3-cycles. As the τ_i come from pairwise disjoint cycles, they must in turn be pairwise disjoint. Moreover, there must be an even number of them as π was assumed to be even, and the κ_i and σ_i are all even. Pairing up the τ_i arbitrarily leaves an expression of the form $\kappa_1 \ldots \kappa_{m+(p/2)} \sigma_1 \ldots \sigma_q$. Again, the σ_i are pairwise disjoint. Note that (a, b, c)(d, e, f) = [(a, b)(d, e)][(a, c)(d, f)];we may, therefore, rewrite any pair of disjoint three-cycles as two pairs of disjoint transpositions. Iterating this process leaves, at most, one three-cycle, (x, y, z). Since we are working in A_n for n > 4, there are at least two other indexes, v, w. Using these, we have (x, y, z) = [(x, y)(v, w)][(v, w)(x, z)].

A careful count of transposition pairs gives the bound (k + 1)/2 in the statement of the lemma. This bound is tight in the case of a permutation consisting of a single 4n + 3 cycle.

By Lemma 19, it suffices to show that we may construct a circuit for an arbitrary disjoint transposition pair. We begin with an important special case. On n wires, a $N_{2^k-4}^1$ gate computes the permutation $\kappa_0 = (2^n - 4, 2^n - 3)(2^n - 2, 2^n - 1)$, which may be implemented by 8(n-5) T gates [1, Corollary 7.4].

Lemma 20: On n wires, the permutation $\kappa_0 = (2^n - 4, 2^n - 3)(2^n - 2, 2^n - 1)$ is T-constructible.

Consider now an arbitrary disjoint transposition pair, $\kappa = (a,b)(c,d)$. Given a permutation π with the property $\pi(a) = 2^n - 4$, $\pi(b) = 2^n - 3$, $\pi(c) = 2^n - 2$, $\pi(d) = 2^n - 1$, we have $\kappa = \pi \kappa_0 \pi^{-1}$, where κ_0 is the permutation in Lemma 20. We have a circuit which computes κ_0 . Given a circuit that computes π , we may obtain a circuit computing π^{-1} by reversing it. We now construct a circuit computing π .

Lemma 21: Suppose n > 3, and $0 \le a, b, c, d < 2^n$. Further suppose that none of a, b, c, d is 0, or of the form 2^i . Then there exists a T-constructible permutation π with the property $\pi(a) = 2^n - 1, \pi(b) = 2^n - 2, \pi(c) = 2^n - 3, \pi(d) = 2^n - 4$, computable by a circuit of no more than 5n - 2 T gates.

Proof: To simplify notation, set $M = 2^{n-1}$ and m = n - 1. Now, we construct π in five stages. First, we build a permutation π_a such that $\pi_a(a) = M + 4$. Then, we build π_b such that $\pi_b \circ \pi_a(b) = M + 1$, and $\pi_b(M + 4) = M + 4$. Similarly, π_c will fix M + 1 and M + 4, while $\pi_c \circ \pi_b \circ \pi_a(c) = M + 2$, and π_d will fix M + 1, M + 2, M + 4 while $\pi_d \circ \pi_c \circ \pi_b \circ \pi_a(d) = M + 7$. Finally, we build a circuit that maps $M + 4 \longrightarrow 2M - 4$, $M + 1 \longrightarrow 2M - 3$, $M + 2 \longrightarrow 2M - 2$, and $M + 7 \longrightarrow 2M - 1$.

By hypothesis, a is not zero, nor of the form 2^i . This means that a has at least two 1 s in its binary expansion, say in positions h_a and k_a . Apply T gates with controls on positions h_a and k_a to set the second and mth bits. More precisely, let $z_a = 2^{h_a} + 2^{k_a}$, apply a $N_{z^a}^M$ if and only if a has a 0 in the (n-1)th bit and $N_{z_a}^4$ if and only if a has a 0 in the second bit. Now, apply T gates with the controls on the mth and second bits to set the remaining bits to zero. Let π_a be the permutation computed by the circuit given above.

 $\pi_a(b)$ must again have two nonzero bits in its binary expansion; since $b \neq a$ implies $\pi_a(b) \neq \pi_a(a)$, some nonzero bit of $\pi_a(b)$ lies on neither the *m*th nor the second wire. Controlling by this and another bit, use the techniques of the previous paragraph to build a circuit taking $\pi_a(b) \to M+1$. By construction, this fixes M + 4; let the permutation computed by this circuit be π_b .

Consider now the nonzero bits of $c' = \pi_b \circ \pi_a(c)$. Again, since $a,b \neq c$, we have M + 4, $M + 1 \neq c'$. Therefore, there must be at least one bit in which c' differs from M + 4. This bit could be the *m*th or the second bit, and c' could have a zero in this position. However, as c' is guaranteed to have at least two nonzero bits, there must be some other bit which is 1 in c' and 0 in M + 4. Similarly, there must be some bit which is 1 in c'and 0 in M + 1. Controlling by these two bits (or, if they are the same bit, by this bit and any other bit which is 1 in c'), we may use the above method to set $c' \rightarrow M + 2$.

Next, consider the nonzero bits of $d' = \pi_c \circ \pi_b \circ \pi_a(d)$. First, suppose there are two which are not on the mth wire. Controlling by these can take $d' \rightarrow M + 7$ without affecting any of the other values, as none of M + 1, M + 2, M + 4 have 1's in both these positions. If there are no two 1's in the binary expansion of d' which both lie off the *m*th wire, there can be, at most, two 1's in the binary expansion, one of which lies on the mth wire. Since a, b, $c \neq d$, the second must lie on some wire which is not the zeroth, first, or second; in this case we may again control by these two bits to take $d' \rightarrow M + 7$ without affecting other values.

Finally, apply N^4_{M+1} and N^4_{M+2} gates, and then a N^{M-8}_{M+4} circuit. The reader may verify that this completes stage 5. Each of the first four stages takes, at most, n T gates, as we flip, at most, n bits in each. The final stage uses exactly n - 2 T gates.

We now have a key result to prove.

Theorem 22: Every T-constructible permutation in S_{2^n} fixes zero and 2^i for all *i*, and is even if n > 3. Conversely, every permutation of this form is T-constructible. A T-constructible permutation which moves s indexes requires, at most, 3(s + 1)1)(3n-7) T gates. There are $(1/2)(2^n-n-1)!$ T-constructible permutations in S_{2^n} .

Proof: We have already dealt with the case n = 3; hence, suppose n > 3. The first statement follows directly from Lemmas 11 and 18. Now, let $\pi \in S_{2^n}$ be an arbitrary even permutation fixing zero, 2^i . Use the method of Lemma 19 to decompose π into pairs of disjoint transpositions which fix zero, 2^i . We are justified in using Lemma 19 because, for n > 3, there are at least five numbers between zero and 2^{n-1} which are not of the form zero or 2^i . Finally, using the circuits implied by Lemmas 20 and 21, we may construct circuits for each of these transposition pairs. Chaining these circuits together gives a circuit for the permutation π . Collecting the length bounds of the various lemmas cited gives the length bound in the theorem. The final claim then follows.

B. Circuit Equivalences

Given a (possibly long) reversible circuit to perform a specified task, one approach to reducing the circuit size is to perform local optimizations using circuit equivalences. The idea is to find subcircuits amenable to reduction. This direction is pursued in a paper by Iwama et al. [8], which examines circuit transformation rules for generalized-CNOT circuits which only alter one bit of the circuit. In their scenario, other bits may be altered during computation, so long as they are returned to their initial state by the end of the computation. We present a more general framework for deriving equivalences, from which many of the equivalences from [8] follow as special cases. First, let us introduce notation to better deal with control bits.

Definition 23: Let G^i be a reversible gate that only affects wires corresponding to the 1's in the binary expansion of i (as in an N^i gate). Let the bitwise Boolean product $i \cdot j = 0$. Then define $V_i(G^i)$ as the gate which computes G^i if and only if the wires specified by j all carry a 1.

In particular, $V_j(N^i) = N_j^i$, and $V_k V_j(G^i) = V_{k+j}(G^i)$. Addition, multiplication, etc., of lower indexes will always be taken to be bitwise Boolean, with $+, \cdot, \oplus$ representing OR, AND, and XOR, respectively. We denote the bitwise complement of xas \overline{x} .

Lemma 24: Let K be an $n \times n$ reversible circuit such that $K(0x_1...x_{n-1}) = (0x_1...x_{n-1})$, and let $f : B^{n-1} \to B^{n-1}$ be the function defined by $K(1x_1...x_{n-1}) = (1f(x_1...x_{n-1}))$. Then f is a well-defined permutation in S_{2n-1} , and if F is a circuit computing f, then $V_1(F) \equiv K$.

Proof: K, by hypothesis, permutes the inputs with a leading 0 amongst themselves. By reversibility, it must permute inputs with a leading 1 amongst themselves as well.

Definition 25: The commutator of permutations P and Q, denoted [P,Q], is $PQP^{-1}Q^{-1}$.

The commutator concept is useful for moving gates past each other since PQ = [P, Q]QP. Moreover, it has reasonable properties with respect to control bits as the following result indicates.

Corollary 26:

 $[V_h(G^i), V_k(H^j)] = V_{(h+k) \cdot \overline{(i+j)}}([V_{h \cdot j}(G^i), V_{k \cdot i}(H^j)]).$ *Proof:* The corollary provides a circuit equivalent to the

commutator of two given gates with arbitrary control bits. Namely, such a circuit can be constructed in two steps. First, identify wires which act as control for one gate but are not touched by the other gate. Second, connect the latter gate to every such wire so that the wire controls the gate.

By induction, it suffices to show that this procedure can be done to one such wire. Without loss of generality, suppose control bits and only control bits appear on the first wire. Then the input to this wire goes through the circuit unchanged. At least one of the two gates whose commutator is being computed must, by hypothesis, be controlled by the first wire. Therefore, on an input of zero to the first wire, this gate (and, therefore, its inverse) leaves all signals unchanged. Since the other gate appears along with its inverse, the whole circuit leaves the input unchanged. Our result now follows from Lemma 24.

If we are computing the commutator of generalized CNOT gates, then we may pick G^i , H^j to be single inverters N^i , N^j with i, j having only a single 1 apiece in their binary expansions. Then we must have $h \cdot j = 0$ or j, and $k \cdot i = 0$ or i. The four cases are accounted for as follows:

Lemma 27: Let i, j have only a single 1 apiece in their binary expansions. Then $[N^{i}, N^{j}_{i}] = N^{j}, [N^{i}_{i}, N^{j}] = N^{i}, [N^{i}, N^{j}] =$ 1, and $[N_{i}^{i}, N_{i}^{j}] = N_{i}^{j}$.

Proof: As these equivalences all involve only 2-bit circuits, we may check them for i = 0, j = 1 by evaluating both sides of each equivalence on each of four inputs.

C. CT N and C T Constructible Permutations

While an arbitrary CNT-circuit may have the C, N, and T gates interspersed arbitrarily, we first consider circuits in which these gates are segregated by type.

Definition 28: For any gate libraries $L_1 \dots L_k$, a $L_1|\ldots|L_k$ -circuit is an L_1 -circuit followed by an L_2 -cir-

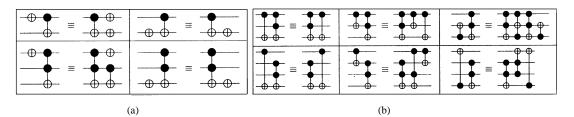


Fig. 7. Equivalences between reversible circuits used in our constructions.

cuit, ..., followed by an L_k -circuit. A permutation computed by an $L_1 | \ldots | L_k$ -circuit is $L_1 | \ldots | L_k$ -constructible.

A CNT-circuit with all N gates appearing at the right end is called a CT|N circuit.

Theorem 29: Let π be CNT-constructible. Then π is also CT|N-constructible. Moreover, π uniquely determines the permutations π_{CT} and π_N computed by the CT and N subcircuits, respectively.

Proof: We move all the N gates toward the outputs of the circuit. Each box in Fig. 7(a) indicates a way of replacing an N|CT circuit with a CT|N circuit. The equivalences in this figure come from Corollary 26. Moreover, every possible way for an N gate to appear to the immediate left of a C or a T is accounted for, up to permutating the input and output wires. Now, number the non-N gates in the circuit in a reverse topological order starting from the outputs. In particular, if two gates appear at the same level in a circuit diagram, they must be independent, and one can order them arbitrarily. Let d be the number of the highest-numbered gate with an N gate to its immediate left. All N gates past the dth gate G can be reordered with the G gate without introducing new N gates on the other side of G, and without introducing new gates between the N gates and the outputs. In any event, as there are no remaining N gates to the left of G, d decreases. This process terminates when all the N gates are clustered together at the circuit outputs. If we always cancel redundant pairs of N gates, then no more than two new gates will be introduced for each noninverter originally in the circuit; additionally, there will be, at most, n N gates when the process is complete. Thus, if the original circuit had l gates, then the new circuit has, at most, 3(l-1) + n gates. Note that C and T gates (and, hence, CT-circuits) fix 0. Thus, $\pi(0) = \pi_N(0)$, so $\pi_N = N \pi^{(0)}$, and $\pi_{CT} = \pi N^{\pi(0)}$.

Thus, if we want a CNT-circuit computing a permutation π , we can quickly compute π_N , then simplify the problem to that of finding a CT-circuit for $\pi\pi_N$. By Theorem 29, we know that a minimal-gate circuit of this form has roughly three times as many gates as the gate-minimal circuit computing π .

The next natural question is whether an arbitrary CT-circuit is equivalent to some T|C circuit. The equivalences in Fig. 7(b) suggest that the answer is yes. However, the proof of Theorem 29 requires that many N gates be able to simultaneously move past a C or T gate, while Fig. 7 only shows how to move a single C gate past a single T gate.

Lemma 30: The permutation π , computed by a T|C-circuit, determines the permutations π_T and π_C computed by the subcircuits. An even permutation is TC-constructible if and only if it fixes 0 and the images of inputs of the form 2^i are linearly independent over \mathbb{F}_2 . **Proof:** Let π be an arbitrary permutation. If π is T|C-constructible, then images of the inputs 2^i are unaffected by the T subcircuit; by Lemma 7, they must be mapped to linearly independent values by the C subcircuit. This mapping of basis vectors completely specifies the permutation π_c computed by the C subcircuit, and, therefore, also the permutation $\pi_t = \pi \pi_c^{-1}$ computed by the T subcircuit. Conversely, suppose π is even and fixes 0, and the images of 2^i are linearly independent. Then, there is some C-circuit taking the values 2^i to their images under π . Let it compute the permutation π_c ; then, $\pi \pi_c^{-1}$ fixes the values 0 and 2^i by construction. Theorem 22, therefore, guarantees that $\pi \pi_c^{-1}$ is T-constructible.

We will later use this result to show the existence of CT-constructible permutations which are not $T \vert C$ constructible.

D. T[C]T[N-Constructible Permutations

With the results of the previous two subsections, we are now ready to prove Theorem 12. According to Lemma 20, zerofixing even permutations are T|C-constructible if they map inputs of the form 2^i in a certain way. This suggests that T|C-circuits account for a relatively large fraction of such permutations.

Theorem 31: Every zero-fixing permutation in S_{2^3} and every zero-fixing even permutation in S_{2^n} for n > 4 is T|C|T-constructible, and, hence, is CT-constructible. None requires more than n^2 C gates and $3(2^n + n + 1)(3n - 7)$ T gates.

Proof: Let π be any zero-fixing permutation. Note that if the images of 2^i under π were linearly independent, Lemma 20 would imply that π was T|C constructible. So, we will build a permutation π_T with the property that the images of 2^i under $\pi\pi_T$ are linearly independent, ensuring that $\pi\pi_T$ is T|C-constructible. Given a T|C-circuit for $\pi\pi_T$ and a T-circuit for π_T , we can reverse the circuit for π_T and append it to the end of the T|C-circuit for $\pi\pi_T$ to give at T|C|T-circuit for π . All that remains is to show we can build one such π_T .

The basis vectors 2^i must be mapped either to themselves, to other basis vectors, or to vectors with at least two 1's. Let $i_1 \dots i_k$ be the indexes of basis vectors which are not the images of other basis vectors, and let $j_1 \dots j_k$ be the indexes of basis vectors whose images have at least two 1 s. Let $\overline{i_1} \dots \overline{i_{n-k}}$ and $\overline{j_1} \dots \overline{j_{n-k}}$ be the indexes which are not in the i_m and j_m , respectively. Consider the matrix M_{π} in which the *i*th column is the binary expansion of $\pi(2^i)$. We take the entries of M_{π} to be elements of \mathbb{F}_2 . Our indexing system divides M_{π} into four submatrices; $M_{\pi}(i,j)$, $M_{\pi}(i,\overline{j})$, $M_{\pi}(\overline{i},j)$, and $M_{\pi}(\overline{i},\overline{j})$. By construction, $M_{\pi}(i,j)$ and $M_{\pi}(\overline{i},\overline{j})$ are square, $M_{\pi}(\overline{i},\overline{j})$ is a permutation matrix, and $M_{\pi}(i,\overline{j})$ is a zero matrix. Therefore, det $M_{\pi} = \det M_{\pi}(i,j)$, and M_{π} is invertible if and only if $M_{\pi}(i,j)$ is. Moreover, there is an invertible linear transformation, computable by column reduction, which zeroes out the matrix $M_{\pi}(\overline{i}, j)$ without affecting $M_{\pi}(i, j)$ or $M_{\pi}(\overline{i}, \overline{j})$. As this transformation L is invertible, it corresponds to a permutation π_x , and the matrix ML is the matrix of images of 2^i under the permutation $\pi_x \pi$. In particular, the columns of $(ML)\pi$ must all be different, which implies that the columns of $M_{\pi}(i, j)$ must all be different. Moreover, π_x is linear and is, therefore, zero-fixing; hence, $M_{\pi}(i, j)$ can have no zero columns. Taken together, these facts imply that for $k = 1, 2, M_{\pi}(i, j)$ is invertible, hence, so is M_{π} , thus, π is T|C-constructible.

Suppose $k \ge 3$, and consider the family of matrices A(p) defined as follows. A(p) is a $p \times p$ matrix with 1's on the diagonal, 1's in the first row, and 1's in the first column, except possibly in the (1,1) entry, which is one if and only if p is odd. Row reducing the A_i to lower triangular matrices quickly shows that the A_i are invertible for all i. Moreover, for $i \ge 3$, there are at least two 1's in every column. Therefore, there is a T-constructible permutation π_T such that $M_{\pi\pi_T}(i, j) = A_k$. Thus, $\pi\pi_T$ is T|C-constructible, and π is T|C|T constructible.

Finally, we know from Corollary 9 that no more than n^2 gates are necessary to compute π_C . At most, 2n indexes need be moved by π_T , and no more than $2^n - n - 1$ can be moved by the T-constructible part of π . Thus, by Theorem 22, we need no more than 3(2n+1)(3n-7) gates for π_T and no more than $3(2^n-n)(3n-7)$ gates for π . Adding these gives the gate-count estimate above.

Corollary 32: There exist T|C|T-constructible permutations which are not T|C-constructible.

Proof: The permutation $\pi = (2,6)(4,7)$ fixes 0 and is even and, hence, is T|C|T-constructible in S_{2^n} for all $n \ge 3$ by Theorem 31. However, $\pi(1) \oplus \pi(2) = 1 \oplus 6 = 7 = \pi(4)$, hence, by Lemma 20, π is not T|C-constructible.

Theorem 33: Every permutation in S_{2^n} for n = 1, 2, 3 and every even permutation in S_{2^n} for n > 3 is T|C|T|N-constructible, and, hence, CNT-constructible. None requires more than $n^2 C$ gates, n N gates, and $3(2^n + n + 1)(3n - 7) T$ gates.

Proof: Let π be any permutation; then, $\pi' = \pi N^{\pi(0)}$ fixes 0. For n = 1, π' must be the identity; for $n = 2\pi'$ permutes 1,2,3, any such permutation is linear, hence, π' is C-constructible. For n = 3, π' is T|C|T-constructible; for n > 3, π' is T|C|T-constructible if and only if it is even, which happens if and only if π is even. Thus, in all cases there is a T|C|T-circuit, Π' computing π' ; then $\Pi' N^{\pi(0)}$ is a T|C|T|N-circuit computing π .

We note that the size of a truth table for a circuit with n inputs and n outputs is $n2^n$ bits. The synthesis procedure used in the theorems above clearly runs in time proportional to the number of gates in the final circuit. This is $O(n2^n)$, hence, the synthesis procedure detailed in the theorems has linear runtime in the input size.

Just as in Corollary 9, we may ask how far from optimal the foregoing construction is for long circuits. There are $2^{n}!/2$ even permutations in $S_{2^{n}}$, and these are all CNT-constructible. Using Stirling's approximation, $\log(k!) \approx k \log k$, and Lemma 8 gives:

Corollary 34: Worst case CNT-circuits on n wires require $\Omega(n2^n/\log n)$ gates.

So, for long CNT-circuits, the algorithm implied by Theorem 33 is asymptotically suboptimal by, at worst, a logarithmic factor, as it produces circuits of length $O(n2^n)$. This is remarkably similar to the result of Corollary 9, in which we found that using row reduction to build C-circuits is asymptotically suboptimal by a logarithmic factor in the case of long C-circuits. However, even a constant improvement in size is very desirable, and circuits for practical applications are almost never of the worst case type considered in Corollaries 9 and 34.

IV. OPTIMAL SYNTHESIS

We will now switch focus, and seek optimal realizations for permutations we know to be CNT-constructible. A circuit is optimal if no equivalent circuit has smaller cost; in our case, the cost function will be the number of gates in the circuit.

Lemma 35: (Property of Optimality) If *B* is a subcircuit of an optimal circuit *A*, then *B* is optimal.

Proof: Suppose not. Then let B' be a circuit with fewer gates than B, but computing the same function. If we replace B by B', we get another circuit A' which computes the same function as A. But since we have only modified B, A' must be as much smaller than A as B' is smaller than B. A was assumed to be optimal, hence, this is a contradiction. (Note that equivalent, optimal circuits can have the same number of gates.)

The algorithm detailed in this section relies entirely on the property of optimality for its accuracy. Therefore, any cost function for which this property holds may, in principle, be used instead of gate count.

Lemma 35 allows us to build a library of small optimal circuits by dynamic programming because the first m gates of an optimal (m+1)-gate circuit form an optimal subcircuit. Therefore, to examine all optimal (m+1)-gate circuits, we iterate through optimal m-gate circuits and add single gates at the end in all possible ways. We then check the resulting circuits against the library, and eliminate any which are equivalent to a smaller circuit. In fact, instead of storing a library of all optimal circuits, we store one optimal circuit per synthesized permutation and also store optimal circuits of a given size together.

One way to find an optimal circuit for a given permutation π is to generate all optimal k-gate circuits for increasing values of k until a circuit computing π is found. This procedure requires $\Theta(2^n!)$ memory in the worst case (n is the number of wires) and may require more memory than is available. Therefore, we stop growing the circuit library at m-gate circuits, when hardware limitations become an issue. The second stage of the algorithm uses the computed library of optimal circuits and, in our implementation, starts by reading the library from a file. Since little additional memory is available, we trade off runtime for memory.

We use a technique known as depth-first search with iterative deepening (DFID) [10]. After a given permutation is checked against the circuit library, we seek circuits with j = m + 1 gates that implement this permutation. If none are found, we seek circuits with j = m + 2 gates, etc. This algorithm, in general, needs an additional termination condition to prevent infinite looping for inputs which cannot be synthesized with a given gate library. For each j, we consider all permutations optimally synthesizable in m gates. For each such permutation ρ , we multiply π by ρ^{-1} and recursively try to synthesize the result using

CIRCUIT find_circ(COST, PERM) // assumes circuit library stored in LIB

if
$$(COST < k)$$

// If PERM can be computed by a circuit with ≤ k gates, // such a circuit must be in the library return LIB [DEPTH] .find (PERM)

else

- // Try building the goal circuit from ≤k-gate circuits
 for each C in LIB[k]
- // Divide PERM by permutation computed by C
 PERM2 ← PERM * INVERSE(C.perm)

```
// and try to synthesize the result
	TEMP_CCT ← find_circ(depth-k,PERM2)
	if (TEMP_CCT != NIL) return TEMP_CCT * C
```

 $/\!/$ Finally, if no circuit of the desired depth can be found return <code>NIL</code>

Fig. 8. Finding a circuit of cost \leq COST that computes permutation PERM (NIL returned if no such circuit exists). TEMP_CCT and records in LIB represent circuits, and include a field "perm" storing the permutation computed. The * character means both multiplication of permutations and concatenation of circuits, and NIL*(anything) = NIL.

j-m gates. When $j-m \le m$, this can be done by checking against the existing library. Otherwise, the recursion depth increases. Pseudocode for this stage of our algorithm is given in Fig. 8.

In addition to being more memory-efficient than straightforward dynamic programming, our algorithm is faster than branching over all possible circuits. To quantify these improvements, consider a library of circuits of size m or less, containing l_m circuits of size m. We analyze the efficiency of the algorithms discussed by simulating them on an input permutation of cost k. Our algorithm requires $l_m^{\lfloor (k-1)/m \rfloor}$ references to the circuit library. Simple branching is no better than our algorithm with m = 1, and, thus, takes at least l_1^k steps, which is $l_1^k/l_m^{\lfloor (k-1)/m \rfloor}$ times more than our algorithm. A speed-up can be expected because $l_m \leq l_1^m$, but specific numerical values of that expression depend on the numbers of suboptimal and redundant optimal circuits of length m. Indeed, Table I lists values of l_m for various subsets of the CNTS gate library and m = 3. For example, for the NT gate library, k = 12, $\lfloor (k-1)/m = 3 \rfloor$, $l_1 = 6$, and $l_m = 88$. Therefore, the performance ratio is $l_1^k / l_m^{\lfloor (k-1)/m \rfloor} = 6^{12}/88^3 \approx 3194.2$. Yet, this comparison is incomplete because it does not account for time spent building circuit libraries. We point out that this charge is amortized over multiple synthesis operations. In our experiments, generating a circuit library on three wires of up to three gates (m = 3) from the CNTS gate library takes less than a minute on a 2-GHz Pentium 4 Xeon. Using such libraries, all of Table I can be generated in minutes,1 but it cannot be generated even in several hours using branching.

Let us now see what additional information we can glean from Table I. Adding the C gate to the NT library appears to signifi-

TABLE I NUMBER OF PERMUTATIONS COMPUTABLE IN AN OPTIMAL *L*-Circuit Using a Given Number of Gates. $L \subset CNTS$. Runtimes Are in Seconds for a 2-GHz Pentium 4 Xeon CPU

Size	Ν	С	Т	NC	СТ	NT	CNT	CNTS
12	0	0	0	0	0	47	0	0
11	0	0	0	0	0	1690	0	0
10	0	0	0	0	0	8363	0	0
9	0	0	0	0	0	12237	0	0
8	0	0	0	0	6	9339	577	32
7	0	0	0	14	386	5097	10253	6817
6	0	2	0	215	1688	2262	17049	17531
5	0	24	0	474	1784	870	8921	11194
4	0	60	5	393	845	296	2780	3752
3	1	51	9	187	261	88	625	844
2	3	24	6	51	60	24	102	134
1	3	6	3	9	9	6	12	15
0	1	1	1	1	1	1	1	1
Total	8	168	24	1344	5040	40320	40320	40320
Time	1	1	1	30	215	97	40	15

cantly reduce circuit size, but further adding the S gate does not help as much. To illustrate this, we show sample worst case circuits on three wires for the NT, CNT, and CNTS gate libraries in Fig. 9.

The totals in Table I can be independently determined by the following arguments. Every reversible function on three wires can be synthesized using the CNT gate library [20] and there are 8! = 40320 of these. All can be synthesized with the NT library because the C gate is redundant in the CNT library; see Fig. 3(a). On the other hand, adding the S gate to the library cannot decrease the number of synthesizable functions. Therefore, the totals in the NT and CNTS columns must be 40320 as well. On the other side of the table, the number of possible N circuits is just $2^3 = 8$ since there are three wires, and there can be, at most, one N gate per wire in an optimal circuit (else we can cancel redundant pairs.) By Theorem 29, the number of CN-constructible permutations should be the product of the number of N-constructible permutations and the number of C constructible permutations, since any CN-constructible permutation can be written uniquely as a product of an N- and a C-constructible permutation. So, the total in the CN column should be the product of the totals in the C and N columns, which it is. Similarly, the total in the CNT column should be the product of the totals in the CT and N columns; this allows one to deduce the total number of CT-constructible permutations from values we know. Finally, we showed that there were 24 T-constructible permutations on three wires in Section III, and Corollary 9 states that the number of permutations implementable on n wires with C gates is $\prod_{i=0}^{n-1} (2^n - 2^i)$. For n = 3, this yields 168 and agrees with Table I.

We can also add to the discussion of T|C constructible circuits we began in Section III. By Lemma 30, the number of T|C-constructible permutations can be computed as the product of the numbers of T- and C-constructible permutations. Table I mentions 24 T-circuits and 168 C-circuits on three wires. The

¹Although complete statistics for all 16! four-wire functions are beyond our reach, average synthesis times are less than one second when the input function can be implemented with eight gates or fewer. Functions requiring nine or more gates tend to take more than 1.5 hours to synthesize. In this case, memory constraints limit our circuit library to 4-gate circuits, and the large jump in runtime after the 8-gate mark is due to an extra level of recursion.

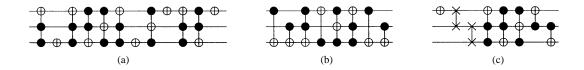


Fig. 9. Worst case L-circuits where L is (a) NT, (b) CNT, and (c) CNTS.

product (4032) is less than 5040, the number of CT constructible permutations on three wires, as we would expect from Corollary 32.

Finally, the longest C-circuits we observed on 3, 4, and 5 wires merely permute the wires. Such wire-permutations on n wires never require more than 3(n-1) gates. However, from Corollary 9, we know that for a large n, worst case C-circuits require $\Omega(n^2/log(n))$ gates. Identifying specific worst case circuits and describing families with worst case asymptotics remains a challenge.

Finally, we note that while the exact runtime complexity of this algorithm is dependant on characteristics of the gate library chosen, for a complete gate library it is obviously exponential in the number of input wires to the circuit (this is guaranteed by Corollary 34), and in fact must be at least doubly exponential in the number of input wires (that is, exponential in the size of the truth table). Scalability issues, therefore, restrict this approach to small problems. On the other hand, given that the state of the art in quantum computing is largely limited by ten qubits, such small circuits are of interest to physicists building quantum computing devices.

V. QUANTUM SEARCH APPLICATIONS

Quantum computation is necessarily reversible, and quantum circuits generalize their reversible counterparts in the classical domain [14]. Instead of wires, information is stored on qubits, whose states we write as $|0\rangle$ and $|1\rangle$ instead of 0 and 1. There is an added complexity—a qubit can be in a superposition state that combines $|0\rangle$ and $|1\rangle$. Specifically, $|0\rangle$ and $|1\rangle$ are thought of as vectors of the computational basis, and the value of a qubit can be any unit vector in the space they span. The scenario is similar when considering many qubits at once: the possible configurations of the corresponding classical system (bit-strings) are now the computational basis, and any unit vector in the linear space they span is a valid configuration of the quantum system. Just as the classical configurations of the circuit persist as basis vectors of the space of quantum configurations, so too classical reversible gates persist in the quantum context. Non-classical gates are allowed, in fact, any (invertible) norm-preserving linear operator is allowed as a quantum gate. However, quantum gate libraries often have very few nonclassical gates [14]. An important example of a nonclassical gate (and the only one used in this paper) is the Hadamard gate H. It operates on one qubit, and is defined as follows: $H|0\rangle =$ $(1/\sqrt{2})(|0\rangle + |1\rangle)$ and $H|1\rangle = (1/\sqrt{2})(|0\rangle - |1\rangle)$. Note that because H is linear, giving the images of the computational basis elements defines it completely.

During the course of a computation, the quantum state can be any unit vector in the linear space spanned by the computational basis. However, a serious limitation is imposed by quantum measurement, performed after a quantum circuit is executed. A measurement nondeterministically collapses the state onto some vector in a basis corresponding to the measurement being performed. The probabilities of outcomes depend on the measured state. Basis vectors [nearly] orthogonal to the measured state are least likely to appear as outcomes of measurement. If $H|0\rangle$ were measured in the computational basis, it would be seen as $|0\rangle$ half the time, and $|1\rangle$ the other half.

Despite this limitation, quantum circuits have significantly more computational power than classical circuits. In this paper, we consider Grover's search algorithm, which is faster than any known nonquantum algorithm for the same problem [6]. Fig. 10 outlines a possible implementation of Grover's algorithm. It begins by creating a balanced superposition of 2^n n-qubit states which correspond to the indexes of the items being searched. These index states are then repeatedly transformed using a Grover operator circuit, which incorporates the search criteria in the form of a search-specific predicate f(x). This circuit systematically amplifies the search indexes that satisfy f(x) = 1 until a final measurement identifies them with high probability.

A key component of the Grover operator is a so-called "oracle" circuit that implements a search-specific predicate f(x). This circuit transforms an arbitrary basis state $|x\rangle$ to the state $(-1)^{f(x)}|x\rangle$. The oracle is followed by: 1) several Hadamard gates; 2) a subcircuit which flips the sign on all computational basis states other than $|0\rangle$; and 3) more Hadamard gates. A sample Grover-operator circuit for a search on two qubits is shown in Fig. 11 and uses one qubit of temporary storage [14]. The search space here is $\{0, 1, 2, 3\}$, and the desired indexes are zero and 3. The oracle circuit is highlighted by a dashed line. While the portion following the oracle is fixed, the oracle may vary depending on the search criterion. Unfortunately, most works on Grover's algorithm do not address the synthesis of oracle circuits and their complexity. According to Bettelli et al. [4], this is a major obstacle for automatic compilation of high-level quantum programs, and little help is available.

Lemma 36: [14] With one temporary storage qubit, the problem of synthesizing a quantum circuit that transforms computational basis states $|x\rangle$ to $(-1)^{f(x)}|x\rangle$ can be reduced to a problem in the synthesis of classical reversible circuits.

Proof: Define the permutation π_f by $\pi_f(x, y) = (x, y \oplus f(x))$, and define a unitary operator U_f by letting it permute the states of the computational basis according to π_f . The additional qubit is initialized to $|-\rangle = H|1\rangle$ so that $U_f|x, -\rangle = (-1)^{f(x)}|x, -\rangle$. If we now ignore the value of the last qubit, the system is in the state $(-1)^{f(x)}|x\rangle$, which is exactly the state needed for Grover's algorithm. Since a quantum operator is completely determined by its behavior on a given computational basis, any circuit implementing π_f implements U_f . As reversible gates may be implemented with quantum technology, we can synthesize U_f as a reversible logic circuit.

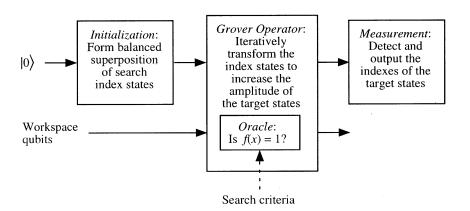


Fig. 10. High-level schematic of Grover's search algorithm.

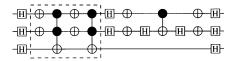


Fig. 11. Grover-operator circuit with oracle highlighted.

Quantum computers implemented so far are severely limited by the number of simultaneously available qubits. While n qubits are necessary for Grover's algorithm, one should try to minimize the number of additional temporary storage qubits. One such qubit is required by Lemma 36 to allow classical reversible circuits to alter the phase of quantum states.

Corollary 37: For permutations $\pi_f(x,y) = (x, y \oplus f(x))$, such that $\{x : f(x) = 1\}$ has even cardinality, no more temporary storage is necessary. For the remaining π_f , we need an additional qubit of temporary storage.

Proof: The permutation π_f swaps (x,y) with $(x, y \oplus f(x))$, and, therefore, performs one transposition for each element of $\{x : f(x) = 1\}$. Therefore, it is exactly even when this set has even cardinality. The lemma follows from Corollary 13.

Given π_f , we can use the algorithm of Section IV to construct an optimal circuit for it. Table II gives the optimal circuit sizes of functions π_f corresponding to three-input one-output functions f ("3 + 1 oracles"), which can be synthesized on four wires. These circuits are significantly smaller than many optimal circuits on four wires. This is not surprising, as they perform less computation.

In Grover oracle circuits, the main input lines preserve their input values and only the temporary storage lines can change their values. Therefore, Travaglione *et al.* [21] circuits where some lines cannot be changed even at intermediate stages of computation. In their terminology, a circuit with k lines that we are allowed to modify and an arbitrary number of read-only lines is called a k-bit ROM-based circuit. They show how to compute permutation π_f arising from a Boolean function f using a 1-bit quantum ROM-based circuit, and prove that if only classical gates are allowed, two writable bits are necessary. Two bits are sufficient if the CNT gate library is used. The synthesis algorithms of Travaglione *et al.* [21] rely on XOR sum-of-products decompositions of f. We outline their method in a proof of the following result.

 TABLE II

 Optimal 3 + 1 Oracle Circuits for Grover's Search

Circuit Size	0	1	2	3	4	5	6	7	Total
No. of circuits	1	7	21	35	35	24	4	1	128

Lemma 38: Ref. [21]. There exists a reversible 2-bit ROMbased CNT-circuit computing $(x, a, b) \rightarrow (x, a, b \oplus f(x))$, where x is a k-bit input. If a function's XOR decomposition consists of only one term, let k be the number of literals appearing (without complementation). If k > 0, then $3 \cdot 2^{k-1} - 2$ gates are required.

Proof: Assume we are given an XOR sum-of-products decomposition of f. Then, it suffices to know how to transform $(x, a, b) \rightarrow (x, a, b \oplus p)$ for an arbitrary product of uncomplemented literals p, because then we can add the terms in an XOR decomposition term by term. So, without loss of generality, let $p = x_1 \dots x_m$. Denote by T(a, b; c) a T gate with controls on a,b and an inverter on c. Similarly, denote by C(a;b) a C gate with control on a and inverter on b. Number the ROM wires $1 \dots k$, and the non-ROM wires k+1 and k+2. Let us first suppose that there is at least one uncomplemented literal, and put a C(1; k+2) on the circuit; note that C(1; k+2)applied to the input (x,a,b) gives $(x, a, b \oplus x_1)$. We will write this as $C(1; k+2) : (x, a, b) \to (x, a, b \oplus x_1)$, and denote this operation by W_1 . Then, we define the circuit W'_2 as the sequence of gates $T(2, k+2; k+1)W_0T(2, k+2; k+1)W_0$, and one can check that $W'_2: (x, a, b) \to (x, a \oplus x_1 x_2, b)$. We define W_2 by exchanging the wires k+1 and k+2; clearly, $W_2: (x, a, b) \rightarrow (x, a, b \oplus x_1 x_2)$. In general, given a circuit $W_l: (x, a, b \oplus x_1 \dots x_{l-1}) \to (x, a \oplus x_1 \dots x_l)$, we define $W'_{l+1} = T(l+1, k+2; k+1)W_lT(l+1, k+2; k+1)W_l$; one can check that $W'_{l+1}: (x, a, b) \to (x, a \oplus x_1 \dots x_{l+1}, b)$. Define W_{l+1} by exchanging the wires k+1 and k+2; then clearly, $W_{l+1}: (x, a, b) \to (x, a, b \oplus x_1 \dots x_{l+1})$. By induction, we can get as many uncomplemented literals in this product as we like.

The heuristic presented above has the property that none of its gates has more than one control bit on a ROM bit. Indeed, Travaglione *et al.* [21] had restricted their attention to circuits with precisely this property. However, they note [21] that their results do not depend on this restriction.

TABLE III CIRCUIT SIZE DISTRIBUTION OF 3 + 2 ROM-BASED CIRCUITS SYNTHESIZED USING VARIOUS ALGORITHMS

Size	0	1	2	3	4	5	6	7	8	9	10	11	12	13
XOR	1	4	6	4	4	12	18	12	: 6	12	19	16	10	8
OPT T	1	4	6	4	4	12	21	24	29	33	44	46	22	5
OPT	1	7	21	35	36	28	28	36	35	21	7	1	0	0
Size]]	4	15	16	17	18	19	20	21	22	23	24	25	26
XOR]	0	16	19	12	6	12	18	12	4	4	6	4	1
OPT T	1		0	0	0	0	0	0	0	0	0	0	0	0
OPT	()	0	0	0	0	0	0	0	0	0	0	0	0

We applied the construction of Lemma 38 to all 256 functions implementable in 1-bit ROM-based circuits with three bits of ROM. The circuit size distribution is given in the line labeled XOR in Table III. In comparison with circuit lengths resulting from our synthesis algorithm of Section IV, we consider two cases. First, in the OPT T line, we only look at circuits satisfying the restriction mentioned above. Then, in the OPT line, we relax this restriction and give the circuit size distribution for optimal circuits.²

Most functions computable by a 2-bit ROM-based circuit actually require two writable bits [21]. Whether or not a given function can be computed by a 1-bit ROM-based CNT-circuit, can be determined by the following constructive procedure. Observe that gates in 1-bit ROM circuits can be reordered arbitrarily, as no gate affects the control bits of any other gate. Thus, whether or not a C or T gate flips the controlled bit, depends only on the circuit inputs. Furthermore, multiple copies of the same gate on the same wires cancel out, and we can assume that, at most, one is present in an optimal circuit. A synthesis procedure can then check which gates are present by applying the permutation on every possible input combination with zero, one, or two 1's in its binary expansion. (Again, we have relaxed the restriction that only one control may be on a ROM wire). If the value of the function is one, the circuit needs an N, C, or T gate controlled by those bits.

Observe that adding the S gate to the gate library during k+1ROM synthesis will never decrease circuit sizes, no two wires can be swapped since at least one of them is a ROM wire. In the case of k+2 ROM synthesis, only the two non-ROM wires can be swapped, and one of them must be returned to its initial value by the end of the computation. We ran an experiment comparing circuit lengths in the 3 + 2 ROM-based case and found no improvement in circuit sizes upon adding the S gate, but we have been unable to prove this in the general case.

VI. CONCLUSION

We have explored a number of promising techniques for synthesizing optimal and near-optimal reversible circuits that require little or no temporary storage. In particular, we have proven that every even permutation function can be synthesized without temporary storage using the CNT gate library. Similarly, any permutation, even or odd, can be synthesized with up to one bit of temporary storage. Recently, De Vos[5] has independently demonstrated this result; however, his proof relies on nontrivial group-theoretic notions and resorts to a computer algebra package for a special case. We give a much more elementary analysis, and, moreover, our proof techniques are sufficiently constructive to be interpreted as a synthesis heuristic. We have also derived various equivalences among CNT-circuits that are useful for synthesis purposes, and given a decomposition of a CNT-circuit into a T|C|T|N-circuit.

To further investigate the structure of reversible circuits, we developed a method for synthesizing optimal reversible circuits. While this algorithm scales better than its counterparts for irreversible computation [11], its runtime is still exponential. Nonetheless, it can be used to study small problems in detail, which may be of interest to physicists building quantum computing devices because the current state of the art is largely limited to ten qubits. One might think that an exhaustive search procedure would suffice for small problems, but in fact, even for three-input circuits, an exhaustive search is nowhere near finished after many hours; our procedure terminates in minutes. Our experimental data about all optimal reversible circuits on three wires using various subsets of the CNTS library reveal some interesting characteristics of optimal reversible circuits. Such statistics, extrapolated to larger circuits, can be used in the future to guide heuristics, and may suggest new theorems about reversible circuits.

Finally, we have applied our optimal synthesis tool to the design of oracle circuits for a key quantum computing application, Grover's search algorithm, and obtained much smaller circuits than previous methods. Ultimately, we aim to extend the proposed methods to handle larger and more general circuits, with the eventual goal of synthesizing quantum circuits containing dozens of qubits.

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²Using a circuit library with \leq six gates (191-Mb file, 1.5 min to generate), the OPT line takes 5 min to generate. The use of a five-gate library improves the runtimes by at least 2x if we do not synthesize the only circuit of size 11. For the OPT T line, we first find the 250 optimal circuits of size \leq 12 (15 min) using a six-gate library (61 Mb, 5 min). The remaining six functions were synthesized in 5 min with a seven-gate library (376 Mb, 10 min). This required more than 1 Gb of RAM.

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