J. of Mult.-Valued Logic & Soft Computing, Vol. 0, pp. 1–15 Reprints available directly from the publisher Photocopying permitted by license only

# Reversible Logic Synthesis Based on Decision Diagram Variable Ordering

DAVID Y. FEINSTEIN<sup>1</sup> AND MITCHELL A. THORNTON<sup>2</sup>

<sup>1</sup>Innoventions, Inc., 10425 Bissonnet Street, Houston, TX, USA <sup>2</sup>Department of Computer Science and Engineering, Southern Methodist University, Dallas, TX, USA E-mail: david@innoventions.com, mitch@lyle.smu.edu

Received: May 20, 2011. Accepted: December 8, 2011.

Reversible logic synthesis is important for the design of conventional logic systems such as adiabatic logic and also for quantum logic systems since all quantum logic gates are necessarily reversible in nature. A framework is presented that improves reversible logic synthesis by employing a dynamically determined variable order for quantum multiple-valued decision diagrams (QMDD). We demonstrate our approach through augmentation of the Miller-Maslov-Dueck (MMD) synthesis algorithm that processes the complete function specification in lexicographical order with our technique. We represent and minimize the complete specification with the QMDD and then synthesize the function specification based on the minimized variable order. The framework produces significantly smaller reversible circuits in many cases. Experimental results also show the effectiveness of using the QMDD size as a measure of the complexity of MVL and binary reversible circuits.

*Keywords:* Reversible logic synthesis; quantum multiple-valued decision diagrams.

# **1 INTRODUCTION**

The extensive research interest in reversible logic synthesis is motivated by its potential for quantum computing applications and low power circuit design. Quantum computing has been actively pursued for the past few decades due to its potential to achieve exponential speed up for some intractable problems such as prime factoring [1] and searching [2]. Quantum devices are necessarily logically and physically reversible logic where there is no fan-out, fan-in, or any feedback. Pioneering work by Landauer, Bennett, Fredkin, and Toffoli investigated the potential of reversible logic to create circuits that theoretically eliminate power dissipation [3, 4, 5, 6]. The process of synthesizing reversible circuits with some desired functionality results in a serial cascade of a variety of basic reversible gates. The synthesis objective is to minimize the number of required gates while also keeping garbage outputs and ancillary inputs to a minimum [7].

Synthesis of reversible circuits is significantly more difficult than conventional logic synthesis as evidenced by the fact that current synthesizers are limited to circuits with less than 20 inputs. Furthermore, optimal synthesis has been achieved only for much smaller circuits with very few inputs [8]. Synthesis is significantly more difficult for *multiple-valued logic* (MVL) reversible circuits [9]. Numerous synthesis paradigms have been proposed, including search-based [10, 11], template matching [12, 13], formal methods using SAT [14], group theory and symmetry based techniques [15], spectral methods [16], and non-search-based lexicographical approaches [17, 18]. Reversible logic synthesizers often use a combination of these techniques.

The MMD synthesis approach combines a fast non-search-based lexicographic algorithm with a search-based template matching post processing phase [17]. While the lexicographic synthesis algorithm is relatively fast and guarantees that a circuit will be synthesized, it often produces an excessively non-optimal circuit implementation. This paper proposes the framework we refer to as "QMDDsyn" that improves the lexicographic synthesis algorithm by adjusting the lexicographic order based on the best variable order obtained by the recently introduced *quantum multiple-valued decision diagrams* (QMDD) [19].

Several researchers have used other decision diagram techniques to determine the cost function during a search-based synthesis approach [9,10,20]. To the best of our knowledge, this research is the first to investigate the relation between the function specification variable order in a decision diagram and the circuit synthesis process. We demonstrate that while the QMDD decision diagram cannot provide a cost function for the reversible circuit complexity, it can improve the synthesis by providing a minimized variable order for the circuit specification.

This paper is organized as follows. In Section 2 we briefly discuss reversible logic, lexicographical reversible logic synthesis, and the QMDD structure. We discuss the theory regarding the relation of a circuit size and it related QMDD structure in Section 3. In Section 4 we describe our approach for the synthesis framework, and present the experimental results in Section 5. Conclusions and suggestions for further research appear in Section 6.

# 2 PRELIMINARIES

#### 2.1 Reversible Logic

Definitions and properties of reversible logic are provided as well as an introduction to quantum multiple-valued decision diagrams (QMDD). More details are available in [4, 5, 19, 21].

**Definition 1**: A binary or MVL gate/circuit is logically *reversible* if it maps each input pattern to a unique output pattern. This mapping is defined by the *transformation matrix* of the circuit.

For binary reversible logic, the transformation matrix is of the form of a permutation matrix. For quantum circuits, the transformation matrix is a unitary matrix with complex-valued elements. An  $n \times n$  reversible circuit with n inputs and n outputs requires a  $r^n \times r^n$  transformation matrix, where r is the radix. The method we present in this paper is applicable to both binary reversible logic circuits (r=2) and MVL circuits (r>2) since both the QMDD data structure and the MMD synthesis approach support MVL reversible logic circuits [9, 21]. A variety of basic reversible gates have been proposed in the past few decades.

**Definition 2:** An *n*-variable generalized *Toffoli gate* is an  $n \times n$  reversible circuit that passes *n*-1 control lines without change and complements the remaining target line if, and only if, the control lines are asserted. We denote a *n*-variable Toffoli gate as TOF  $(x_0, x_1, \ldots, x_{i-1}, x_{i+1}, \ldots, x_{n-1}; x_i)$ , where the target line  $x_i$  is separated by a semicolon from the control lines.

Note that any of the *n* lines of the gate can be specified as the *single* target line. Fig. 1 illustrates an  $n \times n$  Toffoli gate. The *n*-1 control lines are denoted by filled circles while the target line  $X_i$  is marked by an open circle.

Many binary and MVL reversible gates have been proposed [22]. We use the cycle by one, the cycle by two and the self sift ternary gates for the MVL example circuits presented in this work. The transformation matrix of a circuit cascade is computed by multiplying the transformation matrices of the gates, starting with the rightmost gate.

**Definition 3:** The *complete specification* of a reversible function is defined as a listing of all output permutations of the function in a lexicographic order as represented by the function's truth table.

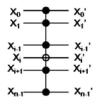


FIGURE 1 *n*-variable Toffoli reversible gate.

The synthesis of a reversible circuit is a process that produces a gate cascade implementing the complete specification while minimizing a cost function. From this point of view, it is crucial to use an appropriate metric for measuring the cost of the circuit.

**Definition 4:** The *quantum cost* of a circuit C is the number of elementary quantum operations that are used to implement the complete specification [23].

An important property of a reversible circuit implementing a given specification is that applying the required outputs to the inputs essentially transforms the output into a lexicographic order. Therefore, taking two copies of the same reversible circuit and connecting one circuit's inputs to the other circuit's outputs implements the identity transformation matrix.

**Definition 5:** The *trivial identity reversible circuit* is a reversible circuit that implements the identity transformation matrix **I**.

Any subsection (or sub-cascade) of a reversible circuit that (inadvertently) implements the identity transformation matrix **I** is redundant. For a cost function based on minimizing the total number of gates in the cascade, it is desirable to detect and remove such subsections.

Reversible logic circuits are implemented using universal set of gates called libraries. While we use the {*NOT, Controlled-NOT, and Tofolli*} (NCT) library in this paper, our results can be systematically applied to other libraries.

## 2.2 Lexicographic Reversible Logic Synthesis

Lexicographic reversible logic synthesizers inspect a complete logic circuit specification and for each input, implement a series of one or more reversible logic gates that translate the input assignments into the specified output assignments. The key idea is that the synthesizer proceeds in a lexicographic order along the specification and once an input-output transformation is made, it must not be changed again. The MMD synthesis approach was proposed in [17] and an MVL version of the algorithm is described in [9]. The gates used by the MMD algorithm are from the NCTSF library. The MMD basic algorithm is bidirectional since the transformation proceeds simultaneously from the inputs to the outputs and from the outputs to the inputs. Such approaches may proceed in any order, and in the case of MMD, can proceed in orders from the top of the lexicographic list to the bottom, or vice versa. Lexicographic synthesizers are non-search based because they select the required translation gates for each output pattern without a search. This results in a relatively fast (although exponentially complex) algorithm which completes the synthesis of the  $r^n$  patterns of the complete specification of an  $n \times n$  function with  $O(nr^n)$  complexity and is guaranteed to converge. These features of the MMD lexicographic synthesis method motivated us to use it as the basis for this research.

In contrast, search-based synthesis algorithms have large time complexity in view of the search and associated backtracking. Kerntopf [11] offered a PPRM

4

heuristic algorithm for reversible logic synthesis using a complexity measure based on shared *binary decision diagrams* (BDD). However, experimental results indicate that such search-based algorithms are effective for small circuits with few inputs/outputs [9]. The MMD algorithm can produce a non-optimal circuit implementation. To mitigate this limitation, the generated circuit undergoes a further minimization step using transformations based on template matching [13]. Template matching can be time consuming as new potential matches may emerge after the completion of a prior match replacement.

Another non-search based lexicographic reversible logic synthesis algorithm was recently introduced in [18]. This algorithm scans the specification lexicographically, and iteratively exchanges pairs of minterms that are out of order in each step. It seems that this approach has limitations similar to those of the MMD algorithm, and that the proposed framework in this paper may be used to enhance this approach.

#### 2.3 Quantum Multiple-valued Decision Diagrams

The transformation matrix *M* of dimension  $r^n \times r^n$  representing an MVL reversible/quantum logic circuit *C* with radix r can be partitioned as

$$M = \begin{bmatrix} M_0 & M_1 & \cdots & M_{r-1} \\ M_r & M_{r+1} & \cdots & M_{2r-1} \\ \vdots & \vdots & \ddots & \\ M_{r^2 - r} & M_{r^2 - r+1} & \cdots & M_{r^2 - 1} \end{bmatrix}$$

where each  $M_i$  element is a submatrix of dimension  $r^{n-1} \times r^{n-1}$ . This partitioning is exploited by the QMDD structure and is used to specify the circuit C in a compact form [19]. In a similar manner to a reduced ordered binary decision diagram (*ROBDD*) [24], a QMDD adheres to a fixed variable ordering and common substructures (representing submatrices) are shared. A QMDD has a single terminal vertex with value 1, and each edge in the QMDD, including the edge pointing to the start vertex, has an associated complexvalued weight.

**Theorem 1:** An  $r^n \times r^n$  complex valued matrix M representing a reversible or quantum circuit has a unique (up to variable reordering or relabeling) QMDD representation.

**Proof**: A proof by induction based on the normalization of edge weights that is performed during the QMDD construction is detailed in [19].

#### **3 CIRCUIT COMPLEXITY VERSUS QMDD SIZE**

In this section we analyze the relation between the reversible logic circuit size and the number of nodes in the QMDD that represents the circuit. **Lemma 1:** Two equivalent reversible circuits composed of a different number of gates result in the same QMDD for a given variable ordering.

**Proof:** The proof results directly from the canonic property of QMDD of Theorem 1, and following the discussion in [25, 26].

Let us assume that circuit *C* of *s* gates and circuit *C'* of *t* gates are two implementations of the same function specification, where t>s. Since Lemma 1 indicates that *C* and *C'* are represented by the same QMDD, it is clear that the QMDD size cannot be used as a measure of circuit size complexity. A reversible circuit may even include partially redundant logic that artificially increases its size as shown in [28]. Furthermore, lemma 2 illustrates that an arbitrarily large section of a synthesized circuit may be a trivial identity that cannot be reflected in the size of the QMDD.

**Lemma 2:** There exists an  $n \times n$  trivial identity reversible circuit cascade with any arbitrary even number of gates.

**Proof:** Let m = 2k be the number of gates in a circuit, where k is an integer so that  $k \ge 0$ . For k = 0, the circuit merely consists of all the lines and therefore is a *trivial identity* circuit. For k=1, we make a cascade of two gates consisting of an arbitrary gate followed by its inverse. It is easy to see that such a circuit is a trivial identity reversible circuit. For k>1, we first build a cascade C of k arbitrary gates. We then build another cascade C' using exactly the same gates but in a *reversed order*. Let A and A' be the transformation matrices of C and C' respectively. Since C is equivalent to reversing a cascade so that the outputs exchange with the inputs,  $A'=A^T$ . It then follows that  $A' \times A = A^T \times A = I$ , which completes the proof.

These results predict that QMDD size is not likely to correlate to the circuit size. Lemma 1 shows that an efficiently synthesized circuit will produce the same QMDD size as a larger circuit that was inefficiently synthesized to the same specification. Lemma 2 illustrates that a reversible circuit may inadvertently contain a redundant trivial reversible sub-circuit that increases the number of gates without changing the QMDD size.

We try to estimate the size of the binary QMDD (in non-terminal nodes) in view of the circuit specification. A trivial identity  $n \times n$  reversible circuit requires *n* non-terminal nodes. Since a binary QMDD has four edges exiting from each non-terminal node, the upper limit for QMDD size is reached if each edge points to a different node in a unique way. This condition is a geometric series with size equal to

$$S_n = \sum_{i=1}^n 4^{i-1}$$
(1)

for the binary case. For the ternary MVL case, the expression becomes.

$$S_n = \sum_{i=1}^n 9^{i-1}$$
(2)

However, the transformation matrix represented by the QMDD for reversible logic is a permutation matrix that has only a single '1' element in each row and each column [21]. This immense sparsity leads to significantly smaller QMDD sizes than predicted by (1) which we examine empirically in the next section.

# **4 THE SYNTHESIS METHOD**

The "QMDDsyn" framework attempts to reduce the size measured by the quantum cost of the circuit produced by the reversible logic lexicographic synthesizer. We were inspired by the approach that Fujita et al. took in minimizing binary decision diagram for classical irreversible logic [27]. Following the structural shape of the circuit, they minimized the number of wire crossings and gave priority to fan-outs encountered in the depth-first transversal from the outputs to the inputs of the circuit. In this work we use a similar approach, but in reverse - we use the best variable order corresponding to a minimized QMDD representation of the circuit to reorder the specification given to the lexicographic synthesizer. The goal is to achieve a smaller synthesized circuit from the reordered specification compared to a circuit synthesized from the original specification. The time consuming process of template matching is delayed until it can be provided with a smaller circuit to optimize. Fig. 2 illustrates this process.

We first synthesize the function specification lexicographically to obtain the *baseline circuit C1*. In the experiments described here, we used MMD for the first step, however any initial mapping or existing circuit cascade could be used and optimized with our approach. This circuit is converted into a QMDD representation and a sifting minimization using *dynamic variable ordering* (DVO) is performed [21, 25, 28]. While the QMDD can be built directly from the complete specification, we use the baseline circuit *C1* to gauge the efficiency of the proposed framework's results.

The complete specification is re-ordered based on the variable order that resulted from the minimized QMDD. The re-ordered specification is used to lexicographically synthesize a new *candidate circuit C2*. Since we use the bidirectional version of the MMD algorithm, the framework also re-orders the complete specification in the *reversed* variable order of the minimized QMDD. This reversed re-ordered specification is used to synthesize another *candidate circuit C3*.

The framework then selects the **smaller** of circuits C1, C2, and C3 for the final step of template matching minimization. Since the QMDD minimization may provide several variable orders that produce the same minimized QMDD, the process of Fig. 2 may be repeated for each minimal variable order (and its reversed order) in an attempt to obtain an even smaller candidate circuit

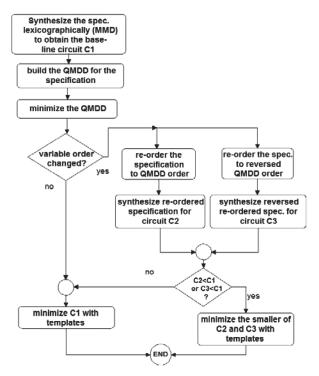


FIGURE 2 The "QMDDsyn" Framework.

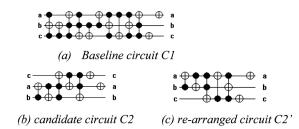


FIGURE 3

Minimization of a 3-variable circuit for the specification (5,3,4,7,2,6,1,0).

**Example 1:** In the following example the QMDDsyn framework demonstrates the synthesis of the 3-variable function complete specification representing the mapping (or permutation) of the ordered 8-tuple (0,1,2,3,4,5,6,7) to (5,3,4,7,2,6,1,0). We first use the MMD unidirectional algorithm to produce circuit *C1* of 12 gates with a quantum cost of 30 as shown in Fig. 3a. For clarity, we first illustrate the approach using the simplified case of binary circuit benchmarks with a unidirectional version of the MMD algorithm. Results for ternary-valued circuits are given later in the paper.

8

While this initial circuit may not be optimal, it is an exact implementation of the specification. Using the initial variable order of a < b < c, C1 is represented by a QMDD with 10 non-terminal nodes. The QMDD is minimized by the QMDDsyn framework to 9 non-terminal nodes with variable order of b < a < c.

The specification is reordered by first applying the new variable order as shown on the left truth table of Table 1. The results need to be ordered lexicographically (in ascending binary order) according to the input as shown in the right truth table of Table 1.

The MMD unidirectional algorithm is applied on this reordered specification represented by the 8-tuple (3,4,6,5,1,2,7,0) to produce the *candidate circuit C2* of 7 gates with quantum cost of 11 as shown in Fig. 3b.

The variable lines of C2 are re-arranged according to the variable order by moving the top line to the bottom while still keeping the same gates' connections. The final circuit C2' is shown in Fig. 3c.

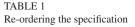
The QMDDsyn framework verifies that circuit C2' is equivalent to C1 as they are both represented by the same QMDD in view of Theorem 1. This example illustrates an overall size reduction in terms of quantum cost of 11/30 (53%). In this illustrative example C3 was not computed since only the unidirectional MMD algorithm is used to demonstrate the concept. In the following experimental results we use the bidirectional MMD algorithm for the lexicographic synthesis step and report the reversed order *candidate circuit* C3 as well as C2 size for each benchmark.

### **5 EXPERIMENTAL RESULTS**

#### 5.1 QMDD Size versus Circuit Size

We explored binary and ternary circuits of 5, 6, and 7 variables, with a number of gates ranging up to 100 to gauge the relation between the circuit size

bac	b'a'c'		bac	b'a'c'
000	011		000	011
010	110	Ordering	001	100
100	001	lexicographically	010	110
110	111	$\rightarrow$	011	101
001	100		100	001
011	101		101	010
101	010		110	111
111	000		111	000



and its QMDD representation. Our experimental results for binary circuits are collected in Table 2 while our experiments with ternary circuits appear in Table 3.

For each binary circuit with a given number of gates we show the quantum cost and the number of nodes in the QMDD representing the circuit. The results in Table 2 that use published benchmarks are marked with a superscripted file identifier as follows: 1 - ``mod5d1'' (8 gates), 2 - ``hwb5tc'' (55 gates), 3 - ``2of5d1'' (18 gates), 4 - ``rd53d1'' (12 gates), and 5-ham7tc (23 gates). The other circuits were generated by selecting Toffoli gates with a random number of control lines and random connections.

The binary circuits demonstrate that the QMDD size does not follow the circuit size once the circuit size passes 20-40 gates. In contrast, the quantum cost does follow the circuit size, as expected. For example, for 5-variables, a circuit with 90 gates is represented by a QMDD with 42 nodes, less than the 46-node QMDD that represents the circuit with 40 gates. These experimental results illustrate the outcome of Lemma 1 and Lemma 2, as well as the work on partially redundant reversible logic reported in [27,28].

Since there are very few published ternary benchmark circuits, we have re-used the 5-variable circuits discussed in our previous work [21]. We randomly created additional ternary circuits with 6, and 7 variables as shown in Table 3. For the random circuits with 5 variables, we show that a 75-gate circuit produces smaller QMDD than an 100-gate circuit. Similarly, for the random circuits with 7 variables we show that an 100-gate circuit produces a

	5-v	ars	6-va	rs	7	-vars
Gates	Quant. cost	QMDD size	Quant. cost	QMDD size	Quant. cost	QMDD Size
0 (Ident)	0	5	0	6	0	7
1	5	13	1	11	5	17
10	24(1)	19(1)	158	42	120 <sup>(4)</sup>	26 <sup>(4)</sup>
20	208	36	158 <sup>(3)</sup>	56 <sup>(3)</sup>	81 <sup>(5)</sup>	130 <sup>(5)</sup>
30	310	41	494	82	836	137
40	424	46	696	77	968	141
50	510	44	830	84	1340	134
60	313(2)	47 <sup>(2)</sup>	1016	83	1712	153
70	682	42	1186	72	1968	149
80	808	46	1388	82	2344	140
90	918	42	1388	82	2716	164
100	1036	45	1824	83	3047	176

#### TABLE 2 QMDD Size versus Binary Circuit Size

Gates	5 -vars	6-vars	7-vars
10	60	23	25
25	132	171	271
50	204	369	827
75	196	619	1661
100	203	641	1275

TABLE 3

QMDD Size versus Ternary Circuit Size

smaller QMDD than the 75-gate circuit. These experimental results clearly show that, following the pattern we saw with the binary circuits of Table 2, the QMDD size does not follow the circuit size once it passes a relatively small number of gates. It is also quite obvious from the results that the number of nodes is substantially lower than the maximum bound of equation (2).

#### 5.2 Lexicographic Synthesis Guided by Variable Order

The synthesis results obtained with the QMDDsyn framework for binary circuits are shown in Table 4. We use the complete specification from the published benchmark circuits [29] as well as the specification obtained from the random circuits introduced in Table 2. For each specification, we list the number of variables in column 2 and the QMDD size in non-terminal nodes in column 3. The minimization results are shown in columns 4 to 5. Column 6 lists the variable order obtained during the QMDD minimization. Column 7 shows the quantum cost of the baseline circuit *C1*. Column 8 displays the quantum cost of candidate circuit *C2* obtained with the variable reorder of column 6. In both cases, the quantum cost is computed by Maslov's RCviewer utility [29] which follows definition 4. Column 9 lists the quantum cost of the reversed order candidate circuit *C3*. In column 10 there is a comparison quantum cost for circuit *C4* that is synthesized with a random variable order.

The quantum cost improvement obtained when using the minimized QMDD variable reorder is depicted in column 11. Negative percentage indicates that the QMDDsyn obtained a smaller circuit with the variable reorder. We should note that the smaller of circuits C2 and C3 is compared to the baseline circuit C1, as discussed in Section 3.1.

The results show significant improvement in the quantum cost using the approach of QMDDsyn for many benchmark circuits. There is generally a good correlation between the level of QMDD size reduction and the improvement in the quantum cost. An exception for this correlation was encountered with the "5mod5tc" benchmark circuit, which obtained a QMDD size minimization of 47% and yet no reduction in the circuit size.

As is observed in Table 2, the QMDD size grows rapidly from the number of variables (for trivial circuit) to a certain fluctuating range. Smaller QMDD

nodes         reduction         reorder         reorder         reorder         reorder         reorder         reorder           4         21         20         4.76%         0213         135         126         196         199           4         21         20         4.76%         0213         135         126         169         199           5         44         22         20         9.09%         02134         488         87         98         70           5         44         34         223         1015%         20314         441         312         287         98         86           5         6         58         153         464%         57         370         409         464           6         58         153         4043         51045         513         411         312         287         287         286           6         58         15         464%         310455         1514         441         312         287         166         194           6         78         310455         1518         1146         191         161         146         194           7<	Specification	Vars	QMDD	Minim.	QMDD	Variable	Circuit C1 (w/o	Circuit C2	Circuit C3	Circuit C4	Reordered
(%)         (%)         Quantum cost         Quantum cost	Source		nodes	nodes	reduction	reorder	reorder)	(with reorder)	(reversed reorder)	(random	Quantum cost
(%)         Quantum cost         Quantum cost $200$										reorder)	change
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$					(20)		Quantum cost	Quantum cost	Quantum cost	Quantum cost	(%)
$ \begin{array}{lcccccccccccccccccccccccccccccccccccc$	4_49tc1	4	21	20	4.76%	0213	135	126	169	199	-6.66%
$ \begin{array}{lcccccccccccccccccccccccccccccccccccc$	hwb4tc	4	22	20	9.09%	0213	96	87	87	88	-9.35%
$ \begin{array}{lcccccccccccccccccccccccccccccccccccc$	hwb5tc	5	47	38	19.15%	$0\ 2\ 3\ 1\ 4$	488	487	518	536	0%
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	rand5v1	5	36	32	11.11%	20314	441	312	287	200	-35.60%
	rand5v2	5	44	34	22.73%	$2\ 1\ 0\ 3\ 4$	567	370	409	464	-34.74%
	rand5v3	5	41	37	9.76%	23014	421	475	360	466	-14.48%
	5mod5tc	9	28	15	46.43%	531402	185	185	185	185	0%0
6         64         42 $34.38\%$ $310425$ $1114$ $619$ $661$ $845$ $-$ 6         78 $67$ $14.10\%$ $310245$ $1518$ $1643$ $1460$ $1941$ 6         77         69 $10.39\%$ $210345$ $1518$ $1643$ $1460$ $1941$ 7         26         21 $1923\%$ $2103456$ $176$ $188$ $1201$ $1361$ 7         26         21 $1923\%$ $2103456$ $176$ $188$ $1201$ $1361$ 7 $266$ $21,03456$ $7076$ $3109$ $1744$ $2413$ $-$ 7 $141$ $100$ $29.03\%$ $34205166$ $5028$ $4640$ $7099$ $6999$ 7 $141$ $100$ $29.03\%$ $32054166$ $5028$ $4640$ $7099$ $6999$ 7 $134$ $111$ $1716$ $32033$ $1201$ $1202$ $7339$ <	2of5d1	9	56	49	12.50%	310452	525	481	507	766	-8.38%
6         78         67 $14,10\%$ $310245$ $1518$ $1643$ $1460$ $1941$ 6         82         72 $12.00\%$ $210345$ $2218$ $1753$ $2121$ $1951$ $-$ 7 $26$ $21$ $92.3\%$ $210345$ $1168$ $1534$ $1767$ $1861$ 7 $26$ $21$ $92.3\%$ $210345$ $176$ $188$ $120$ $139$ 7 $25$ $56$ $41.00\%$ $2430615$ $2997$ $3109$ $1744$ $2413$ 7 $123$ $75$ $39.02\%$ $3420516$ $6902$ $6159$ $4170$ $4987$ 7 $134$ $111$ $17.16\%$ $3205416$ $5023$ $4640$ $7099$ $6999$ 7 $134$ $111$ $17.16\%$ $3205415$ $5770$ $7162$ $7538$ 7 $134$ $111$ $17.16\%$ $32034167$ $2933$ $11136$ $7099$ <t< th=""><td>rand6v1</td><td>9</td><td>64</td><td>42</td><td>34.38%</td><td></td><td>1114</td><td>619</td><td>661</td><td>845</td><td>-44.43%</td></t<>	rand6v1	9	64	42	34.38%		1114	619	661	845	-44.43%
6         82         72 $12,00\%$ $210345$ $2218$ $1753$ $2121$ $1951$ $1951$ 7 $26$ $21$ $10,39\%$ $210345$ $1668$ $1584$ $1767$ $1861$ 7 $26$ $21$ $19,23\%$ $210345$ $176$ $188$ $120$ $139$ 7 $25$ $56$ $41,00\%$ $2430615$ $2997$ $3109$ $1744$ $2413$ 7 $123$ $75$ $39.02\%$ $3420516$ $6902$ $6159$ $4170$ $4987$ 7 $134$ $111$ $17.16\%$ $32.05416$ $6902$ $6159$ $4170$ $4987$ 7 $134$ $111$ $17.16\%$ $32.05415$ $5028$ $4640$ $7099$ $6999$ 7 $176$ $147$ $1470$ $4987$ $23034157$ $2933$ $11136$ $7099$ $6991$ 8 $167$ $60$ $64.07\%$ $25034167$ $2933$ <td>rand6v2</td> <td>9</td> <td>78</td> <td>67</td> <td>14.10%</td> <td>310245</td> <td>1518</td> <td>1643</td> <td>1460</td> <td>1941</td> <td>-3.82%</td>	rand6v2	9	78	67	14.10%	310245	1518	1643	1460	1941	-3.82%
	rand6v3	9	82	72	12.00%	210345	2218	1753	2121	1951	-20.96%
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	rand6v4	9	LL	69	10.39%	210345	1668	1584	1767	1861	-5.03%
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	rd53d1	7	26	21	19.23%	2103456	176	188	120	139	-31.81%
7       123       75       39.02%       34.20516       6902       6159       4170       4987       -         7       141       100       29.08%       4.203516       50.28       4640       7099       6999         7       134       111       17.16%       3.205416       6390       5770       7162       7558         7       176       147       16.48%       2.304156       7075       7792       7609       6981         8       167       60       64.07%       2.0546137       2933       1136       8081       8510       -         8       242       150       38.02%       25034167       22968       19227       23370       22338       -         8       313       210       32.91%       35201647       20951       17094       13585       23105       -         9       114       59       48.25%       04.237518       55200       56569       29422       55510       -         9       242       18       53000       55569       29422       55512       -         9       348       5306       5409       5403       69310       55512       -	rand7v1	7	95	56	41.00%	2430615	2997	3109	1744	2413	-41.81%
7       141       100       29,08%       4203516       5028       4640       7099       6999         7       134       111       17,16%       3205416       6390       5770       7162       7558         7       176       147       16.48%       2304156       7075       7792       7609       6991         8       167       60       64,07%       2304156       7075       7792       7609       6981         8       167       60       64,07%       20546137       2933       1136       8081       8510       -         8       242       150       38.02%       25034167       22968       19227       23370       22338       -         9       114       59       48.25%       04237518       59051       17094       13585       23105       -         9       242       186       14242       11680       4930       55210       -	rand7v2	7	123	75	39.02%	$3\ 4\ 2\ 0\ 5\ 16$	6902	6159	4170	4987	-39.58%
7       134       111       17.16%       32.05416       6390       5770       7162       758         7       176       147       16.48%       23.04156       7075       7792       7609       6981         8       167       60       64.07%       2.0546137       2933       1136       8081       8510       -         8       242       150       38.02%       2.50.34167       22968       19227       23370       223388       -         8       313       210       32.91%       3.52.01647       20951       17094       13585       23105       -         9       114       59       48.25%       0.42.37518       55200       5659       29420       25970       -         9       242       186       20.3647518       55200       56569       29422       55512       -         9       3.48       3.77       8.47518       55200       56569       29422       55512       -         9       3.48       57.03.47618       6300       56369       29422       55512       -	rand7v4	7	141	100	29.08%	4203516	5028	4640	7099	6669	-7.71%
7         176         147         16.48%         2304156         7075         7792         7609         6981           8         167         60         64.07%         20546137         2933         1136         8081         8510         -           8         242         150         38.02%         25034167         22968         19227         23370         22338         -           8         313         210         32.91%         35201647         20951         17094         13585         23105         -           9         114         59         48.25%         04237518         55200         56569         29422         55512         -           9         242         186         23.47618         55000         56569         29422         55512         -           9         348         377         8.47618         63000         5604         67311         60341         -	rand7v5	7	134	111	17.16%	$3\ 2\ 0\ 5\ 4\ 1\ 6$	6390	5770	7162	7558	-9.70%
8         167         60         64.07%         20546137         2933         1136         8081         8510           8         242         150         38.02%         25034167         22968         19227         22388           8         313         210         32.91%         35201647         20951         17094         13585         23105           9         114         59         48.25%         04237518         55200         56569         29422         55512           9         242         186         203.647518         55200         56569         29422         55512           9         3.6         33.7         8.47%         5.03.647518         55200         56569         29422         55512           9         3.6         3.37         8.476.8         5.03.647618         6300         55014         60341	rand7v6	7	176	147	16.48%	2304156	7075	7792	7609	6981	+7.54%
8         242         150         38.02%         25034167         22968         19227         23370         22388           8         313         210         32.91%         35201647         20951         17094         13585         23105           9         114         59         48.25%         042375186         14242         11680         4930         22970           9         242         186         23.14%         203647518         55200         56569         29422         55512           9         368         337         8.476.18         63000         55043         60341         60341	rand8v1	8	167	09	64.07%	$2\ 0\ 5\ 4\ 6\ 1\ 3\ 7$	2933	1136	8081	8510	-61.26%
8         313         210         32.91%         35.201647         20951         17094         13585         23105           9         114         59         48.25%         0.42.375186         14242         11680         4930         22970           9         242         186         23.14%         2.03.647518         55200         56569         29422         55512           9         3.68         3.73.476.18         53.000         56569         29422         55512           9         3.68         3.37         8.476.18         53.000         5603         29422         55512	rand8v2	8	242	150	38.02%	25034167	22968	19227	23270	22388	-16.29%
9         114         59         48.25%         0.4237518.6         14242         11680         4930         22970           9         242         186         20.364751.8         55200         56569         29422         55512           9         3.68         3.37         8.476.18         6.3000         56504         29422         55512           9         3.68         3.37         8.476.18         6.3000         5600         50.431         60341	rand8v3	8	313	210	32.91%	35201647	20951	17094	13585	23105	-35.18%
9 242 186 23.14% 2.0.3.6.4.7.5.18 5.5200 5.6569 2.9422 5.5512 0 3.68 337 8.42% 5.2.0.3.4.7.6.18 6.3000 5.5074 6.7.431 6.0.341	rand9v1	6	114	59	48.25%	042375186	14242	11680	4930	22970	-65.38%
0 368 337 8 42% 5 2 0 3 4 7 6 1 8 6 3000 5 5 6 2 4 1 6 0 3 1	rand9v2	6	242	186	23.14%	203647518	55200	56569	29422	55512	-46.69%
	rand9v3	6	368	337	8.42%	$5\ 2\ 0\ 3\ 4\ 7\ 6\ 1\ 8$	63009	55924	62431	60341	-11.24%

12

## D. Y. FEINSTEIN AND M. A. THORNTON

TABLE 4 QMDD Synthesis Results size indicates less permutation by the specification. It seems from our results that specifications with smaller QMDD sizes (i.e. less permutation) are likely to produce better quantum cost reduction on the QMDDsyn framework.

Since this approach is based on a heuristic, it does not work in all cases, and for several specifications ("hwb4tc", "rand5v1", "rand7v6"), the selection of a random variable order obtained a better quantum cost reduction. There is an 8% quantum cost deterioration for "rand7v6". The file "5mod5tc" resists any size change apparently due to its unique construction with 5 garbage outputs and only one controlled output.

The run times for the QMDDsyn framework are not shown in Table 4 since they are not substantially different than the "MMD" run times, except that the synthesis process is repeated two times to evaluate candidate circuits C2 and C3.

It is interesting to note that the efforts of Fujita et al. to reduce the size of BDD for classical irreversible circuits based on variable order selection produced spectacular results [25]. Our results indicate that similarly inspired heuristics for reversible logic are likely to have much less dramatic improvements. We suspect that this outcome is likely due to the inherent maximal connectivity associated with each circuit variable [27].

# 6 CONCLUSIONS AND FUTURE WORK

This paper has considered the affect of variable re-ordering of the complete specification on the lexicographic synthesis of reversible circuits. We have demonstrated a framework that changes the variable order of the function specification based on the minimization of the QMDD representation of the function. Like any heuristic approach, the experimental results show the method to be quite effective for some circuit benchmarks while sometimes having little or no benefit for others. Since the execution time of the lexicographic synthesizer is predictable, our approach does not significantly increase the overall execution time.

We demonstrated that the size of ternary and binary reversible circuits has no direct correlation to the size of their QMDD representation. In particular, the lack of correlation is more apparent for larger reversible circuits as compared to smaller circuits.

We are investigating the suitability of the proposed method on other non search-based reversible logic synthesizers. We are also considering additional methods to obtain synthesized reversible circuits directly from the minimized QMDD data structure representing the function's complete specification.

Because the MVL version of MMD that we used works efficiently only up to about 4 input circuits, we are currently automating the synthesis method based on MVL circuit functions with the arithmetic property of heredity [30]. While this approach will only generate MVL example circuits that have heredity, it is possible to synthesize significantly larger cascades that will be useful for future experimentation.

# ACKNOWLEDGEMENT

The authors would like to acknowledge Professor D. Michael Miller for providing versions of the binary and MV-MMD synthesis programs for use in this work.

#### REFERENCES

- P. W. Shor, "Algorithms for quantum computation: Discrete log and factoring", In Proc. of the 35<sup>th</sup> Annual Symposium on Foundations of Computer Science, pp. 124–134, 1994.
- [2] L. Grover, "A Fast Quantum Mechanical Algorithm for Database Search", In Proc. ACM Symp. on Theory of Computing, pp. 212–219, 1996.
- [3] R. Landauer, "Irreversibility and Heat Generation in the Computing Process," In *IBM J. Res. and Dev.*, vol. 3, pp. 183–191.
- [4] C. H. Bennett, "Logical reversibility of computation," *IBM J. Res. Dev.*, Vol. 17, No. 6, pp. 525–532, 1973.
- [5] E. Fredkin and T. Toffoli, "Conservative Logic," Int. J. Theoretical Physics, vol. 21, nos. 3-4, pp. 219–253, 1982.
- [6] T. Toffoloi, "Reversible Computing," In Automata, Languages, and Programming, Springer Verlag, pp. 632–644, 1980.
- [7] D. C. Marinescu and G. M. Marinescu. Approaching Quantum Computing. Pearson Prentice Hall, 2005.
- [8] V. V. Shende, A. K. Prasad, I. L. Markov, and J. P. Hayes, "Synthesis of reversible logic circuits", In *ICCAD*'02, pp. 353–360, 2002.
- [9] D. M. Miller, G. Dueck, and D. Maslov, "A Synthesis Method for MVL Reversible Logic," In *ISMVL'04*, pp. 74–80, 2004.
- [10] P. Gupta, A. Agrawal, and N. K. Jha, "An algorithm for synthesis of reversible logic circuits", In IEEE Trans. CAD, Vol. 25, No. 11, pp. 2317–2330, 2006.
- [11] P. Kerntopf, "A new heuristic algorithm for reversible logic synthesis", In DAC'04, pp. 835–837, 2004.
- [12] K. Iwama, Y. Kambayashi and S. Yamashita, "Transformation rules for designing CNOTbased quantum circuits", In DAC'02, pp. 419–425, 2002.
- [13] D. Maslov, G. W. Dueck, and D. M. Miller, "Simplification of Toffoli networks via templates", In *16th Symposium on Integrated Circuits and System Design*, Sao Paulo, Brazil, On CD ROM, 2003.
- [14] R. Wille and D. Groβe, "Fast exact Toffoli network synthesis of reversible logic", *ICCAD*'07, pp. 60–63, 2007.
- [15] Y. Guowu, X. Fei, S. Xiaoyu, W. N. N. Hong, M.A. Perkowski, "A Constructive Algorithm for Reversible Logic Synthesis", In CEC'06, pp. 2416–2421, 2006.
- [16] D. M. Miller, "Spectral and two-place decomposition techniques in Reversible Logic", In Proc. IEEE Midwest Symp. Circuits and Systems, August 2002.

14

- [17] D. M. Miller, D. Maslov, and G. W. Dueck, "A transformation based algorithm for reversible logic synthesis", In DAC'03, pp. 318–323, 2003.
- [18] M. Saeedi, M. Seighi, and M. S. Zamani, "A novel synthesis algorithm for reversible circuits", In *ICCAD*'07, pp. 65–68, 2007.
- [19] D. M. Miller and M. A. Thornton, "QMDD: A Decision Diagram Structure for Reversible and Quantum Circuits," In *ISMVL'06*, on CD, 2006.
- [20] A. Abdollahi and M. Pedram, "Efficient synthesis of quantum logic circuits by rotationbased quantum operators and unitary functional bi-decomposition", In *IWSL'05*, on CD ROM, 2005.
- [21] D. M. Miller, D. Y. Feinstein, and M. A. Thornton, "QMDD Minimization using Sifting for Variable Reordering", In *Journal of Multiple-valued Logic and Soft Computing*, Vol. 13, no. 4–6, pp. 537–552, 2007.
- [22] A. De Vos, B. Raa and L. Storme, "Generating the group of reversible logic gates", In J. Phys. A:Math. Gen. 35(2002) pp. 7063–7078, 2002.
- [23] A. Barenco, C. H. Bennett, R. Cleve, D. P. DiVincenzo, N. Marolus, P. Shor, T. Sleator, J. A. Smolin, and H. Weinfurter, "Elementary gates for quantum computations", In *Phys. Rev. A.*, Vol. **52**, no. 5, pp. 3457–3467, 1995.
- [24] R. E. Bryant, "Graph-Based Algorithms for Boolean Function Manipulation", In *IEEE Trans. Computers*, C-35(8):677–691, 1986.
- [25] D. Y. Feinstein, Computer-Aided-Design Methods for Emerging Quantum Computing Technologies, Ph.D. Thesis, Southern Methodist University, 2008.
- [26] D. Y. Feinstein, M. A. Thornton, and D. M. Miller, "Partially Redundant Logic Detection Using Symbolic Equivalence Checking in Reversible and Irreversible Logic Circuits", In *DATE*'08 pp 1378–1381, 2008.
- [27] M Fujita, H. Fujisawa, and T. Kawato, "Evaluations and Improvements of a Boolean Comparison Method Based on Binary Decision Diagrams", In *ICCAD*'88, pp. 50–54, 1988.
- [28] D. Y. Feinstein, M. A. Thornton, and D. M. Miller, "On the Data Structure Metrics of Quantum Multiple-valued Decision Diagrams", In *ISMVL'08*, pp. 138–143, 2008.
- [29] D. Maslov. Reversible logic synthesis benchmarks page. Online: http://www.cs.uvic. ca/~dmaslov/.
- [30] M. A. Thornton, D. W. Matula, L. Spenner, and D. M. Miller, "Quantum Logic Implementation of Unary Arithmetic Operations", In *ISMVL'08*, pp. 202–207, 2008.