# A Parallel Approach to Convert Quantum Circuits to an LNN Architecture 

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#### Abstract

This paper describes four algorithms implemented to solve the problem of converting general quantum circuits to a Linear Nearest Neighbor (LNN) architecture. All the implemented algorithms are based on the HIRATA II algorithm and consider two improvements: (i) the use of parallel computing, and (ii) branch \& bound technique. The proposed parallel algorithms are tested with the largest test circuit presented in the work of Hirata et al., this circuit correspond to Shor's factorization algorithm (named as Shor10 circuit). Experimental results show a speedup of an order of magnitude from hours to seconds, improving slightly the quality of the converted circuit, measured as the number of inserted swap gates.


Keywords-LNN architecture; Quantum Circuits; Parallel Computing.

## I. INTRODUCTION

The design of a general quantum circuit allows the interaction of non-adjacent qubits; however, the current technology may not allow the interaction between non-adjacent qubits [13]. Therefore, quantum circuits require an architecture that facilitates implementation. Linear Nearest Neighbor (LNN) architecture [16] facilitates the implementation of quantum circuits. The conversion of a general quantum circuit to an LNN architecture is a hard task for conventional heuristics.

Among several alternatives, HIRATA II algorithm [11] provides a general conversion scheme applicable to nontrivial quantum circuits. Therefore, this paper proposes several parallel versions of HIRATA II algorithm. Proposed parallel versions implement a branch and bound scheme [19] to improve algorithm performance.

The algorithms implemented in this work are tested with the largest circuit considered in the work of Hirata et al. [11] to prove the advantage of the proposed alternatives.

Parallel computing seems an interesting alternative for this work given the size of computation, and availability of multicore processors in today servers. This way, the studied problem may be solved considerable faster with a cluster of computers or even a multi-core Central Processor Unit (CPU) as far as the problem can be efficiently partitioned in smaller subproblems.

This work is organized as follows: Section II presents the general conversion problem while Section III describes HIRATA II algorithm. Then, the implemented algorithms are presented in Section IV while experimental results are presented in Section V. Finally, conclusions are left for Section VI, where future works are also presented.

## II. Conversion of general quantum circuits to an LNN ARCHITECTURE

There are already known methods to convert a quantum circuit to an LNN architecture. Fowler et al. [5] describe a construction scheme of quantum circuits in LNN architecture. On the other hand, Hirata et al. [11] present a general conversion scheme applicable to any quantum circuit that is considered in this work for parallelization.
The process of converting a quantum circuit to LNN architecture involves the insertion of SWAP gates to the original circuit to change the order of the qubits in such a way that needed gates only opperate on neighboring qubits.
The conversion of a general quantum circuit to the LNN architecture is defined by Hirata et al. [11] as:

- Input: a general quantum circuit, composed of $N$ qubits and $K$ gates.
- Output: an equivalent LNN quantum circuit.
- Objective: to minimize the total SWAP gates added.
- Restriction: the equivalent circuit output should have all qubits in the same original order.
Quantum gates are in LNN architecture if the qubits necessary to operate a gate are adjacent. A quantum circuit is in a LNN architecture when all its gates are LNN.

Circuit in Figure 1 represents a quantum circuit that is not in an LNN architecture. The circuits in Figures 2 and 3 are in LNN architecture and they are equivalent to the circuit in Figure 1. Moreover, the circuit in Figure 3 represents the best solution of the two alternatives because it adds fewer SWAP gates to the original circuit. In fact, the number of inserted SWAP gates needed to convert a general quantum circuit to an LNN architecture is here considered as the main quality indicator of the convertion process.


Figure 1. A quantum circuit not LNN


Figure 2. A quantum circuit equivalent to the one presented in 1 in an LNN architecture


Figure 3. LNN quantum circuit equivalent to circuit of 1 with fewer SWAP gates

## III. HIRATA II Algorithm

Hirata et al. [11] presented the HIRATA II algorithm to reduce the number of candidates to be evaluated in the convertion of a general quantum circuit to on LNN architecture with respect to classic heuristics as greedy algorithms.

As explained in detail in [11], HIRATA II algorithm defines an objective function $f$ to be minimized wich can be evaluated for each candidate solution. The objective function to evaluate candidates is given by:

$$
\begin{equation*}
f\left(n_{i, j}\right)=f_{1}\left(n_{i, j}\right)+f_{2}\left(n_{i, j}\right)+f_{3}\left(n_{i, j}\right) \tag{1}
\end{equation*}
$$

with:

$$
\begin{gathered}
f_{1}=l o c a l \_s e a r c h_{w}\left(n_{i, j}, w\right) \\
f_{2}=\text { calc_swaps }\left(c_{-} \text {order }, n_{i, j}\right) \quad \text { and } \\
f_{3}=\frac{c_{k}}{k-i+1} \text { calc_swaps }\left(n_{i, j} l_{-} \text {order }\right)
\end{gathered}
$$

where $n_{i, j}$ represents the current candidate $j$ for the current gate $i$; c_order is a list that represents the current order of the qubits while l_order is a list representing the initial order of the qubits. local_search $\left(n_{i j}\right)$ represents the lowest cost of converting the following $w$ gates if $j$ is chosen. calc_swaps $\left(c_{-}\right.$order, $\left.n_{i j}\right)$ is the number of SWAP gates necessary to obtain $n_{i j}$ from c_order. $\frac{c_{k}}{k-i+1}$ calc_swaps $\left(n_{i j} l_{-}\right.$order $)$represents an estimation of the cost necessary to re-order the final order to the original order (see restriction in Section I). This term receives more preponderance in the conversion when the process progresses and it gets closer tho the end. The $c k$ constant is chosen a priori.

## IV. Implemented Algorithms

In this paper, three algorithms are proposed based on the original HIRATA II algorithm. The H2-S version is a sequential algorithm that implements a branch and bound technique

```
Algorithm 1 HIRATA II
Require: \(N, K, w\)
    l_order \(\leftarrow\{0,1,2, \ldots, N-1\}\)
    c_order \(\leftarrow\) l_order
    swaps \(\leftarrow 0\)
    \(i \leftarrow 0\)
    \(M I N \leftarrow \infty\)
    while \(i<K\) do
        \(n \leftarrow\) makeCandidates(c_order, \(i\) )
        \(j \leftarrow 0\)
        while \(j \leq|n|-1\) do
            AUX \(\leftarrow\) evaluate_objective_function()
            if \(A U X<M I N\) then
                \(S \leftarrow \emptyset / /\) List of candidates \(n_{i j}\), the amount of
                swap gates was minimal.
                \(S \leftarrow S \cup n \_i j\)
                \(M I N \leftarrow \overline{A U X}\)
            else if \(A U X=M I N\) then
                \(S \leftarrow S \cup n_{i j}\)
            end if
            \(j+1\)
        end while
        \(S_{a} \leftarrow \operatorname{random}(S)\) // Candidate \(n_{i j}\) the set S chosen
        randomly.
        swaps \(\leftarrow\) swaps + calc_swap \(\left(c \_o r d e r, S_{a}\right)\)
        \(n \leftarrow \emptyset\)
        \(S \leftarrow \emptyset\)
        c_order \(\leftarrow S_{a}\)
        \(i \leftarrow i+1\)
    end while
    swaps \(\leftarrow\) swaps + calc_swap \(\left(c \_o r d e r, l \_o r d e r\right)\)
    return swaps
```

Figure 4. Hirata II sequential algorithm
in the evaluation of $f_{1}$ needed for the calculation of objective function (2).

All parallel algorithms implement a branch and bound technique. Figure 7 shows an example of the number of nodes evaluated by the original algorithm. Figure 8 shows a decrease in the number of evaluated nodes when implementing a branch and bound technique.

Algorithm H2-P is a parallel version based on the scheme of task division. A task is an evaluation of a candidate, i.e. the calculation of the term $f_{1}$ of the objective function given by (2).

H2-X algorithm is a hybrid parallel version scheme based on task division and problem partitioning. This algorithm first divides the problem into $X$ parts. Then, the algorithm is applied in parallel to each part of the problem. In what follows, two values of $X$ are used: $X=2$ and $X=5$.

Following Frutos suggestion [6], objective function is modified to use different weights as follows:

$$
\begin{equation*}
f\left(n_{i, j}\right)=P_{1} * f_{1}\left(n_{i, j}\right)+P_{2} * f_{2}\left(n_{i, j}\right)+P_{3} * f_{3}\left(n_{i, j}\right) \tag{2}
\end{equation*}
$$

where $P_{1}, P_{2}$ and $P_{3}$ are weights satisfying the relation $P_{1}+$ $P_{2}+P_{3}=1$. This paper only considers the special cases presented in Table I.

```
Algorithm 2 H2-P
Require: \(N, K, w\)
    l_order \(\leftarrow\{0,1,2, \ldots, N-1\}\)
    c_order \(\leftarrow\) l_order
    \(i \leftarrow 0\)
    while \(i<K\) do
        if Gates \(_{i}\) is not \(L N N\) then
            \(n \leftarrow\) makeCandidates \(\left(c_{o}\right.\) rder, Gates \(\left._{i}\right)\)
            foreach \(n\) in \(n_{i j}\) do in parallel
                evaluate_objective_function \(\left(n_{i j}\right)\)
            end foreach
            barrier () //awaiting finalization of processes
            \(S \leftarrow \emptyset\)
            \(S \leftarrow \operatorname{getBestCandidates}\left(n_{i}\right) / / \mathrm{S}\) is the set of best
            candidates
            if Gates \({ }_{i}\) is not LNN then
                c_order \(\leftarrow\) random \((S)\)
            else
                    c_order \(\leftarrow S_{0} / / S_{0}\) is the only element of \(S\)
            end if
        else
            \(i \leftarrow i+1\)
        end if
    end while
```

Figure 5. First proposed parallel algorithm H2-P

```
Algorithm 3 H2-X
Require: \(N, K, w, X\)
    \(l\) _order \(\leftarrow\{0,1,2, \ldots, N-1\}\)
    c_order \(\leftarrow\) l_order
    swaps \(\leftarrow 0\)
    for \(i=1\) to \(i=X\) do
        executed in parallel \(H 2 \_P\left(N, \frac{K}{X}, w\right)\) //problem is di-
        vided into \(X\) parts
    end for
    barrier() //awaiting finalization of Initiators processes
    swaps \(=\) swaps \(_{1} / /\) improves performance and allows the
    construction of the solution in a single cycle
    for \(i=2\) to \(i=X\) do
        swaps \(=\) swaps \(+\operatorname{dist}\left(\right.\) swaps \(_{i}\), swaps \(\left._{i-1}\right) / /\) distance
        between the partial solutions
        swaps \(=\) swaps \(_{i}+\) swaps \(^{2} / /\) swaps \(_{i}\) is the number of
        gates needed to resolve the \(i\) section of the problem
    end for
```

Figure 6. Second parallel algorithm proposed H2-X

TABLE I. Combination of $P_{1}, P_{2}$ y $P_{3}$ USED IN THE REPORTED TESTS

| $\boldsymbol{P}_{\mathbf{1}}$ | $\boldsymbol{P}_{\mathbf{2}}$ | $\boldsymbol{P}_{\mathbf{3}}$ | Comments |
| :---: | :---: | :---: | :---: |
| 1 | 0 | 0 | only $f_{1}()$ is use |
| 0 | 1 | 0 | only $f_{2}()$ is use |
| 0 | 0 | 1 | only $f_{3}()$ is use |
| $1 / 3$ | $1 / 3$ | $1 / 3$ | HIRATA II |
| 0.5 | 0.25 | 0.25 | $f_{1}()$ is more important |
| 0.25 | 0.5 | 0.25 | $f_{2}()$ is more important |
| 0.25 | 0.25 | 0.5 | $f_{3}()$ is more important |



Figure 7. Nodes evaluated with the original local_search function


Figure 8. Nodes evaluated with the local_search function and branch and bound technique

Clearly, combination of weights where $P_{1}=P_{2}=P_{3}=\frac{1}{3}$ corresponds to the original optimization function proposed in [11].

The nature of the parallel algorithm conversion requires the development of a communication protocol as OpenMPI [7] used in this work. The communication protocol has an Initiator, a Router and Worker processes:

- Initiator: the Initiator process determines the extent of the problem;
- Router: the Router process manages the pool of worker processes;
- Worker: worker processes run tasks, and even the Initiator process is also a worker process.
This protocol avoids the scheme "master / slave" implementing a scheme of pool of workers.

Table II summarizes the implemented algorithms and techniques used for each algorithm.

TABLE II. COMPARISON ALL IMPLEMENT ALGORITHM

| Algorithm | Branch <br> and <br> Bound | Parallelization <br> of calculation <br> ofobjective <br> function | Circuit <br> partitioning | Comments |
| :---: | :--- | :--- | :--- | :--- |
| Hirata <br> II | No | No | No | Hirata et al. [11] |
| H2-S | Yes | No | No | $[11]$ with branch and bound: Algo- <br> rithm (1) |
| H2-P | Yes | Yes | No | Objective function calculated in <br> parallel |
| H2-X | Yes | Yes | Yes | Algorithm (2) |

TABLE III. Results observed for special weights in the shor 10 CIRCUIT

| Weight | Alg. | $w=10$ |  | $w=12$ |  | $w=14$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | $\begin{array}{l\|} \hline \overline{\text { swaps }} \\ \sigma(\text { swaps }) \end{array}$ | $\begin{aligned} & \overline{t_{\text {seg }}} \\ & \sigma\left(t_{\text {seg }}\right) \end{aligned}$ | $\begin{array}{\|l\|} \hline \overline{\text { swaps }} \\ \sigma(\text { swaps }) \end{array}$ | $\begin{aligned} & \overline{t_{\text {seg }}} \\ & \sigma\left(t_{\text {seg }}\right) \end{aligned}$ | $\begin{aligned} & \overline{\overline{s w a p s}} / \\ & \sigma(\text { swaps }) \end{aligned}$ | $\begin{aligned} & \overline{t_{\text {seg }}} \\ & \sigma\left(t_{\text {seg }}\right) \end{aligned}$ |
| $\begin{aligned} & \Omega \\ & \Omega \\ & \end{aligned}$ | H2-S | $\begin{aligned} & \hline 163615,4 \\ & / 2552,19 \end{aligned}$ | $\begin{aligned} & 136,851 / \\ & 2,80 \end{aligned}$ | $\begin{aligned} & \hline 150355,8 \\ & \text { / 1050,52 } \end{aligned}$ | $\begin{aligned} & 558,765 / \\ & 2,28 \end{aligned}$ | $\begin{aligned} & 148364,1 \\ & \text { / 982,27 } \end{aligned}$ | $\begin{aligned} & 2656,19 \text { / } \\ & 2,32 \end{aligned}$ |
|  | H2-P | $\begin{aligned} & 153674,2 \\ & / 1954,26 \end{aligned}$ | $\begin{aligned} & 43,694 \quad / \\ & 1,93 \end{aligned}$ | $\begin{aligned} & 140800,8 \\ & / 779,10 \end{aligned}$ | $\begin{aligned} & 177,602 / \\ & 3,91 \end{aligned}$ | $\begin{aligned} & 141167,4 \\ & / 761,14 \end{aligned}$ | $\begin{aligned} & 745,632 / \\ & 40,03 \end{aligned}$ |
|  | H2-X2 | $\begin{aligned} & 154718,8 \\ & / 2134,27 \end{aligned}$ | $\begin{aligned} & 22,073 \quad / \\ & 0,87 \end{aligned}$ | $\begin{aligned} & \hline 142723,4 \\ & \text { / 902,84 } \end{aligned}$ | $\begin{array}{ll} 88,617 \quad / \\ 4,25 \end{array}$ | $\begin{aligned} & \hline 141018,2 \\ & \text { / 823,06 } \end{aligned}$ | $\begin{aligned} & 365,461 / \\ & 28,01 \end{aligned}$ |
|  | H2-X5 | $\begin{aligned} & 152410,6 \\ & / 1709,77 \end{aligned}$ | $\begin{aligned} & 10,448 \quad / \\ & 1,21 \end{aligned}$ | $\begin{aligned} & 145624,6 \\ & / 1583,82 \end{aligned}$ | $\begin{aligned} & 41,144 \quad / \\ & 2,35 \end{aligned}$ | $\begin{aligned} & \hline 145109,2 \\ & / 1498,90 \end{aligned}$ | $\begin{aligned} & 147,06 \quad / \\ & 8,44 \end{aligned}$ |
| $\begin{aligned} & \text { Ñ } \\ & \text { ón } \\ & \text { તi } \\ & \text { in } \end{aligned}$ | H2-S | $\begin{aligned} & 145609 \text { / } \\ & 749,12 \end{aligned}$ | $\begin{aligned} & 98,886 \quad / \\ & 1,21 \end{aligned}$ | $\begin{aligned} & 139809,2 \\ & / 633,56 \end{aligned}$ | $\begin{aligned} & 388,584 / \\ & 1,63 \end{aligned}$ | $\begin{aligned} & \hline \text { 140433,6 } \\ & \text { / 513,01 } \end{aligned}$ | $\begin{aligned} & \hline 3186,251 \\ & / 4,08 \end{aligned}$ |
|  | H2-P | $\begin{aligned} & 154321,8 \\ & / 1612,67 \end{aligned}$ | $\begin{aligned} & 44,781 \quad / \\ & 1,28 \end{aligned}$ | $\begin{aligned} & 140918,8 \\ & / 799,92 \end{aligned}$ | $\begin{aligned} & 175,399 / \\ & 5,54 \end{aligned}$ | $\begin{aligned} & 140989,6 \\ & \text { / 580,96 } \end{aligned}$ | $\begin{aligned} & 744,693 / \\ & 56,84 \end{aligned}$ |
|  | H2-X2 | $\begin{aligned} & 154944,6 \\ & / 1650,27 \end{aligned}$ | $\begin{aligned} & 22,191 \quad / \\ & 0,65 \end{aligned}$ | $\begin{aligned} & \hline 142394,6 \\ & / 1284,04 \end{aligned}$ | $\begin{aligned} & 88,942 \quad / \\ & 3,99 \end{aligned}$ | $\begin{aligned} & 141539,6 \\ & / 466,87 \end{aligned}$ | $\begin{aligned} & \hline 359,981 / \\ & 21,28 \end{aligned}$ |
|  | H2-X5 | $\begin{aligned} & 152727,8 \\ & / 937,09 \end{aligned}$ | $\begin{array}{ll} \hline 9,453 & 1 \\ 0,43 & \end{array}$ | $\begin{aligned} & \hline 144842,4 \\ & / 1704,23 \end{aligned}$ | $\begin{array}{ll} \hline 38,127 \quad / \\ 1,46 \end{array}$ | $\begin{aligned} & 144829 \text { / } \\ & 1072,02 \end{aligned}$ | $\begin{aligned} & 140,265 ~ / ~ \\ & 14,25 \end{aligned}$ |
| $\begin{aligned} & \text { ñ } \\ & \text { ô } \\ & \text { n} \\ & \text { ñ } \\ & 0 \end{aligned}$ | H2-S | $\begin{aligned} & \text { 171704,6 } \\ & / 625,71 \end{aligned}$ | $\begin{aligned} & 146,504 \text { / } \\ & 2,25 \end{aligned}$ | $\begin{aligned} & 171464,4 \\ & / 617,81 \end{aligned}$ | $\begin{aligned} & \hline 570,564 / \\ & 1,96 \end{aligned}$ | $\begin{aligned} & \hline 165006,2 \\ & / 1344,39 \end{aligned}$ | $\begin{aligned} & 2039,95 \text { / } \\ & 3,02 \end{aligned}$ |
|  | H2-P | $\begin{aligned} & \hline 154272,6 \\ & / 2316,71 \end{aligned}$ | $\begin{aligned} & \hline 43,648 \quad / \\ & 2,07 \end{aligned}$ | $\begin{aligned} & 140634,4 \\ & \text { / 458,33 } \end{aligned}$ | $\begin{aligned} & 178,132 / \\ & 4,24 \end{aligned}$ | $\begin{aligned} & \hline 141376,8 \\ & / 416,88 \end{aligned}$ | $\begin{aligned} & 768,926 / \\ & 78,55 \end{aligned}$ |
|  | H2-X2 | $\begin{aligned} & \hline 154401,6 \\ & / 1717,95 \end{aligned}$ | $\begin{array}{ll} 22,29 \\ 0,95 \end{array}$ | $\begin{aligned} & 142341,4 \\ & / 639,11 \end{aligned}$ | $\begin{aligned} & 92,126 \quad / \\ & 3,39 \end{aligned}$ | $\begin{aligned} & 141263,6 \\ & \text { / 389,22 } \end{aligned}$ | $\begin{aligned} & 366,553 / \\ & 19,26 \end{aligned}$ |
|  | H2-X5 | $\begin{aligned} & 153910,7 \\ & / 1978,02 \end{aligned}$ | $\begin{array}{ll} \hline 9,881 & 1 \\ 0,74 & \end{array}$ | $\begin{aligned} & 143864,7 \\ & / 931,65 \end{aligned}$ | $\begin{aligned} & 39,732 \quad / \\ & 2,36 \end{aligned}$ | $\begin{aligned} & 145080,2 \\ & / 1535,01 \end{aligned}$ | $\begin{aligned} & 137,357 / \\ & 15,53 \end{aligned}$ |
| $\begin{aligned} & n \\ & \text { n} \\ & \text { ñ } \\ & \text { in } \\ & 0 . \end{aligned}$ | H2-S | $\begin{aligned} & \hline 162204,9 \\ & / 1729,59 \end{aligned}$ | $\begin{array}{ll} \hline 118,83 \quad / \\ 1,36 \end{array}$ | $\begin{aligned} & 153733,5 \\ & / 1042,29 \end{aligned}$ | $\begin{aligned} & \hline 685,323 / \\ & 1,79 \end{aligned}$ | $\begin{aligned} & 157097,5 \\ & / 464,64 \end{aligned}$ | $\begin{aligned} & \hline 3097,569 \\ & / 2,31 \end{aligned}$ |
|  | H2-P | $\begin{aligned} & \hline 153339,6 \\ & / 1755,63 \end{aligned}$ | $\begin{aligned} & 43,842 \quad / \\ & 2,36 \end{aligned}$ | $\begin{aligned} & 140970 / \\ & 810,46 \end{aligned}$ | $\begin{aligned} & 178,819 / \\ & 3,85 \end{aligned}$ | $\begin{aligned} & \hline 141207,2 \\ & \text { / 757,31 } \end{aligned}$ | $\begin{aligned} & 718,053 / \\ & 56,23 \end{aligned}$ |
|  | H2-X2 | $\begin{aligned} & 155090,2 \\ & / 1216,85 \end{aligned}$ | $\begin{aligned} & 21,899 \quad / \\ & 0,83 \end{aligned}$ | $\begin{aligned} & 142839,2 \\ & / 652,68 \end{aligned}$ | $\begin{aligned} & 90,129 \quad 1 \\ & 3,60 \end{aligned}$ | $\begin{aligned} & 141261 / \\ & 715,41 \end{aligned}$ | $\begin{aligned} & 357,025 \text { I } \\ & 29,05 \end{aligned}$ |
|  | H2-X5 | $\begin{aligned} & \hline 153845,9 \\ & / 1507,76 \end{aligned}$ | $\begin{array}{ll} \hline 9,774 & 1 \\ 0,58 & \end{array}$ | $\begin{aligned} & 145869,5 \\ & / 1366,39 \end{aligned}$ | $\begin{aligned} & 45,245 \quad / \\ & 1,98 \end{aligned}$ | $\begin{aligned} & 144738,2 \\ & / 1066,47 \end{aligned}$ | $\begin{aligned} & 148,415 \text { / } \\ & 15,39 \end{aligned}$ |
| $\begin{aligned} & 0 \\ & 0 \\ & -1 \end{aligned}$ | H2-S | $\begin{aligned} & \hline 141604,1 \\ & \text { / 327,71 } \end{aligned}$ | $\begin{aligned} & 101,027 \text { / } \\ & 0,98 \end{aligned}$ | $\begin{aligned} & 136209,1 \\ & / 699,13 \end{aligned}$ | $\begin{aligned} & 379,494 \text { / } \\ & 2,56 \end{aligned}$ | $\begin{aligned} & 136456,7 \\ & / 396,55 \end{aligned}$ | $\begin{aligned} & \hline 3515,705 \\ & / 3,51 \end{aligned}$ |
|  | H2-P | $\begin{aligned} & 153671,4 \\ & / 1582,54 \end{aligned}$ | $\begin{aligned} & 44,062 \quad 1 \\ & 2,50 \end{aligned}$ | $\begin{aligned} & \hline 140613,4 \\ & \text { / 567,89 } \end{aligned}$ | $\begin{aligned} & 176,709 \text { / } \\ & 4,68 \end{aligned}$ | $\begin{aligned} & 141174 \text { / } \\ & 688,45 \end{aligned}$ | $\begin{aligned} & 730,881 / \\ & 30,94 \end{aligned}$ |
|  | H2-X2 | $\begin{aligned} & 154514,4 \\ & / 1738,62 \end{aligned}$ | $\begin{aligned} & 21,916 ~ / ~ \\ & 0,94 \end{aligned}$ | $\begin{aligned} & 142319,8 \\ & / 706,41 \end{aligned}$ | $\begin{aligned} & 91,789 \quad / \\ & 3,41 \end{aligned}$ | $\begin{aligned} & 140975,6 \\ & \text { / 548,79 } \end{aligned}$ | $\begin{aligned} & 361,095 / \\ & 29,26 \end{aligned}$ |
|  | H2-X5 | $\begin{aligned} & \hline 153853,9 \\ & / 1720,86 \end{aligned}$ | $\begin{array}{ll} 9,758 & 1 \\ 0,59 & \end{array}$ | $\begin{aligned} & \hline 144962,9 \\ & / 1528,26 \end{aligned}$ | $\begin{aligned} & 42,392 \quad / \\ & 2,88 \end{aligned}$ | $\begin{aligned} & \hline 144832,2 \\ & / 1110,51 \end{aligned}$ | $\begin{aligned} & 146,448 \text { / } \\ & 15,09 \end{aligned}$ |
| $\begin{aligned} & 0 \\ & \hdashline- \\ & 0 \end{aligned}$ | H2-S | $\begin{aligned} & \hline 256266,7 \\ & / 1113,46 \end{aligned}$ | $\begin{aligned} & 454,973 / \\ & 1,94 \end{aligned}$ | $\begin{aligned} & \hline 258657,4 \\ & \text { / 661,86 } \end{aligned}$ | $\begin{aligned} & 1851,703 \\ & / 2,12 \end{aligned}$ | $\begin{aligned} & \hline 259102,6 \\ & \text { / 539,50 } \end{aligned}$ | $\begin{aligned} & 5851,167 \\ & / 5,14 \end{aligned}$ |
|  | H2-P | $\begin{aligned} & \hline 272585,9 \\ & / 2034,55 \end{aligned}$ | $\begin{aligned} & 189,944 \text { / } \\ & 13,12 \end{aligned}$ | $\begin{aligned} & \hline 274059,9 \\ & \text { / 1370,88 } \end{aligned}$ | $\begin{aligned} & 700,717 / \\ & 19,88 \end{aligned}$ | $\begin{aligned} & \hline 282117,3 \\ & / 918,42 \end{aligned}$ | $\begin{aligned} & 2442,572 \\ & / 72,16 \end{aligned}$ |
|  | H2-X2 | $\begin{aligned} & \hline 270386,3 \\ & / 3346,48 \end{aligned}$ | $\begin{aligned} & 93,088 \quad / \\ & 5,22 \end{aligned}$ | $\begin{aligned} & 278743,7 \\ & / 1706,26 \end{aligned}$ | $\begin{aligned} & 351,268 / \\ & 18,94 \end{aligned}$ | $\begin{aligned} & \hline 281370,6 \\ & / 2738,40 \end{aligned}$ | $\begin{aligned} & 1454,563 \\ & / 132,50 \end{aligned}$ |
|  | H2-X5 | $\begin{aligned} & 270821,2 \\ & / 1947,30 \end{aligned}$ | $\begin{aligned} & 43,842 \quad / \\ & 3,70 \end{aligned}$ | $\begin{aligned} & 276104,8 \\ & \text { / 1870,61 } \end{aligned}$ | $\begin{aligned} & 183,48 \quad / \\ & 8,10 \end{aligned}$ | $\begin{aligned} & 282341,2 \\ & / 3062,77 \end{aligned}$ | $\begin{aligned} & 632,463 / \\ & 10,58 \end{aligned}$ |
| $\begin{aligned} & \overline{\ddot{O}} \\ & \ddot{0} \end{aligned}$ | H2-S | $\begin{aligned} & \hline 252368,7 \\ & / 930,42 \end{aligned}$ | $\begin{aligned} & 408,199 / \\ & 1,38 \end{aligned}$ | $\begin{aligned} & 257750 \text { / } \\ & 625,07 \end{aligned}$ | $\begin{aligned} & \hline 2216,577 \\ & 13,39 \end{aligned}$ | $\begin{aligned} & \hline 257017,4 \\ & / 289,33 \end{aligned}$ | $\begin{aligned} & 5996,26 / \\ & 2,80 \end{aligned}$ |
|  | H2-P | $\begin{aligned} & \hline 274425 \text { / } \\ & 1725,57 \end{aligned}$ | $\begin{aligned} & 195,747 / 1 \\ & 7,80 \end{aligned}$ | $\begin{aligned} & 277003,2 \\ & \text { / 3693,99 } \end{aligned}$ | $\begin{aligned} & 721,374 / 1 \\ & 9,74 \end{aligned}$ | $\begin{aligned} & 281502,6 \\ & / 2514,29 \end{aligned}$ | $\begin{aligned} & 2518,742 \\ & / 38,91 \end{aligned}$ |
|  | H2-X2 | $\begin{aligned} & \hline \text { 271276,2 } \\ & / 1927,95 \end{aligned}$ | $\begin{array}{ll} \hline 91,79 & 1 \\ 2,09 & \end{array}$ | $\begin{aligned} & 277446,3 \\ & / 1016,30 \end{aligned}$ | $\begin{array}{ll} \hline 355 & / \\ 15,92 \end{array}$ | $\begin{aligned} & \hline 283420,9 \\ & / 2629,49 \end{aligned}$ | $\begin{array}{ll} \hline 1.457 \\ 120,07 \end{array}$ |
|  | H2-X5 | $\begin{aligned} & \hline 271754,1 \\ & / 3659,20 \end{aligned}$ | $\begin{array}{ll} 41,78 & 1 \\ 3,27 & \end{array}$ | $\begin{aligned} & 276948,9 \\ & / 1597,44 \end{aligned}$ | $\begin{aligned} & 186,845 / \\ & 1,44 \end{aligned}$ | $\begin{aligned} & \hline 283434,3 \\ & / 1688,50 \end{aligned}$ | $\begin{array}{ll} \hline 625 \\ 12,03 \end{array}$ |

## V. Experimental Results

The largest circuit presented in [11] is used in this work, this circuit correspond to Shor's factorization algorithm [14]. It is composed of 24 qubits and 132,204 quantum gates (named as Shor 10 circuit). Given that the algorithms are probabilistic when there is a tie, experiments are run 10 times for each algorithm implemented considering three values of $w$, giving a total of $10 \times 7 \times 4 \times 3=840$ experimental runs.

Algorithm H2-S was run in a computer with Intel processor I7 Quadcore 2.3 GHz and 16 GB of Random Access Memory (RAM). On the other hand, parallel algorithms were executed on a cluster of computers with Intel processor I5 Quadcore 2.3 GHz and 4 GB of RAM. It is important to note that the equipment used for the execution of $\mathrm{H} 2-\mathrm{S}$ is clearly better than the one used for the parallel implementations.

TABLE IV. SPEEDUP AND QUALITY MEASURE COMPARISON

| Weight | Algorithm | $w=10$ |  | $w=12$ |  | $w=14$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | $Q$ | $S_{p}$ | $Q$ | $S_{p}$ | $Q$ | $S_{p}$ |
| $\begin{aligned} & \stackrel{m}{\underset{\sim}{n}} \\ & \stackrel{n}{\sim} \end{aligned}$ | H2-S | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 |
|  | H2-P | 0,94 | 3,13 | 0,94 | 3,15 | 0,95 | 3,56 |
|  | H2-X2 | 0,95 | 6,20 | 0,95 | 6,31 | 0,95 | 7,27 |
|  | H2-X5 | 0,93 | 13,10 | 0,97 | 13,58 | 0,98 | 18,06 |
| $\begin{aligned} & \text { ñ } \\ & \text { èn } \\ & \text { ñ } \\ & \text { in } \\ & 0 \end{aligned}$ | H2-S | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 |
|  | H2-P | 1,06 | 2,21 | 1,01 | 2,22 | 1,00 | 4,28 |
|  | H2-X2 | 1,06 | 4,46 | 1,02 | 4,37 | 1,01 | 8,85 |
|  | H2-X5 | 1,05 | 10,46 | 1,04 | 10,19 | 1,03 | 22,72 |
|  | H2-S | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 |
|  | H2-P | 0,90 | 3,36 | 0,82 | 3,20 | 0,86 | 2,65 |
|  | H2-X2 | 0,90 | 6,57 | 0,83 | 6,19 | 0,86 | 5,57 |
|  | H2-X5 | 0,90 | 14,83 | 0,84 | 14,36 | 0,88 | 14,85 |
| $\begin{aligned} & \text { in } \\ & \stackrel{n}{n} \\ & \underset{i}{n} \\ & \underset{i}{0} \end{aligned}$ | H2-S | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 |
|  | H2-P | 0,95 | 2,71 | 0,92 | 3,83 | 0,90 | 4,31 |
|  | H2-X2 | 0,96 | 5,43 | 0,93 | 7,60 | 0,90 | 8,68 |
|  | H2-X5 | 0,95 | 6,60 | 0,95 | 15,15 | 0,92 | 20,87 |
| $\stackrel{\ddot{-}}{\underset{-}{2}}$ | H2-S | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 |
|  | H2-P | 1,09 | 2,29 | 1,03 | 2,15 | 1,03 | 4,81 |
|  | H2-X2 | 1,09 | 4,61 | 1,04 | 4,13 | 1,03 | 9,74 |
|  | H2-X5 | 1,09 | 10,35 | 1,06 | 8,95 | 1,06 | 24,01 |
| $\frac{9}{\ddot{O}}$ | H2-S | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 |
|  | H2-P | 1,06 | 2,40 | 1,06 | 2,64 | 1,09 | 2,40 |
|  | H2-X2 | 1,06 | 4,89 | 1,08 | 5,27 | 1,09 | 4,02 |
|  | H2-X5 | 1,06 | 10,38 | 1,07 | 10,09 | 1,09 | 9,25 |
| -ion | H2-S | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 | 1,00 |
|  | H2-P | 1,09 | 2,09 | 1,07 | 3,07 | 1,10 | 2,38 |
|  | H2-X2 | 1,07 | 4,45 | 1,08 | 6,24 | 1,10 | 4,12 |
|  | H2-X5 | 1,08 | 9,77 | 1,07 | 11,86 | 1,10 | 9,59 |

Table III describes the mean values and standard deviations observed for different weight combinations. In particular, Table III shows that H2-X5 is strictly better in running time and number of SWAP gates than the sequential version of HIRATA II algorithm (found when all weights are equal $\frac{1}{3}$ ). Even more, H2-X5 has a shorter running time than any other implemented algorithm, proving its effectiveness. At the same time, all implemented parallel algorithms proved to be quite competitive with respect to the sequential algorithm $\mathrm{H} 2-\mathrm{S}$.

The standard deviation observed in Table III is small in general, showing that no peaks are seen neither in the running time nor in the necessary amount of quantum gates.

Table IV shows the SpeedUp $\left(S_{p}\right)$ [12] and quality $(Q)$ calculated for each parallel algorithm with respect to algorithm H2-S. Clearly, parallel algorithms have the highest acceleration and $\mathrm{H} 2-\mathrm{X} 5$ is the best parallel alternative.
Finally, it can be noticed in Table III that the worst results were obtained when $P_{1}=0$, confirming same conclusion reported in [6].

## VI. Conclusion and Future Works

Experimental results show a speedup of an order of magnitude with respect to the resolution times (from hours to seconds), even improving slightly the quality of the converted circuit, measured by the number of inserted swap gates.

Experiments corroborate the importance of the term $f_{1}$ in (1) and (2) for the quality of results. Combinations where $P_{1}=$ 0 obtained the worst experimental results, confirming Frutos conclusion [6].

The communication protocol designed and implemented in this work using Open MPI seems very efficient and it can be used in building other non-trivial parallel algorithms.

For future work, the authors are working on the following improvements: (i) apply meta-heuristic techniques, possibly based on a strategy of task division, using the communication protocol designed and implemented in this work; (ii) modify HIRATA II algorithm to avoid the randomness in the selection of candidates in tie situations and (iii) apply further partitioning to solve a give partition to increase the potential of using parallelism in new multi-core cluster of cumputers.

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