

# BLOCK-BASED NEURAL NETWORK MAPPING ON GRAPHICS PROCESSOR UNIT

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UNIT

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*Dedicated, in thankful appreciation for support, encouragement and understanding to  
my beloved mother, father, brother and supervisor...*

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*Ong Chin Tong*

## ABSTRACT

Block-based neural network (BbNN) was introduced to improve the training speed of artificial neural network. Various works had been carried out by previous researchers to improve training speed of BbNN system. Multithread BbNN training on field-programmable gate array (FPGA) limits training speed due to low performance of Nios II software used for communication between central processing unit (CPU) and FPGA. This project aims to improve training speed of multithread BbNN block by mapping BbNN model into Compute Unified Device Architecture (CUDA) core. In this project, each BbNN block is mapped into a CUDA core with each core running on a single thread. The functional verification of BbNN core is carried out based on the BbNN output accuracy value. Near 100 percent accuracy value obtained is used to verify the CUDA mapped BbNN. The performance trade-off analysis had been carried out by comparing the accuracy value obtained from BbNN evolution on GPU versus CPU implementations. From the results obtained, it is found out that the performance of CUDA-mapped BbNN can only be as fast as CPU-mapped implementation. Although CUDA-mapped BbNN implementation run multiple BbNN blocks training in parallel, large data transfer between CPU and GPU dominates the performance gain in training multiple BbNN blocks in parallel. Besides that, a significant gain in training speed can only be seen if the order of complexity for GPU execution is at a higher order compared to the order of CPU-GPU data transfer. The result obtained in this project provides recommendation for future research works on how to further improve the training speed of CUDA-base BbNN implementation.

## ABSTRAK

Block rangkaian neural (BbNN) telah diperkenalkan untuk meningkatkan masa pemrosesan rangkaian neural. Pelbagai kerja telah dijalankan oleh penyelidik sebelum ini untuk meningkatkan masa pemrosesan BbNN. Prestasi multithread BbNN menggunakan field-programmable gate array (FPGA) akan dihadkan oleh prestasi perlahan daripada perisian Nios II yang digunakan untuk berkomunikasi antara central processing unit (CPU) dan FPGA. Projek ini bertujuan untuk menerokai kaedah bagi meningkatkan masa pemrosesan dengan memetakan BbNN menggunakan teras Compute Unified Device Architecture (CUDA). Dalam projek ini, setiap blok BbNN dipetakan ke dalam teras CUDA dengan setiap teras berjalan dengan satu thread. Dengan mendapat ketepatan yang hampir kepada 100 peratus, BbNN yang dipetakan ke dalam CUDA telah disahkan betul. Perbandingan antara prestasi GPU dan CPU kemudian dijalankan dengan mendapatkan perbezaan ketepatan dan masa pemrosesan BbNN. Daripada keputusan projek ini, didapati kelajuan pemrosesan BbNN yang dipetakan ke dalam teras CUDA hanya seiras dengan masa pemrosesan BbNN CPU. Walaupun BbNN yang dipetakan ke dalam teras CUDA diprocess secara selari, prestasi masa pemrosesan CUDA telah didominasi oleh jumlah besar data yang perlu disampaikan antara CPU dan GPU. Di samping itu, peningkatan prestasi pemrosesan CUDA hanya dapat diperlihat sekiranya kerumitan pembilangan berada dalam order yang lebih tinggi daripada kerumitan data yang perlu disampaikan. Keputusan yang diperolehi daripada projek ini dapat menyediakan cadangan untuk kajian masa hadapan mengenai cara untuk meningkatkan lagi prestasi BbNN yang dipetakan ke dalam teras CUDA.