



UNIVERSITI PUTRA MALAYSIA

***CACHE REPLACEMENT ALGORITHM USING  
HIERARCHICAL ALLOCATION SCHEDULING***

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HIERARCHICAL ALLOCATION SCHEDULING**

By  
**MOHAMMAD FAIZAL BIN MOHD SHARIF**

Thesis Submitted to the School of Graduate Studies, Universiti Putra Malaysia,  
in Fulfilment of the Requirements for the Degree of  
Master of Science

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## **DEDICATION**

This work is lovingly dedicated to  
OUR ALMIGHTY GOD ALLAH  
My wife Mazuin binti Mohammad  
My son Mohammad Aqmal  
My daughters Marsha and Mahira



Abstract of thesis presented to the Senate of Universiti Putra Malaysia in fulfilment  
of the requirement for the degree of Master of Science.

## **CACHE REPLACEMENT ALGORITHM USING HIERARCHICAL ALLOCATION SCHEDULING**

By

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**May 2014**

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Cache management has become one of the most popular areas of research in improving the performance of computation. Cache memory is the nearest block of storage between the main memory and the processor. Caches are very fast but have a small memory storage size; therefore only selected instructions or data are to be kept in cache memory. A cache management or also known as a cache replacement policy is a mechanism to manage the process of selecting, keeping, replacing, or evicting the instruction inside cache memory. It is important to determine instructions that need to be kept (or not to be evicted) in order to avoid any disruption for future processes.

Therefore, this research is an effort of developing a conceptual model of the cache replacement policy. Predicting a relative important instruction in cache replacement policy can improve the cache performance. The predicted instruction will have the highest priority to be kept in cache memory for future use. Therefore, latency between the processor and memory can be reduced.

The existing cache replacement (i.e. least recently used (LRU)) algorithm depends on usage of the data being referenced. Data that are least referenced will be removed during cache replacement if the cache is already full. There is no determination of relative important instruction in this policy. By removing this, based on the least recent, it might cause a potential delay in the future processing if the removed instruction depends on it.

To alleviate this limitation, the Hierarchical Allocation Scheduling (HAS) model is proposed in this research. HAS is to schedule the instructions based on the priority of instructions from the aspect of space and time. The core principle is to keep the relatively important instruction in cache memory from being evicted. The development of the HAS model is based on the idea of hierarchical temporal memory (HTM) developed by Numenta Inc. HTM is an approach in which the scheduling is derived on priority and similarity of instruction from the aspect of space and time. The implementation of the HAS model is developed using the OCTAVE software. A simulation of the model is performed to analyse its behaviour in a hypothetical cache management scenario.

Specifically, the goal of the experimentation is to study the situation in which the HAS model can accurately predict a single instruction with the highest relative importance. Analyses indicate that it is the most single instruction occurrence when the data range ( $D$ ) is defined as being between 0 to 9 and the window size ( $k$ ) is fixed at 10. This only contributes to the simulated behaviour of the model regardless to its actual implementation in the cache replacement policy.

Abstrak tesis yang dikemukakan kepada Senat Universiti Putra Malaysia  
Sebagai memenuhi keperluan untuk ijazah Sarjana Sains

**ALGORITHM PENGGANTIAN CACHE MENGGUNAKAN  
PENJADUALAN PERUNTUKAN HIERARKI**

Oleh

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Pengurusan cache telah menjadi salah satu penyelidikan yang paling popular dalam bidang peningkatan prestasi pengkomputeran. Ingatan cache adalah blok terdekat di antara menyimpan ingatan utama dan pemproses. Kelajuan cache sangat cepat tetapi ia hanya mempunyai saiz menyimpan memori yang kecil; oleh itu hanya arahan atau data terpilih akan disimpan dalam ingatan cache. Pengurusan cache atau juga dikenali sebagai polisi penggantian cache adalah satu mekanisma untuk menguruskan proses memilih, menjaga, menggantikan atau menyingkirkan arahan-arahan di dalam ingatan cache. Ia adalah penting untuk menentukan arahan yang perlu untuk disimpan (atau tidak akan disingkir) untuk mengelakkan sebarang gangguan bagi proses-proses yang akan datang.

Oleh itu, kajian ini adalah satu usaha untuk membangunkan konsep model dalam polisi penggantian cache. Meramalkan arahan penting secara relatif dalam polisi penggantian cache boleh meningkatkan prestasi cache. Arahan-arahan yang diramalkan akan mempunyai keutamaan yang tinggi untuk disimpan dalam ingatan cache untuk kegunaan masa depan. Oleh itu, kependaman antara pemproses dan ingatan dapat dikurangkan.

Algorithm penggantian cache yang sedia ada (iaitu “least recently used” (LRU)) bergantung kepada penggunaan data yang dirujuk. Data yang paling kurang dirujuk akan disingkirkan semasa gentian cache jika isi kandungan cache telah penuh. Tiada penentuan arahan penting secara relatif dalam polisi ini. Dengan ini, berdasarkan kaedah rujukan yang kurang, ia berkemungkinan penyebab kelewatan pemprosesan di masa hadapan jika arahan-arahan yang disingkirkan bergantung kepada arahan tersebut.

Untuk mengatasi kekangan ini, model penjadualan peruntukan hierarki (HAS) adalah dicadangkan dalam kajian ini. HAS adalah untuk menjadualkan arahan-arahan berdasarkan keutamaan arahan dari segi ruang dan masa. Prinsip utamanya adalah untuk menyimpan arahan-arahan penting secara relatif dalam ingatan cache daripada yang disingkirkan. Pembangunan model HAS adalah berdasarkan kepada idea hirarki memori sementara (HTM) yang telah dibangunkan oleh Numenta Inc. HTM adalah satu pendekatan di mana penjadualan berdasarkan keutamaan dan kesamaan arahan-arahan dari segi ruang dan masa. Pelaksanaan model HAS dibangunkan dengan menggunakan perisian OCTAVE. Satu simulsi model dilakukan untuk menganalisa perilaku di dalam satu senario pengurusan hipotetikal cache.

Secara khususnya, matlamat ujikaji ini adalah untuk mempelajari keadaan di mana model HAS mampu meramalkan satu arahan dengan tepat mengikut kepentingan relatif tertinggi. Analisis menunjukkan berlakunya arahan tunggal yang tinggi apabila julat data ( $D$ ) ditakrifkan di antara 0 hingga 9 dan saiz tetingkap ( $k$ ) ditetapkan pada 10. Ini hanyalah menyumbang kepada simulasi perilaku pada model tanpa mengambil kira pelaksanaannya yang sebenar di dalam penggantian polisi cache

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## APPROVAL

I certify that a Thesis Examination Committee has met on 16<sup>th</sup> May 2014 to conduct the final examination of Mohammad Faizal bin Mohd Sharif on his thesis entitled **“Cache Replacement Algorithm using Hierarchical Allocation Scheduling (HAS)”** in accordance with the Universities and University Collages Act 1971 and Constitution of the Universiti Putra Malaysia [P.U.(A) 106] 15 March 1998. The Committee recommends that the student be awarded the Master of Science in Aerospace Engineering.

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Signature: \_\_\_\_\_ Date: \_\_\_\_\_

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