ANALYSIS OF CACHE PERFORMANCE FOR OPERATING SYSTEMS AND MULTIPROGRAMMING

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ANALYSIS OF CACHE PERFORMANCE FOR OPERATING SYSTEMS AND MULTIPROGRAMMING

by

Anant Agarwal

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with a foreword by John L. Hennessey



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Foreword

As we continue to build faster and faster computers, their performance is becoming increasingly dependent on the memory hierarchy. Both the clock speed of the machine and its throughput per clock depend heavily on the memory hierarchy. The time to complete a cache access is often the factor that determines the cycle time. The effectiveness of the hierarchy in keeping the average cost of a reference down has a major impact on how close the sustained performance is to the peak performance. Small changes in the performance of the memory hierarchy cause large changes in overall system performance. The strong growth of RISC machines, whose performance is more tightly coupled to the memory hierarchy, has created increasing demand for high performance memory systems. This trend is likely to accelerate: the improvements in main memory performance will be small compared to the improvements in processor performance. This difference will lead to an increasing gap between processor cycle time and main memory access time. This gap must be closed by improving the memory hierarchy.

Computer architects have attacked this gap by designing machines with cache sizes an order of magnitude larger than those appearing five years ago. Microprocessor-based RISC systems now have caches that rival the size of those in mainframes and supercomputers. These large cache sizes and the need for more accurate simulation have created the demand for new and more ambitious studies of cache performance. Earlier studies of caches used programs that are much smaller than the programs run today. Those earlier studies cannot adequately predict the performance of very large caches, since the benchmarks essentially fit within the cache.

Since small changes in miss rate cause large changes in system performance, our cache performance prediction must be more accurate than ever before. This requirement for accuracy means that factors that were previously ignored or estimated must be carefully analyzed and measured. A primary example of such a factor is the effect of the operating system's references on cache performance of a user program. The emergence of shared-memory multiprocessors has created another demand for accurate modeling of cache performance. These machines are extremely sensitive to cache misses because such misses cause contention for a shared resource (the bus and memory). In addition, multiprocessors cannot be accurately simulated with simple uniprocessor cache traces, due to the presence of invalidation requests and misses arising from those requests, both of which are absent in a uniprocessor trace.

This work addresses these problems by examining the performance of large

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programs running in large caches and measuring an entire range of effects not examined in earlier work. To conduct these experiments the first challenge was to devise a method for collecting traces of large programs, including the operating system and multiprogramming effects that were neglected in earlier studies. A system for collecting such traces was created and is described herein.

Because of the large domain of possible cache designs and the length of the traces needed to simulate them accurately, analytical modeling techniques that can explore a range of cache organizations quickly are important. These techniques allow a designer to concentrate on a small number of alternatives out of the vast range of possible cache designs. This small number of designs can then be fully simulated to obtain accurate performance estimates.

Finally, exploring the effect of multiprocessing required obtaining traces from a multiprocessor and then constructing accurate simulation models. Since the effects of multiprocessing can have a significant impact on cache performance and an enormous impact on system performance, it is vital to obtain these traces and model these effects accurately.

The research results described here are an important resource for all computer architects. The increasing importance of the memory hierarchy in determining the performance of high speed machines and multiprocessors makes this type of exploration and analysis invaluable if our computer systems are to continue to grow in performance.

John L. Hennessy Stanford, California

Preface

Advances in high-performance processors continue to create an increased need for memory bandwidth. Migration to multiprocessor architectures exacerbates this need causing the well known Von Neumann bottleneck to main memory. Caches can provide this bandwidth cost-effectively. However, minimizing the performance loss due to caching requires that our analysis and prediction of cache performance become more exact. Although previous studies have shown that operating system and multiprogramming activities affect the cache performance, those studies did not deal with these issues in detail, nor did they address multiprocessor cache performance, largely because of the unavailability of efficient analysis techniques and the difficulty in collecting data for these analyses. To obtain the higher hit rates needed to sustain the effectiveness of caches, we must address these issues completely.

This book investigates the performance of large caches for realistic operating system and multiprogramming workloads. Cache analysis of bus-based multiprocessors is also presented. A suite of efficient and accurate cache evaluation techniques is developed. These include: a mathematical cache model, a trace sampling and a trace stitching procedure, and a trace compaction method. The analyses use a data collection technique called ATUM to obtain realistic system traces of multitasking workloads with little distortion. An extension of ATUM that traces multiprocessors is also described.

Accurately characterizing cache behavior using ATUM traces shows that both operating system and multiprogramming activities significantly degrade cache performance, with an even greater proportional impact on large caches. Multiprocessor interference further reduces cache performance. From a careful analysis of the causes of this degradation, we explore various techniques to reduce this loss. While seemingly little can be done to mitigate the effect of system references, multitasking cache misses can be reduced with little effort. The impact of process migration, virtual versus physical addressing, and the effect of synchronization on large write-back caches in multiprocessors is investigated. We also demonstrate how analytical cache modeling, and trace sampling – with a new approach to cold-start and warm-start analysis – can be used to make large cache studies insightful and efficient.

This book is largely based on my Ph.D. thesis submitted in May 1987 at Stanford University. Chapter 7 contains new material on multiprocessor caches extending the earlier work on uniprocessor cache behavior and represents recent work done at Stanford and also at M.I.T. in collaboration with Dick Sites at Digital Equipment Corporation, Hudson, Massachusetts.

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My wife Anu was a constant source of moral support and encouragement throughout my graduate study, going through some stressful times very patiently and happily.

Finally, I dedicate this book to my parents, for their love, care and sacrifice.

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Cambridge, Massachusetts

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