Workload Characterization of Multithreaded Java Servers on Two PowerPC Processors

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Abstract

Java has, in recent years, become fairly popular as a platform for commercial servers. However, the behavior of Java server applications has not been studied extensively.

We characterize two multithreaded Java server benchmarks, SPECibb2000 and VolanoMark 2.1.2, on two IBM PowerPC architectures, the RS64-III and the POWER3-II, and compare them to more traditional workloads as represented by selected benchmarks from SPECint2000. We find that our Java server benchmarks have generally the same characteristics on both platforms: in particular, high instruction cache, ITLB, and BTAC (Branch Target Address Cache) miss rates. These benchmarks also exhibit high L2 miss rates due mostly to data loads. As one would expect, instruction cache and L2 misses are primary contributors to CPI. Also, the proportion of zero dispatch cycles is high, indicating the difficulty in exploiting ILP for these workloads.

1. Introduction

Java, originally used extensively for web client software, is an emerging paradigm for server applications because of its portability and enhanced security features. However, while Java server applications are coming into wide use, their behavior is not yet well understood. Java client applications have been studied, but Java server applications differ significantly from client workloads, particularly in their need to maintain many concurrent client connections. Since in the current version of Java, I/O multiplexing, polling, and signals are not available, the only method available to Java programmers to maintain a large number of client connections is threads. One or more separate threads are created to handle each client connection [12]. Therefore performance in the presence of a large number of concurrent threads is vital to a Java server application. This distinct characteristic of Java server applications could lead to differences with Java client workloads in terms of branch behavior, cache behavior, and other metrics that contribute to overall performance.

The aim of this study is to characterize the impact of multithreaded Java server applications on modern processor microarchitectures. To this end, we compare multithreaded Java server benchmarks with selected benchmarks from SPECint2000, a suite of more "traditional" workloads, on two IBM PowerPC microarchitectures, the RS64-III and the POWER3-II, to determine the performance characteristics of multithreaded Java server applications.

2. Related Work

Commercial workloads have been increasing in importance, and efforts have been made to understand their behavior [2,11,8,7,16,1]. Most of these studies have been focused on applications written in C or C++, in particular OLTP, DSS, and web server applications.

Java has also been a popular subject of research. The majority of Java studies use SPECjvm98 [17,9,15], which is a client benchmark suite. SPECjvm98 has been observed to have as much as 31% kernel activity due for the most part to a TLB service routine, which indicates a high TLB miss rate. SPECjvm has also been observed to have poor ILP and insensitivity to wider issue width [9]. However, it has better instruction cache performance than C/C++ applications [15].

Commercial Java servers are emerging workloads and thus research has just begun on their behavior. Most of the research in this area has been on the effect of multithreading. Cain and Rajwar [6] studied branch prediction and cache behavior in SPECjbb2000 and TPC-W with the full-system simulation of a coarsegrained multithreaded processor. They found destructive interference between threads that degraded performance. Luo and John [10] studied the impact of multithreading in Java server benchmarks on a Pentium Pro machine. They did see constructive interference in the instruction stream and branch prediction behavior, but these benefits were eventually overcome by increasing resource stalls as the number of threads grew large.

This paper focuses not so much on the effect of multithreading for these Java server benchmarks, but on the differences between Java server applications and more "traditional" workloads (represented by SPECint2000). We use two popular IBM PowerPC platforms that represent the state of the art in microprocessor design. Several performance metrics, such as cache behavior, branch behavior, dispatch behavior, CPI components, etc., are studied.

3. Methodology

This section describes the hardware platforms and benchmarks used in this study as well as the methods used to collect performance monitor data.

3.1. Platforms

We use two IBM PowerPC microarchitectures for our study: the RS64-III and the POWER3-II. Both are current microprocessor architectures, but they differ in many significant ways.

The RS64-III [4,5] is a 64-bit, superscalar, in order, speculative execution machine and is targeted specifically for commercial applications. It has one single cycle integer unit, one multiple cycle integer unit, one four stage pipelined floating point unit, one branch unit, and one load/store unit. The RS64-III can fetch, dispatch, and retire up to four instructions per cycle and has a five stage pipeline. It does not predict branches dynamically like the POWER3-II, but rather prefetches up to eight instructions from the branch target into a branch target buffer during normal execution, predicts the branch not taken, continues to

fetch from the instruction stream and then, once the branch is resolved in the dispatch stage, either continues fetching from the current instruction stream with no penalty or flushes the instructions after the branch and begins fetching from the branch target buffer, with a penalty of at most one and often zero cycles. The RS64-III has a 128KB, two way set associative L1 instruction cache, a 128KB, two way set associative data cache, and a 4MB, four way set associative unified L2. It also has a 512 entry four way set associative unified TLB and a 64 entry instruction effective to real address translation buffer (IERAT) that allows fast address translation without the use of the TLB. The processor clock is 500Mhz.

The POWER3-II [13,14] is a 64-bit, superscalar, out of order, speculative execution machine. It has two single cycle integer units, one multiple cycle integer unit, one branch/condition register unit, two load/store units, and two three stage pipelined floating point units. It can fetch, dispatch, and retire up to four instructions in the same cycle. It has a 256 entry branch target address cache (BTAC), which works like a branch target buffer, and a 2048 entry, 2 bits per entry branch history table for dynamic branch prediction. The POWER3-II has a 64KB, 128 way set associative, four way interleaved L1 instruction cache, a 64KB, 128 way set associative, four way interleaved L1 data cache, and a 8MB, four way set associative unified off-chip L2. It also has a 256 entry two way set associative instruction TLB and two 256 entry two way set associative data TLBs. The POWER3-II is designed with separate buses to memory and L2 for greater memory bandwidth. The POWER3-II also employs a data prefetching mechanism that detects sequential data access patterns and prefetches cache lines to match these patterns. The processor clock is 450 MHz.

Both of these processors are deployed in IBM RS/6000 systems. The RS64-III system we use in the experiment is the M80 and the POWER3-II system we use is the 44p-170, both of which are configured as uniprocessor systems. Both systems have 2 GB of main memory and run AIX 4.3.3 and the IBM JDK version 1.18.

3.2. Benchmarks

In this study, we characterize VolanoMark 2.1.2 and SPECjbb2000, both of which are Java server benchmarks.

VolanoMark 2.1.2 [19] is a Java server benchmark that simulates a chat server environment, as illustrated

in Table 1. The VolanoMark server accepts connections from the chat client, which simulates a specifiable number of chat users by creating a number of chat rooms. Each chat room contains a number of users that continuously send messages to the server and wait for the server to send the messages to other users in the room. The VolanoChat server creates two threads for each client connection.



Figure 1. VolanoMark

SPECjbb2000 [18] is another Java server benchmark. As illustrated in Figure 2, it emulates a three-tier client/server system with emphasis on the middle tier, the business logic engine. The other tiers are emulated, and thus user emulation and a database are not required. SPECjbb is patterned after TPC-C in



Figure 2. SPECjbb2000

that it models a wholesale company with warehouses that serve a number of districts. The transactions generated in this system include new orders and order status requests (both customer-generated transactions), as well as processing orders, entering customer payments, and checking stock levels (companygenerated transactions). Each warehouse, which is represented by 25MB of data stored in binary trees, is assigned one active customer. One thread is created for each warehouse. SPECjbb is a memory resident benchmark.

In addition to these two Java server benchmarks, we run five SPECint2000 benchmarks [18] on the two platforms. This allows us to compare the multithreaded Java server applications to more traditional workloads. We use 255.vortex, 300.twolf, 176.gcc, 252.eon, and 186.crafty, which cover a wide range of application sizes and also contain the only SPECint2000 benchmark written in C++.

3.3. Measurements

We use the hardware performance monitors built into each microprocessor to make performance measurements. Each performance monitor has eight counters that can be programmed to count a variety of processor events. The list of countable events differs between the two machines, but many important events We interface with the can be counted on both. performance monitor using the IBM-supplied performance monitor API and pmcount (a utility that allows the user to interface with the performance monitor), both of which are AIX kernel extensions. Since we only want to collect performance monitor counts for VolanoMark while client connections are being made and not during server startup or shutdown, we send signals to a wrapper that makes API calls to start counting after server startup and stop counting before server shutdown. Similarly, since we only want to do performance monitoring on SPECjbb during the two-minute "measurement period," we instrument the code for SPECjbb (modifying only Company.java) to send signals to a wrapper that makes API calls to start counting at the beginning of the measurement period and stop counting at the end of the period. While pmcount is simpler to use, requiring only a list of events and the executable to count for as arguments, it does not allow this kind of selective counting. However, we do use pmcount for the SPECint benchmarks, since we count for the entire workload in those cases.

For VolanoMark, we run the client on a separate machine. Each chat room has 20 users, while the number of chat rooms is varied from 1 to 40, resulting in a number of connections ranging from 20 to 800. Since VolanoMark creates two threads for every connection, this results in a number of connection threads ranging from 40 to 1600. For SPECjbb, we vary the number of warehouses from 1 to 25. One thread is created for each warehouse.

4. Results

Table 1 and Table 2 compare the Java server benchmarks to the SPECint benchmarks on the RS64-III and POWER3-II, respectively. VolanoMark is run with 1,10, and 30 chat rooms (indicated as vol01, vol10, and vol30)), and SPECjbb is run with 1, 10, and 25 warehouses (indicated as jbb1, jbb10, and jbb25). The metrics collected are similar to those collected by Bhandarkar et. al. [3].

os cyc % CPI data refs/instr mem trans/1000 instr bmark vol30 47.06 1.76 0.34 5.68 vol10 64.47 2,17 0.37 831 22.93 vol01 84.68 3.68 0.35 server 4.95 0.37 1.52 jbb25 0.33 jbb10 0.41 1.45 0.34 3.84 Java ibb01 0.29 1.26 0.34 1.73 0.78 1.09 0.39 0.41 gcc SPECint2000 0.15 0.89 0.34 0.01 crafty 1.36 0.00 015 062 eon twolf 0.14 1.43 0.38 0.14 0.26 1.07 0.41 0.51 vortex

Table 1. Java servers vs. SPECint2000 (RS64-III)

As the tables indicate, VolanoMark spends a high proportion of its execution cycles in kernel mode (os cyc %). This phenomenon is likely due both to the fact that it spends a great deal of time sending and

Table 2. Java servers vs. SPECint2000 (POWER3-II).

bmark		os cyc %	CPI	data refs/instr	memtrans/1000 instr
Java server	vol30	54.11	1.44	0.34	6.00
	vol10	59.83	1.59	0.38	4.43
	vol01	62.78	1.78	0.39	6.59
	jbb25	0.33	1.27	0.33	5.30
	jbb10	0.39	1.25	0.33	3.90
	jbb01	0.40	1.17	0.34	1.73
SPECint2000	gcc	0.92	0.84	0.44	0.30
	crafty	0.14	0.74	0.40	0.00
	eon	0.13	0.90	0.69	0.00
	twolf	0.14	1.21	0.39	0.01
	vortex	0.28	0.78	0.54	0.48

receiving messages over the network and to the fact that the number of threads in VolanoMark is very large, requiring the OS to spend a significant amount of time in thread scheduling routines. The user code is concerned mainly with distributing messages, which is a relatively simple task. We can also see that VolanoMark exhibits a higher CPI than the SPECint benchmarks, which is understandable since OS code is known to have a higher CPI than user code [8]. Since SPECjbb2000 contains no network component, has far fewer threads than VolanoMark, and is memory resident and therefore does not generate many page faults, it has a very small proportion of cycles spent in kernel mode. The same is true for the SPECint benchmarks.

Also, Table 1 and Table 2 show the data references per instruction and the memory transactions per 1000 instructions for the Java server and SPECint workloads. On the average, the Java server workloads generate less data references per instruction than the SPECint workloads, with some of the SPECint workloads far exceeding them, but the Java server workloads still generate considerably more memory transactions per instruction, by a factor of between one and three. This is an interesting observation that will be discussed later.

4.1. Dispatch Behavior

Both the RS64-III and the POWER3-II can dispatch up to four instructions per cycle (dispatch for these machines meaning the stage in which the instruction is sent to the execution unit reservation station). From Figure 3 it is clear that our machines have more difficulty exploiting ILP in the Java server benchmarks than in the SPECint benchmarks. For almost all of the Java server benchmarks on the RS64-III, zero instructions are dispatched for over 50% of the execution cycles (the lone exception being sjbb1). Only one SPECint benchmark, twolf, has zero instructions dispatched for over 50% of the execution



(a) Dispatch profile, RS64-III



retired cycles, POWER3-II

Figure 3. Dispatch/completion behavior

cycles. On the POWER3-II, the dispatch profile is similar (we show only the percentage of cycles with zero instructions dispatched because the other counts were not available on this machine). All of the Java server benchmarks on the POWER3-II have zero instructions dispatched for more than 60% of the execution cycles, while only twolf crosses this threshold among the SPECint workloads. The profile is almost identical for the percentage of zeroinstructions-retired cycles on the POWER3-II, which is reasonable given that pipeline delays are being created in the dispatch stage. Although the dispatch stage in these machines is not the stage in which operands are read, and thus delays in dispatch are not directly due to dependencies between instructions that limit exploited ILP, nevertheless dispatch is stalled if, in later pipeline stages, dependencies are found that cause the execution unit reservation stations to fill. Therefore instruction dependencies do affect dispatch, and the above dispatch numbers are reflective of exploited ILP. These numbers seem to indicate that the processors cannot exploit as much ILP in the Java server workloads as they can in the SPECint workloads.

4.2. Cache and TLB Performance

As mentioned earlier, the Java server workloads generate significantly more memory accesses per instruction than the SPECint workloads. And, as one might expect from a higher number of memory accesses per instruction, Figure 4a and Figure 4c show



1000 instructions, RS64-III



Figure 4. Cache behavior

that the Java server workloads exhibit poorer cache performance than the SPECint workloads on both machines, particularly in the instruction cache and L2.

High instruction cache miss rates have also been known to occur in server applications written in C or C++ [1,2]. Dynamically compiled code for consecutively called methods may not lie in contiguous address spaces, and thus the spatial locality can be expected to be poor for these Java server benchmarks, causing poor instruction cache miss rates. Also, not surprisingly, the instruction cache miss rates are higher on the POWER3-II for most of the workloads (since its instruction cache is 64KB as opposed to 128KB for the RS64- III), but for vortex and crafty the instruction cache miss rates are higher on the RS64-III. This indicates that, for the Java server workloads and the other SPECint benchmarks, size is more important than associativity for instruction cache performance, while for vortex and crafty associativity (2 for the RS64-III and 128 for the POWER3-II) is more important than size for performance. Figure 5 shows that the Java server benchmarks cause more instruction TLB misses than the SPECint benchmarks on the RS64-III, and a similar pattern is observed for TLB misses on the POWER3-II (ITLB miss count not available on POWER3-II). This TLB performance data is further evidence that Java server benchmarks have a scattered instruction footprint.

Figure 4b shows the components (load misses, store misses, and instruction misses) of L2 misses for the RS64-III. (These counts were not available on the POWER3-II.) It is clear from this figure that most of the L2 misses for the Java server workloads are

generated by load references. This is interesting because there is not nearly as large a disparity between the Java server and SPECint workloads in data cache performance as there is in L2 cache performance,



Figure 5. TLB behavior

specifically L2 load misses. Figure 6, which shows the L2 miss ratios (as opposed to misses per 1000 instructions) on each machine, confirms that indeed the Java server benchmarks are putting more pressure on the L2 than the SPECint benchmarks. We cannot explain this behavior with certainty, but a reasonable explanation could be that the Java server benchmarks have a larger data footprint than the SPECint workloads (though we cannot obtain the data set size for VolanoMark, we know that each warehouse in SPECjbb uses 25MB of data) and therefore generate more compulsory L2 misses.



Figure 6. L2 miss ratio

4.3. Branch Behavior

Figure 7a indicates that the POWER3-II's branch prediction mechanism works as well for the Java server programs as for the SPECint benchmarks (branch prediction numbers for RS64-III not shown because it does not employ dynamic branch prediction). Figure 7b and Figure 7c show that the speculative factors (instructions dispatched/instructions executed) of the Java server benchmarks are within the range of SPECint2000, indicating that the two sets of benchmarks have much the same effect on speculative execution. However, the Java server benchmarks (with the exception of vol30) exhibit, on the average, worse BTAC (Branch Target Address Cache) performance than gcc, twolf, and vortex. This could indicate that the BTAC of the POWER3-II, which caches branch target addresses and does not store any target instructions, does not work very well for Java server code. Further, eon, which shows BTAC performance similar to the Java server benchmarks, is written in C++ and makes heavy use of virtual functions, which



Figure 7. Branch behavior

are also widely used in Java. Java programs are known to have poor branch target predictability due to indirect branches resulting from virtual function calls and code interpretation [15].

4.4. CPI Components

Figure 8 compares the Java server benchmarks to the SPECint benchmarks on the RS64-III fromanother perspective: CPI components per instruction. (These events are not countable on the POWER3-II.) The stalls in the above figure do not comprise a comprehensive list, but they are the significant storage related stalls on the machine.



Figure 8. CPI components, RS64-III

"Ideal CPI" refers to (total execution cycles storage latency)/instructions executed. "Storage latency" is a single countable event on the RS64- III performance monitor that indicates the (nonoverlapped) total amount of storage related stalls (i.e. multiple storage related stalls in one cycle are counted as one stall). Thus "Ideal CPI" is an approximation of CPI in the absence of all storage related stalls. "Isync" and "Other sync" stalls are caused by various synchronizing PowerPC instructions. It is clear that, as could be predicted from the earlier discussion of cache misses, that the Java server benchmarks incur significantly more instruction cache stalls and L2 cache stalls than the SPECint benchmarks, and further, that these along with ideal CPI (which is determined by internal resource conflicts that we cannot count for) are responsible for most of the total CPI. For SPECjbb, data cache miss stalls also play a large role in the CPI. In contrast, the SPECint benchmarks suffer from very little, if any, of the storage related stalls included in the figure. However, despite the large number of storage stall cycles for the Java server benchmarks, shows that

the CPIs of the benchmarks are lower than the sum total of the CPI components, which indicates the effectiveness of the RS64-III's superscalar pipelined architecture in hiding some of the storage latency.

5. Conclusion

We performed a comparison of two multithreaded Java server benchmarks, SPECjbb2000 and VolanoMark2.1.2, with selected benchmarks from SPECint2000 on two IBM PowerPC architectures, the RS64-III and the POWER3-II. We find that our Java server applications differ from SPECint in several ways:

- Clearly, instruction stream behavior is particularly poor for these Java server workloads. High instruction cache, ITLB, and BTAC miss rates are observed. These point toward a scattered instruction footprint. Instruction cache stalls make up a substantial component of the CPIs of these workloads, while they are near negligible in the SPECint workloads.
- We also see that poor L2 performance is a major factor in overall performance for the Java server workloads. L2 misses per instruction and per L2 reference are significantly higher than those for SPECint2000. L2 load misses make up the vast majority of the Java server benchmarks' L2 misses, due possibly to a scattered data footprint that causes a higher proportion of L2 compulsory misses. Clearly, if one is to study the impact of Java server applications on modern processor architectures, L2 performance must not be neglected.
- In addition, these Java server workloads have a high proportion of zero dispatch cycles, suggesting that ILP is not very easily exploited in these workloads.

Given that our two PowerPC architectures are significantly different, the RS64-II being an in-order execution machine with static branch prediction and the POWER3-II being a highly aggressive out-of-order execution machine, the fact that the above characteristics were found on both platforms suggests that they are real properties of the workload and not machine-dependent. Obviously, then, there lies room for performance improvements and optimizations, especially in instruction cache and L2 performance.

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