

GRAPH PROCESSING HARDWARE ACCELERATOR FOR SHORTEST PATH
ALGORITHMS IN NANOMETER VERY LARGE-SCALE INTEGRATION
INTERCONNECT ROUTING

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*Specially dedicated to
my beloved family*

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ABSTRACT

Graphs are pervasive data structures in computer science, and algorithms working with them are fundamental to the field. Many challenging problems in Very Large-Scale Integration (VLSI) physical design automation are modeled using graphs. The routing problems in VLSI physical design are, in essence, shortest path problems in special graphs. It has been shown that the performance of a graph-based shortest path algorithm can severely be affected by the performance of its priority queue. This thesis proposes a graph processing hardware accelerator for shortest path algorithms applied in nanometer VLSI interconnect routing problems. A custom Graph Processing Unit (GPU), in which a hardware priority queue accelerator is embedded, designed and prototyped in a Field Programmable Gate Array (FPGA) based hardware platform. The proposed hardware priority queue accelerator is designed to be parameterizable and theoretically cascadable. It is also designed for high performance and it exhibits a run-time complexity for an INSERT (or EXTRACT) queue operation that is constant. In order to utilize the high performance hardware priority queue module, modifications have to be made on the graph-based shortest path algorithm. In hardware, the priority queue size is constrained by the available logic resources. Consequently, this thesis also proposes a hybrid software-hardware priority queue which redirects priority queue entries to software priority queue when the hardware priority queue module exceeds its queue size limit. For design validation and performance test purposes, a computationally expensive VLSI interconnect routing Computer Aided Design (CAD) module is developed. Results of the performance tests on the proposed hardware graph accelerator, graph computations are significantly improved in terms of algorithm complexity and execution speed.

ABSTRAK

Graf adalah struktur data yang meluas dalam sains komputer, dan algoritma yang bekerja dengan mereka adalah teras kepada bidang ini. Kebanyakan masalah yang mencabar dalam bidang automasi rekabentuk fizikal ‘*Very Large-Scale Integration*’ (VLSI) dimodelkan sebagai graf. Banyak masalah penyambungan wayar dalam rekabentuk fizikal VLSI melibatkan masalah mencari-jalan paling pendek dalam graf yang istimewa. Ianya juga telah di tunjukkan bahawa prestasi algoritma mencari-jalan paling pendek berdasarkan graf dipengaruhi oleh prestasi baris gilir keutamaan. Tesis ini mengusulkan perkakasan pemproses graf untuk mempercepatkan perhitungan graf dalam masalah mencari-jalan paling pendek. Unit Pemrosesan Graf (GPU), di mana modul perkakasan pemecut keutamaan giliran dibenamkan dan prototaip dalam perkakasan ‘*Field Programmable Gate Array*’ (FPGA) dapat dibentuk semula. Modul perkakasan pemecut keutamaan giliran tersebut direka supaya mudah diubahsuai, ia berprestasi tinggi dan mampu memberikan kompleksiti masa-lari yang malar bagi setiap tugas SISIPAN atau SARI. Untuk menggunakan perkakasan pemecut keutamaan giliran yang berprestasi tinggi tersebut, pengubahsuaian ke atas algoritma graf juga dilakukan. Dalam perkakasan, saiz baris gilir ketamaan dikekang oleh sumber-sumber logik yang ada. Tesis ini juga mengusulkan pemecut keutamaan giliran hibrid berasaskan perkakasan dan perisian, di mana sisipan ke perkakasan pemecut keutamaan giliran akan ditujukan ke perisian apabila perkakasan pemecut keutamaan giliran tidak mampu untuk menampungnya. Untuk pengesahan rekacipta dan pengujian prestasi, satu modul pengkomputeran VLSI penyambungan wayar ‘*Computer Aided Design*’ (CAD) dibangunkan. Hasil kerja tesis ini menunjukkan bahawa perkakasan pemecut yang diusulkan dapat mempercepatkan penghitungan graf, baik dari segi kerumitan algoritma dan masa perlakuan.

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LIST OF SYMBOLS

API	-	Application Programming Interface
ASIC	-	Application Specific Integrated Circuit
CAD	-	Computer Aided Design
EDA	-	Electronic Design Automation
FPGA	-	Field Programmable Gate Array
GUI	-	Graphical User Interface
HDL	-	Hardware Development Language
IDE	-	Integrated Development Environment
I/O	-	Input/Output
LE	-	Logic Element
MHz	-	Megahertz
PC	-	Personal Computer
PE	-	Processing Element
RAM	-	Random Access Memory
RTL	-	Register Transfer Logic
SoC	-	System-on-Chip
SOPC	-	System-on-Programmable-Chip
UART	-	Universal Asynchronous Receiver Transmitter
UTM	-	Universiti Teknologi Malaysia
VHDL	-	Very High Speed Integrated Circuit Hardware Description Language
VLSI	-	Very Large Scale Integration

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CHAPTER 1

INTRODUCTION

This thesis proposes a graph processing hardware accelerator for shortest path algorithms applied in nanometer VLSI interconnect routing problems. A custom Graph Processing Unit (GPU), in which a hardware priority queue accelerator module is embedded, designed and prototyped on a reconfigurable FPGA-based hardware platform. The hardware priority queue accelerator off-loads and speed up graph-based shortest path computations. For design validation and performance test purposes, a computationally extensive VLSI interconnect routing CAD module (or EDA sub-system) is developed to execute on the proposed GPU. This chapter introduces the background of research, objectives, problem statement, scope of work, previous related works and the significance of this research. The organization of thesis is summarized at the end of the chapter.

1.1 Background

Graphs are pervasive data structures in computer science, and algorithms working with them are fundamental to the field. There are many graph algorithms, and the well-established ones include Depth-First Search, Breadth-First Search, Topological Search, Spanning Tree algorithm, Dijkstra's algorithm, Bellman-Ford algorithm and Floyd-Warshall algorithm. These graph algorithms are basically shortest path algorithms. For instance, Dijkstra's algorithm is an extension of the Depth-First Search algorithm except the former solves the shortest path problem on weighted graph, while the latter solve the shortest unit path problem on unweighted

graph. Bellman-Ford algorithm and Dijkstra's algorithm solve single-source shortest path problem, except the former targets graph with negative edges, while the latter is restricted to graph with non-negative edges.

Many interesting problems in VLSI physical design automation are modeled using graphs. Hence, VLSI electronic design automation (EDA) systems are based on the graph algorithms. These algorithms include, among others, Min-Cut and Max-Cut algorithms for logic partitioning and placement, Clock Skew Scheduling algorithm for useful skew clock tree synthesis, Minimum Steiner Tree algorithm and Span Minimum Tree algorithm for critical/global interconnect network synthesis, Maze Routing algorithm for point-to-point interconnect routing, etc. Many routing problems in VLSI physical design are, in essence, shortest path problems in special graphs. Shortest path problems, therefore, play a significant role in global and detailed routing algorithms (Sherwani, 1995).

Real world problems modeled in mathematical set can be mapped into graphs, where elements in the set are represented by vertices, and the relation between any two elements are represented by edges. The run-time complexity and memory-consumption of graph algorithms are expressed in terms of the vertices and edges. A graph searching algorithm can discover much about the graph structure. Searching a graph means systematically following the edges of the graph so as to visit the vertices of graph. Many graph algorithms are organized as simple elaborations of basic graph searching algorithms (Cormen *et al.*, 2001). Hence, the technique of searching in a graph is the heart of these algorithms. In the graph searching process, Priority Queues are used to maintain the tentative search results, which can grow very large as the graph size increases. Consequently, the implementation of these priority queues can significantly affect the run-time and memory consumption of a graph algorithm (Skiena, 1997).

1.2 Problem Statement

According to Moore's Law, to achieve minimum cost, the number of transistors in an Integrated Circuit (IC) needs to double every 18 months. Achieving minimum cost per transistor entails enormous design effort and high non-recurrent-engineering (NRE) cost. The design complexity grows proportionally to the increase of transistor density, and subsequently, circuit engineers face tremendous design challenges. When physical design moves into nanometer circuit integration range, we would encounter a combinatorial explosion of design issues, involving signal integrity, interconnect delay and lithography, which not only challenge the attempt for effective design automation, but further the need to suppress NRE cost, which in turn increases the demand of EDA (Electronic Design Automation) tools.

Conventional interconnect routing is rather straight-forward, and hence does not pose too great a challenge to the development of algorithms. However, the continual miniaturization of technology has seen the increasing influence of the interconnect delay. According to the simple scaling rule (Bakoglu, 1990), when devices and interconnects are scaled down in all three dimensions by a factor of S , the intrinsic gate delay is reduced by a factor of S but the delay caused by interconnect increases by a factor of S^2 . As the device operates at higher speed, the interconnect delay becomes even more significant. As a result, interconnect delay has become the dominating factor affecting system performance. In many system designs targeting 0.35 μm – 0.5 μm , as much as 50% to 70% of clock cycles are consumed by interconnect delay. This figure will continue to rise as the feature technology size decreases further (Cong *et al.*, 1996). Consequently, the effect of interconnect delay can no longer be ignored in nanometer VLSI physical design.

Many techniques are employed to reduce interconnect delay; among them, buffer insertion has been shown to be an effective approach (Ginneken, 1990). Hence, in contrast to conventional routing which considers only wires, nanometer VLSI interconnect routing considers both buffer insertion and wire-sizing along the interconnect path, in order to achieve minimum interconnect delay. It is obvious that the complexity of nanometer interconnect routing is greater, and in fact, grows

exponentially when multiple buffer choices and wire-sizes (at different metal layers, with different width and depth) are considered as potential interconnect candidates at each point along the interconnect path.

In general, given a post-placement VLSI layout, there are restrictions on where buffers may be inserted. For instance, it may be possible to route wires over a pre-placed macro-cell, but it may not be possible to insert buffers in that region. In this case, the routing has to, not only minimize the interconnect delay, but simultaneously strive for good buffer location, manage buffer density and congestion, and wire sizing. Consequently, many researches have proposed techniques in simultaneous maze routing with buffer insertion and wire sizing to solve the above interconnect routing problem.

A number of interconnect routing algorithms have been proposed, with different strategies for buffer insertion (Chu and Wong, 1997; Chu and Wong, 1998; Chu and Wong, 1999; Dechu *et al.*, 2004; Ginneken, 1990; Lai and Wong, 2002; Jagannathan *et al.*, 2002; Nasir, 2005; Zhou *et al.*, 2000). Most of these algorithms are formulated as graph theoretic shortest path algorithms. Clearly, as many parameters and constraints are involved in VLSI interconnect routing, these algorithms are, essentially, multi-weighted multi-constrained graph search algorithms. In graph search, the solution space and search results are effectively maintained using priority queues. The choice of priority queue implementation, hardware or software, differ significantly on how they affect the run-time and memory consumption of the graph algorithms (Skienna, 1997).

1.3 Objectives

The overall objective of this thesis is to propose the design of a graph processing hardware accelerator for high-speed computation of graph based algorithm. This objective is modularized into the following sub-objectives:

- 1) To design a Graph Processing Unit (GPU) customized for high-speed computation of graph based shortest path algorithm.
- 2) To design a priority queue accelerator module to speed up priority queue operations on the above custom GPU.
- 3) To verify the design and validate the effectiveness of accelerating, via hardware, priority queue operations in a graph algorithm. This is derived from performance validation studies on the application of the proposed GPU executing a compute-intensive VLSI interconnect routing algorithm.

1.4 Scope of Work

- 1) The Graph Processing Unit (GPU) is implemented on FPGA-based embedded system hardware platform on Altera Stratix II development board.
- 2) The priority queue accelerator module will have the following features:
 - a. It supports the two basic priority queue function: (i) INSERT and (ii) EXTRACT.
 - b. It is parameterizable so that the implemented length of priority queue can be adjusted based on available logic resources.
 - c. It is cascade-able such that further queue length extension is possible.
 - d. It is able to store each queue-entry in 64-bit: 32-bit for priority-value and 32-bit for the associate-identifier.
- 3) A hybrid hardware-software priority queue is developed. It avoids overflow at hardware priority queue module.
- 4) A demonstration application prototype is developed to evaluate the design. System validation and performance evaluation are derived by examining the graph based shortest path algorithms on this application prototype. Note that:

- a. The test algorithm is called S-RABI for Simultaneous Maze Routing and Buffer Insertion algorithm, proposed by Nasir *et al.* (2006).
- b. In order to utilize the hardware priority queue accelerator module effectively, the algorithms have to be modified.

1.5 Previous Related Work

The area of hardware maze router design, generic graph accelerator design, and priority queue has received significant attention over the years. In this section these previous related work are reviewed and summarized.

1.5.1 Hardware Maze Router and Graph Accelerator

Maze routing is the most fundamental algorithm among many other VLSI routing algorithms. Technically speaking, other routing problems can be decomposed into multiple sub-problems and solved with the maze routing algorithm. Many hardware maze routers had been proposed and most the work exploit the inherent parallelism of Lee's algorithm (Lee, 1961). This includes the Full-Grid Maze Router, independently proposed by (Nestor, 2000; Keshk, 1997; Breuer and Shamsa, 1981). The architecture accelerates Lee's algorithm using $N*N$ identical processor-elements for worst-case $N*N$ grid-graph, thus huge hardware resources are consumed. Another hardware maze router is the Wave-Front Machine, proposed by Sahni and Won (1987), and Suzuki et al. (1986). The Wave-Front-Machine uses N number of processing-elements and a status map for $N*N$ grid graph.

A more flexible and practical design, the cellular architecture with Raster Pipeline Subarray (RPS) is proposed (Rutenbar, 1984a, 1984b). Applying raster scanning concept, the grid-graph is divided into smaller square regions and floated into RPS. For each square region, RPS updates the status-map. The architecture of RPS is complex but constant for any input size. Systolic Array implementation of

RPS is then proposed (Rutenbar and Atkins, 1988) for better handling of the pipelined data.

The above full-custom maze routers are specifically for maze routing, another approach to accelerate the graph-based shortest path algorithms is via generic graph accelerator. Unweighted graph represented in adjacency-matrix can be mapped into massive parallel hardware architecture where each of the processing units is a simple bit-machine. The computation of bit-wise graph characteristics: reachability, transitive closure, and connected-components can be accelerated. Huelsbergen (2000) had proposed such implementation in FPGA. Besides reachability, transitive closure and connected components, the computation of shortest *unit* path can be accelerated as well. An improved version, Hardware Graph Array (HAGAR) is proposed by Mencer et al. (2002) which uses RAM blocks than mere logic elements in FPGA. The proposed architecture of Huelsbergen (2000) and Mencer (2002) are actually quite similar to Full-Grid Maze Router except the former targets more generic application rather than the specific VLSI maze routing.

In general, most graph problems, however, are weighted. Shortest Path Processor proposed by Nasir and Meador (1995, 1996) can be used to solve weighted-graph problems. It uses square-array analog hardware architecture to directly benefit from the adjacency-matrix representation of graph. The critical challenge of such implementation lies on the accuracy of D/A converter and voltage comparator (both analog) to provide accurate result. An improved version called Loser-Take-All is then proposed, it uses current-comparator instead of voltage-comparator (Nasir and Meador, 1999). Besides that, a digital version is proposed to resolve inaccuracy issues resulted in analog design (Rizal, 1999). Specifically for undirected weighted graph problems, triangle-array is proposed by Nasir *et al.* (2002a, 2002b). The triangle-array saves about half of the logic resources consumed by square-array implementation.

All proposed previous work on hardware maze router and generic graph accelerator primarily explore the inherent parallelism of adjacency-matrix representation in graph. The major problem in such design required huge logic

resources, e.g. generic graph accelerator uses $\Theta(V^2)$ logic resources for a graph of $|V|$ vertices while maze router uses $\Theta(V^2)$ logic resources for a grid-graph of $|V * V|$ vertices (see section 2.1 for definition of ‘ Θ ’). In contrast, grid-graph for VLSI physical design is actually sparse; adjacency-matrix representation is simply a waste besides its inflexibility to support other graph variants.

The hardware maze routers and generic graph accelerators eventually required entire graph input at initial stage, before proceed for shortest unit path computation. On the other hand, nanometer VLSI routing adopts hop-by-hop approach during graph-searching; information of graph vertices is unknown prior to execution. This completely different scenario reflects that the conventional maze routers and generic graph accelerators are not an option.

In addition to that, the hardware maze routers and generic graph accelerators are designed to accelerate elementary graph algorithms, e.g. shortest unit path, transitive closure, connected-components, etc, not only nanometer VLSI routing has evolved into shortest path problem, it has evolved into multi-weight multi-constraint shortest path problem. Certain arithmetic power is needed besides complex data manipulation. This phenomenon leaves no room for the application of the primitive parallel hardware discussed above. New designs of hardware graph accelerators are needed.

1.5.2 Priority Queue Implementation

Due to the wide application of priority queue, much research effort had been made to achieve better priority queue implementations. In general, the research on priority queue can be categorized into: (i) various advanced data structure for priority queue, (ii) specific priority queue data structure with inherent parallelism, targeted Parallel Random Access Machine (PRAM) model, and (iii) full-custom hardware design to accelerate array-based priority queue.

Research in category (i) basically explore the various ‘heap’ structure (a variant of ‘tree’ data structure) to obtain theoretically better run-time complexity of priority queue operations. Binary-Heap, Binomial-Heap and Fibonacci-Heap are some instances of priority queue implementation under this category. Whereas research classified in category (ii) includes, among others, Parallel-Heap, Relaxed-Heap, Sloped-Heap, etc. Basically, priority queue implementation under these two categories is interesting from software/parallel-software point of view; these implementations are capable to provide improvement in term of run-time complexity at the expenses of more memory consumption, but fail to address the severe constant overhead on memory data communication. In short, those heap-like structures are interesting in software but are not adaptable for high speed hardware implementation (Jones, 1986).

Research work in category (iii), full-custom hardware priority queue design is driven by the demand of high-speed applications such as internet network routing and real-time applications. These hardware priority queue can achieve very high throughput and clocking frequency, thus improve the performance of priority queue in both run-time complexity and communication overhead. Works in (iii) includes *Binary Trees of Comparator* (BTC) by Picker and Fellman (1995); the organization of comparators mimics the Binary-Heap. New elements enter BTC through the leaves, the highest priority element is extracted from the root of BTC; therefore constant $O(\lg n)$ run-time for BTC priority queue operations.

Ioannou (2000) proposed another variant of hardware priority queue, the *Hardware Binary-Heap Priority Queue*. The algorithm maintaining Binary-Heap property is pipelined and executed on custom pipelined processing units, results constant $O(1)$ run-time for both INSERT and EXTRACT priority queue operations. Another implementation similar to it but using Binary-Random-Access-Memory (BRAM) is also proposed by Argon (2006). Noted, adding successive layer at binary-tree double the total number of tree-nodes, all these binary-tree based designs suffer from quadratic expansion complexity.

Brown (1988) and Chao (1991), independently propose the implementation of hardware priority queue using First-In-First-Out architecture, called *FIFO Priority Queue*. For l -levels of priority, l numbers of FIFO arrays is deployed; each stores elements of that priority. This implementation gives constant $O(1)$ run-time, besides the FIFO order among elements with same priority is maintained. This implementation inherits the disadvantage as discussed: if the desired priority-level is large, huge number of FIFO arrays is needed. For example, if 32-bit priority-value is desired, then 4,294,967,296 FIFO arrays are needed.

Shift Register and *Systolic-Shift-Register* implementation of priority queue (Toda *et al.*, 1995; Moon *et al.*, 2000) has better performance compared to the above designs. The priority level and the implemented worst-case priority queue size can be easily scaled. The designs deploy $O(n)$ processing-elements arranged in one dimensional array, for constant $O(1)$ INSERT and EXTRACT run-time complexity. The designs has the disadvantage of severe bus loading effect because all processing-elements are connected to the input data bus, which results in low clocking frequency.

1.6 Significance of Research

This research is significant in that it tackles the issue of interconnect delay optimization in VLSI physical design since the interconnect delay now dominates gate delay in nanometer VLSI interconnect routing. Existing maze routers consider interconnects contribute negligible delay, which is now not correct. Nanometer VLSI routing algorithms now has to include strategies to handle interconnect delay optimization problem which include, among others, buffer insertion. Consequently, the algorithms are now more complex in that they are modeled using multi-weighted multi-constrained graphs. These graphs involve searching over millions of nodes, and hence the algorithms are now extremely compute-intensive. The need for hardware acceleration as proposed in this research is clear. The contribution of this research is as follows:

- 1) A comprehensive design of a 32-bit, parameterizable hardware priority queue accelerator module to accelerate priority queue operations. The module is incorporated into a graph processing unit, GPU. Modifications to the graph algorithms are made such that the proposed design can be applied with other graph-based shortest path algorithms.
- 2) A hybrid priority queue based on hardware-software co-design is also developed. Such implementation introduces a simple yet efficient control mechanism to avoid overflow in hardware priority queue module.
- 3) An application demonstration prototype of a graph processing hardware accelerator is developed. It includes the front-end GUI on host to generate sample post-placement layout. Figure 1.1 gives the architecture of the proposed system.

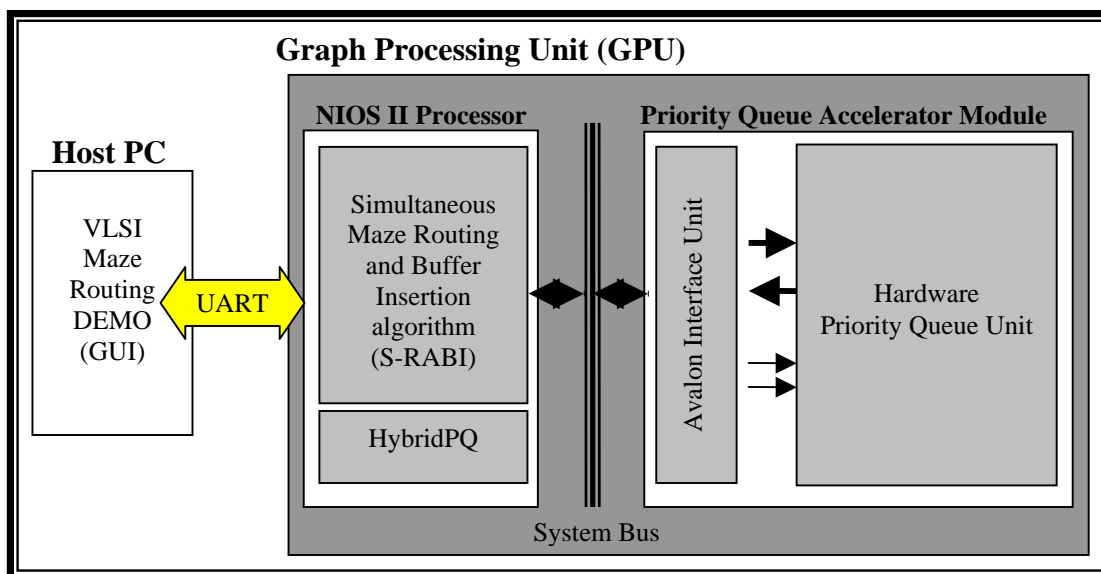


Figure 1.1: System Architecture

1.7 Thesis Organization

The work in this thesis is conveniently organized into eight chapters. This first chapter presents the motivation and research objectives and follows through

with research scope, previous related works, research contribution, before concluding with thesis organization.

The second chapter provides brief summaries of the background literature and theory reviewed prior to engaging the mentioned scope of work. Several topics related to this research are reviewed to give an overall picture of the background knowledge involved.

Chapter Three discusses the priority queue algorithm which leads to our hardware design. Next, the Simultaneous Maze Routing and Buffer Insertion (S-RABI) algorithm applied in nanometer VLSI routing module is presented. It entails the two underlying algorithms which form the S-RABI algorithm.

Chapter Four presents the necessary algorithmic modification on the S-RABI algorithm in order to benefit from the limited but fast operation of hardware priority queue. Next the architecture chosen for the implementation of hardware priority queue accelerator is described; followed by the necessary modifications on the priority queue algorithm for better hardware implementation.

Chapter Five explains the design of the Graph Processing Unit. First the top-level description of GPU is given; followed by each of its sub-components: the NIOS II processor, the system bus, the bus interface and the priority queue accelerator module. Also in this chapter, the development of device driver and HybridPQ is discussed.

Chapter Six delivers the detailed description on the design of priority queue accelerator module. This includes the Hardware Priority Queue Unit and the required bus interface module as per required by our target implementation platform.

Chapter Seven describes the simulation and hardware test that are performed on individual sub-modules, modules and the system for design verification and system validation. Performance evaluations of the designed priority queue

accelerator module are discussed and comparisons with other implementations are made. This chapter also illustrates the top-level architecture of nanometer VLSI routing module developed to be executable on GPU. Further by detail analysis on the performance of graph algorithm with the presence of priority queue accelerator module.

In the final chapter of the thesis, the research work is summarized and deliverables of the research are stated. Suggestion for potential extensions and improvements to the design is also given.

1.8 Summary

In this chapter, an introduction was given on the background and motivation of the research. The need for a hardware implementation of priority queue module to accelerate graph algorithm, particularly state-of-the-art nanometer VLSI interconnect routing is discussed. Based on it, several scope of project was identified and set to achieve the desired implementation. The following chapter will discuss the literature relevant to the theory and research background.

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