

# Prefetch Breakdown for Helper Threading on CMPs

Min Cai, Zhimin Gu, Xianhe Sun

**Abstract**—For big data-crunching workloads exhibiting irregular memory access patterns in the era of data intensive computing, helper threading on shared cache chip multiprocessors (CMPs) speculatively issue last-level cache (LLC) requests to the predicted memory addresses ahead of main thread references. Effective helper threading on CMPs demands that the helper thread (HT) should issue correct and timely LLC requests just before the main thread (MT) references them. Unfortunately, this ideal case can not be fulfilled in the practical implementations of helper threading on CMPs: inaccurate and/or untimely LLC requests coming from the helper thread could not contribute to the main thread performance, but instead stress and pollute LLC if no effective LLC replacement and pollution-aware feedback techniques are employed.

This paper characterizes the degree by which intra-application LLC interference is caused by inter-core data prefetches in the above helper threading scheme. Since hardware performance counter based measurement on real machines cannot provide required fine-grained metrics, using cycle-accurate architectural simulation of the memory intensive benchmark mst from Olden, we first adapt traditional approaches to characterizing hardware prefetches such as prefetch accuracy, coverage and lateness, useful vs. useless prefetches to characterize helper threading on CMPs. Based on the insights from these characterizations, we then propose a fine-grained breakdown of helper thread L2 requests to study the intricate interactions between intra-application LLC interference and parameters of the helper threading scheme. Experimental results show that there exists an optimal value of lookahead, where values of lookahead both greater and smaller than that lead to lesser timely and greater late requests, thus lowering the overall performance. The position of optimal value of lookahead varies depending on the value of stride. Selecting proper parameters, such as lookahead and stride, of the helper threading scheme play a key role in maximizing the performance of the scheme. Overall, our characterizations are important in interpreting the effectiveness of helper threading on CMPs by cycle-accurate architectural simulation, and highlighting the opportunities and challenges of optimizing helper threading on CMPs in a dynamic and feedback-directed way.

**Index Terms**—Chip multiprocessors, helper thread, prefetch breakdown, intra-application cache interference

## I. INTRODUCTION

**F**OR big data-crunching workloads exhibiting irregular memory access patterns in the era of data intensive computing, helper threaded data prefetching or simply called helper threading [1], [2], [3], on shared cache chip multiprocessors (CMPs) speculatively issue last-level cache (LLC) requests to the predicted memory addresses ahead of main thread references. Effective helper threading on CMPs

demands that the helper thread (HT) should issue correct and timely LLC requests just before the main thread (MT) references them. Unfortunately, this ideal case can not be fulfilled in the practical implementations of helper threading on CMPs: inaccurate and/or untimely LLC requests coming from the helper thread could not contribute to the main thread performance, but instead stress and pollute LLC if no effective LLC replacement and pollution-aware feedback techniques are employed.

Several metrics have been proposed in the past for evaluating the effectiveness of hardware based data prefetching, among which prefetch accuracy and coverage are the most intuitive ones [4]. We can easily adapt the definitions of accuracy and coverage for hardware based data prefetching to the helper threading scheme. Helper thread request accuracy is defined as the ratio of the number of useful helper thread requests to the number of total helper thread requests. And helper thread request coverage is defined as the ratio of the number of useful helper thread requests to the number of main thread misses plus main thread hits to helper thread requested data. Here, a helper thread request is called useful when its requested data is referenced by main thread before evicted. Furthermore, similar to the approach to hardware prefetching, to measure coverage and accuracy, all helper thread requests can be categorized into “useful” and “useless” helper thread requests [4]. A “useful” helper thread request is one whose brought data is hit by a main thread request before it is replaced, while a “useless” helper thread request is one whose brought data is replaced before it is hit by a main thread request. However the above traditional accuracy and coverage metrics for helper thread requests and the classification of “useful” and “useless” helper thread requests don’t care about the LLC pollution and inter-thread interference caused by helper thread LLC requests, which are two kinds of deficiencies in the helper threading scheme.

This paper characterizes the degree by which intra-application LLC interference is caused by inter-core data prefetches in the above helper threading scheme. Since hardware performance counter based measurement on real machines cannot provide required fine-grained metrics, using cycle-accurate architectural simulation of the memory intensive benchmark mst from the Olden pointer traversing benchmark suite [5], we first adapt traditional approaches to characterizing hardware prefetches such as prefetch accuracy coverage and lateness, useful vs. useless prefetches to characterize helper threading on CMPs. Based on the insights from these characterizations, we then propose a fine-grained breakdown of helper thread L2 requests to study the intricate interactions between intra-application LLC interference and parameters of the helper threading scheme. Experimental results show that there exists an optimal value of lookahead, where values of

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lookahead both greater and smaller than that lead to lesser timely and greater late requests, thus lowering the overall performance. The position of optimal value of lookahead varies depending on the value of stride. Selecting proper parameters, such as lookahead and stride, of the helper threading scheme play a key role in maximizing the performance of the scheme. Overall, our characterizations are important in interpreting the effectiveness of software-initiated helper threading on CMPs by cycle-accurate architectural simulation, and highlighting the opportunities and challenges of optimizing helper threading on CMPs in a dynamic and feedback-directed way. We assume here a two level cache hierarchy where L1 caches are private and the L2 cache is shared among all processor cores on a single chip.

The main contributions of this paper can be summarized as answers for the following two questions:

- 1) What is the relationship between the shared cache behavior and the overall performance improvement in helper threading on CMPs;
- 2) How can the helper thread LLC requests be classified to reflect the inter-thread LLC interference caused by helper thread LLC requests in helper threading on CMPs.

The rest of this paper is structured as follows. Section 2 describes the cycle-accurate simulation framework for the target CMP architecture and experimental setup. Section 3 presents the characterization of LLC interference caused by helper threading on CMPs. Section 4 discusses the performance results on the detailed experiments. Section 5 provides related work. Section 6 concludes the paper.

## II. METHODOLOGY

### A. Target CMP Architecture

As shown in Fig.1, the simulated target CMP architecture has two cores where each core is a two-way SMT with its own private L1 caches (32KB 4-way data caches and 32KB 4-way instruction caches). Both cores share a 96KB 8-way L2 cache. MESI inclusive directory coherence is maintained between L1 caches. Both L1 and L2 caches use LRU replacement policy. An LRU cache called HTRVC is attached to the L2 cache to implement the breakdown of helper thread LLC requests, as will be explained in the next section. Detailed microarchitecture parameters are listed in Tab.I.

### B. Simulation Framework

We use the open source Archimulador<sup>1</sup> CMP architectural simulation environment in our experiments mentioned in this work. Archimulador is an object-oriented execution-driven application-only architectural simulator written completely in Java and running on 32 and 64 bit Linux based operating systems. It provides three modes of functional simulation, cycle-accurate simulation and two-phase fast forward and measurement simulation of MIPS II executables on CMP architectures consisting of out-of-order super-scalar cores and configurable memory hierarchies with directory-based MESI

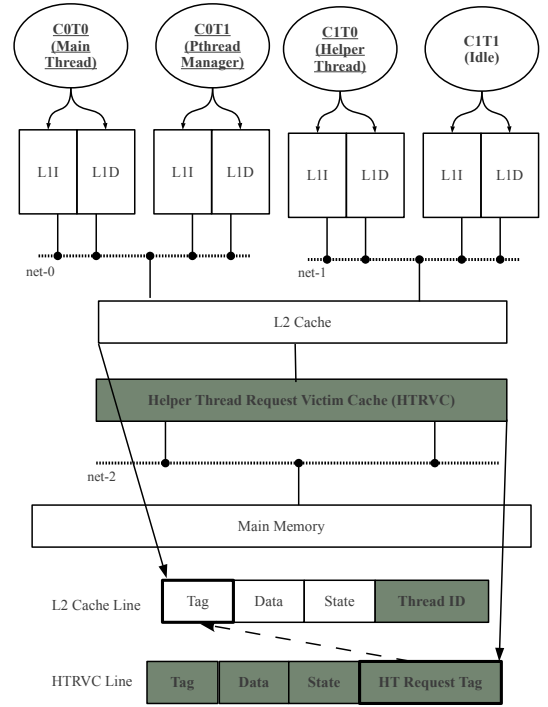


Figure 1. Target CMP Architecture

coherence. It supports simulating Pthreads based multithreaded workloads.

a) *Static Software Context to Hardware Thread Mappings*: In a typical Pthreads based helper thread program, there are three threads when running: main thread, helper thread and the Pthreads manager thread. The Pthreads manager thread takes the role of spawning, suspending and resuming helper thread by passing signals to helper thread. Consider a simulated target CMP machine which has two cores where each core supports two hardware threads. In our application-only simulation using Archimulador, without the OS intervention, one hardware thread can only run at least one software context (or simply called thread). Therefore, the typical software context to hardware thread mappings can be: C0T0 → main thread, C0T1 → Pthreads manager thread, C1T0 → helper thread (C = core, T = thread), as shown in Fig.1. We use this context mapping in the following discussions.

### C. Benchmarks and Input Sets

We perform our evaluation using the original version and manually coded helper thread version of mst in the Olden pointer traversal benchmark suite. All applications are cross-compiled using gcc flag “-O3” and run until completion using cycle-accurate simulation. Input set for mst is “2048 1”. Default Values of helper threading lookahead and stride parameters are 20 and 10, respectively, if not specified explicitly.

<sup>1</sup>See <http://github.com/mcai/archimulador/> for details.

Table I  
BASELINE HARDWARE CONFIGURATIONS

Pipeline	4-wide superscalar out-of-order core				
	2 cores, 2 threads per core				
	Physical register file capacity	128			
	Decode buffer capacity	96			
	Reorder buffer capacity	96			
	Load store queue capacity	48			
FUs	Branch predictor	Perfect			
	FU Name	Count	Operation Lat	Issue Lat	
	Int. ALU	8	2	1	
	Int. Multiply	2	3	1	
	Int. Division		20	19	
	Fp. Add	8	4	1	
	Fp. Compare		4	1	
	Fp. Convert		4	1	
	Fp. Multiply	2	8	1	
	Fp. Division		40	20	
	Fp. Sqrt		80	40	
	Read Port	4	1	1	
	Write Port		1	1	
Cache	Name	Size	Assoc	Line Size	Hit Lat.
	I Cache	32KB	4	64B	1
	D Cache	32KB	4	64B	1
	L2 Cache	2MB	8	64B	10
Network	Switch based P2P topology, 32B link width				
Memory	4GB, 200-cycle fixed latency				

### III. PREFETCH BREAKDOWN FOR HELPER THREADING

#### A. The Scheme of Helper Threading on Shared-Cache CMPs

As illustrated in Fig.2, the work flow of helper threading on shared-cache CMPs we implement here can be described as follows.

- 1) The helper thread is spawned in the entry point *main()* of the program;
- 2) The helper thread remains dormant until some caller of the target hotspot function has been invoked and code placed in the caller wakes up the helper thread to let it start the *prelude* where the code in the helper thread skips some iterations of pointer traversals (i.e., there is no prefetch issued) to compensate the long time used for data prefetching in the helper thread as compared to the short time used in computation work in the main thread;
- 3) The helper thread enters a *stable state* of issuing LLC prefetch requests in loop iterations of pointer traversals ahead of the main thread until the execution of the program has passed some point(s) in the target hotspot function;
- 4) The code in helper thread is synchronizing pointers with the main thread and begin the next turn of servicing hotspots;
- 5) After all the prefetching work is done, the helper thread is destroyed in *main()*.

Two parameters in the helper threading scheme control its aggressiveness: (1) the number of loop iterations of pointer traversals that the helper thread code skip after synchronizing with the main thread in the prelude is called *lookahead*, which is necessary given that the helper thread needs to stay ahead of the main thread in the beginning in each turn to amortize the difference of amount of work to do in the main thread and the helper thread in CPU time; (2) the number of loop iterations

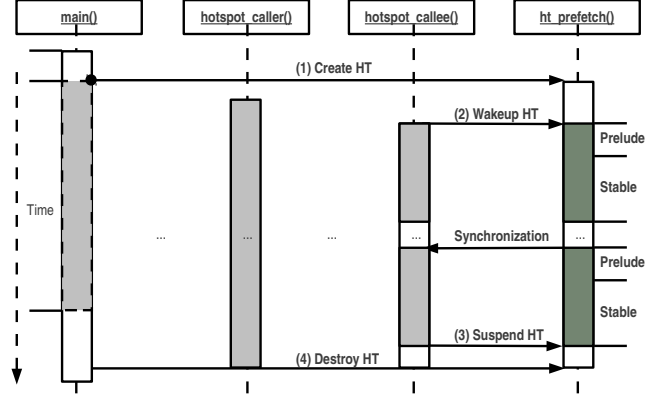


Figure 2. The Scheme of Helper Threading on CMPs

of pointer traversals in which helper thread code issue LLC prefetch requests in the stable state is called *stride*, which implies how much data prefetching work can be done in the helper thread in each turn in the attempt to not lag behind the main thread and pollute the LLC too much.

In the traditional helper threading configuration, the values of lookahead and stride are selected empirically and hard coded, which is unable to accommodate the unpredictable nature of L2 cache runtime behavior in the presence of helper thread requests. Based on our following characterization of helper thread L2 requests, a dynamic feedback directed mechanism can be built in which the processor changes the value of lookahead and stride using some temporary registers to adjust the aggressiveness of the helper threading scheme.

#### B. Adapting Traditional Hardware Prefetching Metrics to Helper Threading

Traditionally, prefetch accuracy, coverage and lateness are used to evaluate the effectiveness of hardware prefetchers [4]. In this section, we adapt the metrics to the helper threading scheme and describe what the metrics mean under the helper threading scheme.

##### b) Useful vs. Useless Helper Thread LLC Requests:

Helper thread requests can be categorized into useful and useless helper thread requests. A *useful helper thread request* is one whose brought data is hit by a main thread request before it is replaced, while a *useless helper thread request* is one whose brought data is replaced before it is hit by a main thread request.

c) *Helper Thread LLC Request Accuracy: Helper thread LLC request accuracy* is a measure of how accurately the helper threading scheme can predict and issue prefetch requests for the memory addresses that will be accessed by the main thread. It is defined as below

$$Accuracy = \frac{\# \text{ Useful Helper Thread LLC Requests}}{\# \text{ Helper Thread LLC Requests}} \quad (1)$$

where # Useful helper thread LLC Requests is the number of LLC lines brought by helper thread requests that are later on hit by helper thread requests. For benchmarks with high

helper thread LLC request accuracy, performance increases as the aggressiveness of the helper threading scheme is increased.

d) *Helper Thread LLC Request Coverage: Helper thread LLC request coverage* is a measure of the fraction of all main thread LLC misses in the baseline version where helper thread is switched off that can be converted into hits by issuing helper thread LLC misses ahead in the helper thread version. It is defined as below

$$\text{Coverage} = \frac{\# \text{ Useful Helper Thread LLC Requests}}{\# \text{ Main Thread LLC Requests w/o Helper Thread}} \quad (2)$$

e) *Helper Thread LLC Request Lateness: Helper thread LLC request lateness* is a measure of how timely the LLC requests generated in the helper thread are with respect to the LLC requests generated in the main thread that need the data brought by the helper thread. A helper thread LLC request is said to be late if its requested data has not yet returned from the main memory by the time a main thread LLC request references the data. Therefore, even though the helper thread LLC request is accurate, it can only partially hide the latency incurred by an LLC miss in the main thread. Helper thread LLC request lateness can be defined as below

$$\text{Lateness} = \frac{\# \text{ Late Helper Thread LLC Requests}}{\# \text{ Useful Helper Thread LLC Requests}} \quad (3)$$

### C. Prefetch Breakdown for Helper Threading

1) *Intra-Application Reuse Distances in Helper Threading on CMPs:* The notion of reuse distance can shed light on how a pollution-aware breakdown of helper thread LLC requests can be constructed. The traditional intra-thread reuse distance of a reference to data element  $x$  is defined as the number of unique memory references between two consecutive accesses of  $x$  in the same thread (or  $\infty$  if the element has not been referenced thereafter). In a  $k$ -way set-associative cache a cache miss with reuse distance  $rd$  can be classified by the value of reuse distance as below

- 1)  $rd < k$  indicates it is a *conflict miss*;
- 2)  $k \leq rd < \infty$  indicates it is a *capacity miss*;
- 3)  $rd = \infty$  indicates it is a *cold miss*.

To accommodate the case where one thread  $T_b$  accesses data element  $x$  that has been previously brought into the cache by another thread  $T_a$ , we introduce the notion of  $T_a$ - $T_b$  inter-thread reuse distance, as compared to the traditional intra-thread reuse distance applied to either  $T_a$  or  $T_b$ .

To show why the notion of inter-thread reuse distance is important in the helper threading scheme as compared to the traditional notion of intra-thread reuse distance, we can consider the mst benchmark in the Olden suite. Its pointer traversing code structure inherently exhibits irregular memory access pattern in its original, single threaded version, which renders the common LRU replacement policy inefficient to reduce LLC misses. Here we use  $RD_{MT}$  to refer to the *intra-thread reuse distance* in the main thread, and  $ITRD_{HT-MT}$  to refer to the *inter-thread reuse distance* between helper thread and main thread where a data element is first brought to LLC by helper thread, and later on used by the main thread. Therefore, the values of  $RD_{MT}$  in most main thread LLC

requests is high which reflects the irregular memory access pattern in mst. The values of  $ITRD_{HT-MT}$  in helper thread LLC requests should be very small when the helper threading scheme is efficient to reduce LLC misses in main thread where for most helper thread LLC miss, an immediate follow-up main thread LLC request will access the data brought by the previous LLC request and hit in the LLC. Otherwise, large values of  $ITRD_{HT-MT}$  indicate the inefficiency of the helper threading scheme where most data brought by helper thread is replaced before used by the main thread.

Helper thread induced cache pollution with respect to main thread performance only happens when helper thread LLC requests evict the data that are previously brought by main thread and immediately referenced again by main thread LLC requests, but rarely happens when helper thread LLC requests evict any data that was previously brought by main thread but will not be used by the main thread in the near future, which is typically the case in mst which exhibits a thrashing memory access pattern and thus most of the data requested from its delinquent PCs have instant main thread intra-thread reuse distances but small helper thread-main thread inter-thread reuse distances, which renders traditional intra-thread reuse distance prediction based LLC replacement useless for mst with helper thread. Fortunately, as we will see, HT-MT inter-thread reuse distance prediction based LLC replacement can be useful for mst with helper thread.

2) *A Simple Breakdown of Helper Thread LLC Requests Based on Intra-Application Reuse Distances:* Based on the notions of HT-MT inter-thread reuse distance ( $ITRD_{HT-MT}$ ) and main thread intra-thread reuse distance ( $RD_{MT}$ ), we can construct a pollution aware breakdown of helper thread LLC requests where helper thread LLC requests are classified into three types: good, bad and ugly. Let's assume when a helper thread LLC request referencing data  $H$  evicts an LLC line containing the victim data  $V$  which is brought by main thread, and afterwards the LLC line containing  $H$  is evicted by a main thread LLC request with data  $M$ . Therefore, there are two LLC replacement involved: first  $H$  evicts  $V$  and then  $M$  evicts  $H$ . We use  $RD_{MT}(v)$ ,  $ITRD_{HT-MT}(h)$  and  $RD_{MT}(m)$  to denote the number of distinct data elements that have been referenced between the time when  $H$  evicts  $V$  and the time  $V$ ,  $H$  and  $M$  is accessed again, respectively. The greater the reuse distance of the data, the farther the data will be referenced again in time. An LLC replacement is considered as optimal if the replacement makes the data with small reuse distance evicts the data with larger reuse distance, otherwise the replacement is considered as non-optimal. We have

- 1) if  $ITRD_{HT-MT}(H) < RD_{MT}(V) < RD_{MT}(M)$ , then the helper thread LLC request is considered as *good* because it evicts the data that has larger reuse distance than its own. Its data is hit by the main thread before evicted. It has positive impact on the main thread performance since it reduce one main thread miss;
- 2) if  $RD_{MT}(V) < ITRD_{HT-MT}(H) < RD_{MT}(M)$ , then the helper thread LLC request is considered as *bad* because it evicts the data that has smaller reuse distance than its own. It displaces an LLC line that will later be needed by the main thread. It is harmful for main

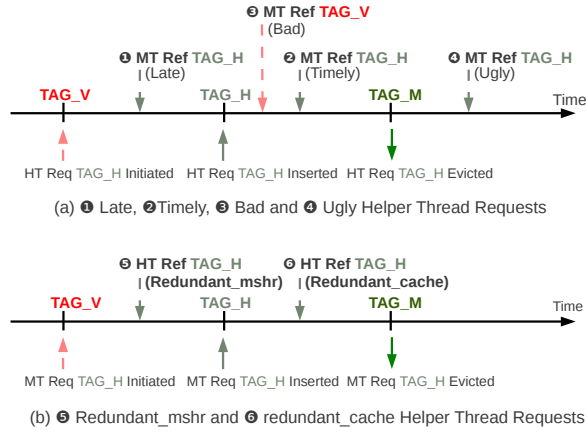


Figure 3. Timeline for Breakdown of Helper Thread LLC Requests

thread performance which should be prevented as much as possible;

- 3) if  $RD_{MT}(M) < RD_{MT}(V)$  and  $ITRD_{HT-MT}(H)$ , then the helper thread LLC request is considered *ugly* because both its data and its victim data have larger reuse distances than the data H. It has little performance impact on main thread performance because the requested data is not referenced by main thread before evicted and it does not evict any data that will be used by the main thread.

As depicted in Fig.3, We can see that, good and bad helper thread LLC requests are caused by the optimal and non-optimal LLC replacement in the presence of helper threading on CMPs, respectively. We can conclude that

- 1) Low  $ITRD_{HT-MT}$  is an indicator of good performance of the helper threading scheme;
- 2) Medium  $ITRD_{HT-MT}$  signals those potentially late helper thread prefetches that, depend on the LLC replacement policy, may be useful, partially useful or totally useless for main thread performance;
- 3) High  $ITRD_{HT-MT}$  implies helper thread and main thread is not synchronized well or the amount of (computational and memory access) work is not distributed and balanced well between the main thread and helper thread.

**3) Add Lateness to the Breakdown of Helper Thread LLC Requests:** As noted in the previous section, good helper thread LLC requests can be further divided into timely requests and late requests. A helper thread request is called *late helper thread request* if its requested data has not yet returned from the main memory by the time a main thread LLC request references the data. Late helper thread requests only partially hide the LLC miss latency in main thread requests, but they are good indicators for potential performance improvement of the helper threading scheme because late helper thread requests may be converted to timely helper thread requests by adjusting the aggressiveness parameters of the helper threading scheme, i.e., lookahead and stride.

As we can observe that, if the helper thread request is too late, then when the request arrives at LLC, it find its referenced data is already present in either LLC or LLC MSHRs. Therefore, we can add *redundant\_mshr helper thread request* and *redundant\_cache helper thread request* to the breakdown, as shown in Fig.3.

#### D. Mechanisms and Algorithms for Implementing the Breakdown

##### 1) Mechanisms:

a) *LLC request and replacement event tracking:* To monitor the request and replacement activities in LLC, we need to consider the event when the LLC receives a request coming from the upper level cache, whether it is a hit or a miss. The event has a few important properties to be used in the experiment, e.g., the address of the requested LLC line, the requester memory hierarchy access, line found in the LLC, a boolean value indicating whether the request hits in the LLC, and a boolean value indicating whether the request needs to evict some LLC line.

b) *Helper Thread LLC request state tracking:* In order to track the helper thread request states in the LLC, we need to add one field named *threadId* to each LLC line to indicate whether the line is brought by the main thread or the helper thread or otherwise invalid, as depicted in Fig.1. Actually, another field named *inflightThreadId* is added to each LLC line to indicate whether the line is being brought by the main thread or the helper thread to assist tracking late requests.

c) *Helper Thread LLC request victim state tracking:* In order to track victims replaced by helper thread requests, we need to add an LRU cache named *Helper Thread Request Victim Cache (HTRVC)* to maintain the LLC lines that are evicted by helper thread requests. As shown in Fig.1, the HTRVC has the same structure of the LLC, but there is no direct mapping between LLC lines and HTRVC lines. One field called *HTRequestTag* is added to HTRVC to enable reverse lookup in HTRVC by the helper thread request tag in LLC. HTRVC has the sole purpose of profiling, so it has no impact on performance.

d) *Detecting Late Helper Thread LLC Requests:* Lastly, in order to measure late helper thread requests, we need to identify the event when a main thread request hits to an LLC line which is being brought by an in-flight helper thread request coming from the upper level cache. This can be accomplished by monitoring the LLC Miss Status Holding Register (MSHR). MSHR is a hardware structure that keeps track of all in-flight memory requests. An helper thread LLC request is late if a main thread LLC request for the same address is generated while the helper thread LLC request is in the LLC MSHR waiting for main memory.

**2) Algorithms for Tracking Helper Thread LLC Requests and Victims:** There are two following invariants that should be maintained between LLC and HTRVC per set

- 1) Number of helper thread Lines in the LLC Set = Number of Victim Entries in the HTRVC Set;
- 2) Number of Victim Entries in HTRVC Set + Number of Valid main thread LLC Lines in Set  $\leq$  LLC Set Associativity.

```

//Case 1
if(requesterIsHelperThread && !hitInLLC && !hasEviction) {
    llc.setHelperThread(set, llcLine.way);
    htrvc.insertNullEntry(set);
}
//Case 2
else if(requesterIsHelperThread && !hitInLLC && hasEviction
&& !lineFoundIsHelperThread) {
    llc.setHelperThread(set, llcLine.way);
    htrvc.insertDataEntry(set, llcLine.tag);
}
//Case 3
else if(requesterIsHelperThread && !hitInLLC && hasEviction
&& lineFoundIsHelperThread) {
}
//Case 4
else if(!requesterIsHelperThread && !hitInLLC &&
hasEviction && lineFoundIsHelperThread) {
    llc.setMainThread(set, llcLine.way);
    htrvc.invalidateVictimLine(set, wayOfVictimLine);
}

```

Figure 4. Actions Taken When Inserting an LLC Line

Helper thread lines refer to the LLC lines that are brought by helper thread requests. From the above two invariants, we can easily conclude that: Number of helper thread Lines in the LLC Set+ Number of Valid main thread LLC Lines in Set  $\leq$  LLC Associativity. Actions should be taken in LLC and HTRVC when filling an LLC line and servicing an incoming LLC request either from the main thread or the helper thread.

a) *Actions taken on Inserting an LLC Line:* When filling an LLC line, we should consider four cases

- 1) An helper thread request evicts an INVALID line. In this case, no eviction is needed;
- 2) An helper thread request evicts an LLC line which is previously brought by a main thread request;
- 3) An helper thread request evicts an LLC line which is previously brought by a helper thread request;
- 4) An main thread request evicts an LLC line which is previously brought by a helper thread request.

In the above last three cases, eviction is needed to make room for the incoming helper thread or main thread request. Specific actions taken on the above four cases are listed in Fig.4, where hitInLLC indicates whether the request hits in LLC or not; requesterIsHelperThread indicates whether the request comes from helper thread or not; hasEviction indicates whether the request needs to evict some data; lineFoundIsHelperThread indicates whether the LLC line found is brought by helper thread or not.

b) *Actions taken on Servicing an Incoming LLC Request:* When servicing an incoming LLC request, either hit or miss, we should consider four cases:

- 1) LLC miss and victim hit, which indicates a bad helper thread request. This happens when helper thread request evicts useful data;
- 2) Helper thread LLC hit, which indicates a good helper thread request. This happens when helper thread requested data is hit by main thread request before evicted data;

```

//Case 1
if(!mainThreadHit && !helperThreadHit && victimHit) {
    badHelperThreadRequests++;
    htrvc.clearVictimLine(set, victimLine.way);
}
//Case 2
else if(!mainThreadHit && helperThreadHit && !victimHit) {
    llc.setMainThread(set, llcLine.way);
    (timely or late)HelperThreadRequests++;
    htrvc.invalidateVictimLine(set, wayOfVictimLine);
}
//Case 3
else if(!mainThreadHit && helperThreadHit && victimHit) {
    llc.setMainThread(set, llcLine.way);
    htrvc.invalidateVictimLine(set, wayOfVictimLine);
}
//Case 4
else if(mainThreadHit && !helperThreadHit && victimHit) {
    htrvc.clearVictimLine(set, victimLine.way);
}

```

Figure 5. Actions Taken When Servicing an LLC Request

- 3) Helper thread LLC hit and victim hit. This happens when useful data is evicted and brought back in by helper thread request;
- 4) Main thread LLC hit and victim hit. This happens when useful data is evicted and brought back in by helper thread request and hit to by main thread request;

Specific actions taken on the above four cases are listed in Fig.5, where mainThreadHit indicates whether the request comes from main thread and hits in the LLC; helperThreadHit indicates whether the request comes from helper thread and hits in the LLC; and victimHit indicates whether the request comes from main thread and hits in the HTRVC.

## IV. EXPERIMENTAL RESULTS

### A. Basic Results

Here we assume the shared L2 cache is partitioned between different workloads on the CMP. Thus in the following discussion, the varying L2 size refers to the size of the effective partition of L2 cache that is assigned to the running of our workload, mst baseline version or mst helper threading version where the total L2 size is fixed at 2 MB. Tab.II shows the overall performance of mst benchmark baseline version, in which L2 size is varied from 96 KB to 2 MB and L2 associativity is varied from 2 to 16, respectively. In Tab.II (a), we can see that when the L2 size is greater than 128 KB, there is no difference in execution time and there is no eviction observed in the L2 cache, implying the working set of mst “2048 1” with helper threading switched off is near 128 KB. L2 sizes larger than 128 KB contribute little to the overall performance. Tab.II (b) shows that the execution time is insensitive to the L2 associativity when the latter is greater than 4. Trivial speedups are observed in these basic experiments of mst benchmark baseline versions, which is however in contrast to the results observed in mst helper threading versions as we will discuss shortly after.

Tab.III shows the overall performance of mst benchmark helper threading version, in which L2 size is varied from 96



Table II  
MST BASELINE PERFORMANCE

L2 Size	L2 Assoc	Total Cycles	Speedup	IPC	Main Thread Hit	Main Thread Miss	L2 Hit Ratio	L2 Evictions	L2 Occupancy Ratio
96 KB	8	4001166684	1.0000	0.2100	14562	12695429	0.0010	943	0.4300
128 KB	8	4001145025	1.0000	0.2100	14560	12695141	0.0010	0	0.4390
256 KB	8	4001145025	1.0000	0.2100	14560	12695141	0.0010	0	0.2190
512 KB	8	4001145025	1.0000	0.2100	14560	12695141	0.0010	0	0.1100
1 MB	8	4001145025	1.0000	0.2100	14560	12695141	0.0010	0	0.0550
2 MB	8	4001145025	1.0000	0.2100	14560	12695141	0.0010	0	0.0270

(a) Impact of L2 Size

L2 Size	L2 Assoc	Total Cycles	Speedup	IPC	Main Thread Hit	Main Thread Miss	L2 Hit Ratio	L2 Evictions	L2 Occupancy Ratio
96 KB	2	4005695559	1.0000	0.2100	17289	12764949	0.0010	683068	0.4130
96 KB	4	4001435947	1.0011	0.2100	14561	12707953	0.0010	47911	0.4280
96 KB	8	4001166684	1.0011	0.2100	14562	12695429	0.0010	943	0.4300
96 KB	16	4001147526	1.0011	0.2100	14561	12695163	0.0010	135	0.5200
96 KB	32	4001145232	1.0011	0.2100	14560	12695141	0.0010	10	0.5790

(b) Impact of L2 Associativity

Table III  
MST HELPER THREAD PERFORMANCE

L2 Size	L2 Assoc	Lookahead	Stride	Total Cycles	Speedup	IPC	Main Thread Hit	Main Thread Miss	L2 Hit Ratio	L2 Evictions	L2 Occupancy Ratio	Helper Thread Hit	Helper Thread Miss	Redundant MSH R	Redundant Cache	Time	Late	Bad	Ugly
96 KB	8	20	10	33237364910	1.0000	0.2990	4105024	8920817	0.2000	1573304	0.6071	198931	8329835	112374	1876940	387034	6640	126631	862381
128 KB	8	20	10	32766854224	1.0140	0.3030	4213878	8742330	0.2060	36670	0.4860	191836	8220627	340	191496	3983129	4482	47	694
256 KB	8	20	10	32766374224	1.0140	0.3030	4213991	8740350	0.2060	10080	0.2590	191867	8220537	327	191540	3983311	4436	40	536
512 KB	8	20	10	32766227034	1.0140	0.3030	4214152	8739942	0.2060	0	0.1510	191919	8220284	359	191560	3983445	4413	0	620
1 MB	8	20	10	32766227034	1.0140	0.3030	4214152	8739942	0.2060	0	0.0760	191919	8220284	359	191560	3983445	4413	0	1193
2 MB	8	20	10	32766227034	1.0140	0.3030	4214152	8739942	0.2060	0	0.0380	191919	8220284	359	191560	3983445	4413	0	1591

(a) Impact of L2 Size

L2 Size	L2 Assoc	Lookahead	Stride	Total Cycles	Speedup	IPC	Main Thread Hit	Main Thread Miss	L2 Hit Ratio	L2 Evictions	L2 Occupancy Ratio	Helper Thread Hit	Helper Thread Miss	Redundant MSH R	Redundant Cache	Time	Late	Bad	Ugly
96 KB	2	20	10	33757280530	1.0000	0.2960	3808745	9339129	0.1830	4490549	0.5290	214714	8570405	28156	186558	3570356	6552	16219	1939057
96 KB	4	20	10	33538196525	1.0060	0.2980	3952682	9111809	0.1910	2851592	0.5700	206181	8457461	20359	185822	3717897	4777	21284	1351399
96 KB	8	20	10	33237364916	1.0150	0.2990	4105024	8920817	0.2000	1573304	0.6071	198931	8329835	112374	1876940	387034	6640	126631	862381
96 KB	16	20	10	32772324221	1.0300	0.3030	4215025	8749887	0.2060	516540	0.6440	192352	8225356	443	191909	3984572	4566	30	3500
96 KB	32	20	10	32766634222	1.0300	0.3030	4214238	8740076	0.2060	6950	0.6460	191949	8220386	350	191599	3983459	4459	4	63

(b) Impact of L2 Associativity

KB to 2 MB and L2 associativity is varied from 2 to 16, respectively. In Tab.III (a), we can see that when the L2 size is greater than 512 KB, there is no difference in execution time and no eviction observed in the L2 cache, implying the working set of mst “2048 1” with helper threading switched on is near 512 KB. L2 sizes larger than 512 KB contribute little to the overall performance. Tab.III (b) shows that the execution time is reduced slightly as the L2 associativity is increased from 2 to 32. The presence of helper threading increases the working set of mst “2048 1” from 128 KB in the baseline version to 512 KB, and also incur much more conflict misses. The number of bad prefetches is reduced from 3M to zero when L2 size is increased from 96 KB to 512 KB (the working set limit). The increase of L2 associativity can also reduce the number of bad prefetches as well. We can see that bad

prefetches are in the forms of capacity and conflict misses in this scenario. About 1%-3% reductions of execution time are achieved in these basic experiments of mst benchmark helper threading versions.

Overall, low IPCs are observed among the experiments shown in II and III, which is due to the inefficiency of LRU replacement policy adopted in the shared L2 cache to accommodate the irregular thrashing access pattern exposed by mst, as we discussed previously. A maximum 22% reduction of execution is achieved when the lookahead is 20 and stride is 10 under L2 size greater than 512MB and L2 associativity greater than 16, between baseline and helper thread versions of mst in these basic experiments, which shows our implemented helper threading scheme is non-trivially effective for the mst benchmark.

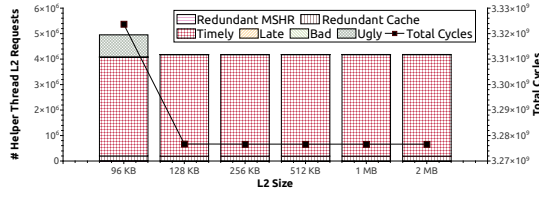


Figure 6. Impact of L2 Size on mst Helper Thread L2 Request Breakdown and Execution Time (lookahead=20, stride=10)

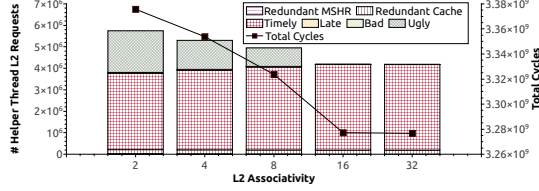


Figure 7. Impact of L2 Associativity on mst Helper Thread L2 Request Breakdown and Execution Time (lookahead=20, stride=10)

### B. Impact of L2 Size

Fig.6 shows the normalized execution times in cycles and helper thread L2 request breakdown for the mst helper threading version when the L2 size is increased from 96 KB to 2 MB. For clarity, execution times are normalized to the first case in the figure where L2 size is 96 KB. The 128 KB working set limit of mst “2048” helper threading version is reiterated. A few ugly helper thread L2 requests are observed when the L2 size is as small as 96 KB, which results from where the helper thread first prefetch some potentially useful data into the L2 cache, but due to the limited capacity of the L2 cache, these data are evicted too early from the L2 cache before the main thread uses them.

### C. Impact of L2 Associativity

Fig.7 shows the normalized execution times in cycles and helper thread L2 request breakdown for the mst helper threading version when the L2 associativity is varied from 2 to 16. For clarity, execution times are normalized to the first case in the figure where L2 associativity is 2. A few ugly helper thread L2 requests are observed when the L2 associativity is smaller than 16, which results from where the helper thread first prefetch some potentially useful data into the L2 cache, but due to the limited associativity of the L2 cache, these data are evicted too early from the L2 cache before the main thread uses them. One important point to notice is that, a few redundant hit-to-cache helper thread L2 requests are constantly observed among the experiments shown in Fig.6 and Fig.7, which implies the helper thread is sometimes initiated too late to prefetch the data, as the data is already put in the L2 cache by the main thread, thus leading to the waste of cache resource and on-chip interconnect bandwidth. This deficiency can only be improved by fine-tuning the helper threading program code, which is out of the scope of this work.

### D. Impact of Prefetching Lookahead

In the below presentation of extended experiments, we discuss how the helper threading parameters of lookahead and stride interact to change the breakdown of helper thread L2 requests and thus affect the overall performance. Below we see how the two parameters lookahead and stride of the helper threading scheme affect the helper thread L2 request breakdown and thus the overall performance. Fig.8 shows the normalized execution times in cycles and helper thread L2 request breakdown for the mst helper threading version when the lookahead is varied from 10 to 320. For clarity, execution times are normalized to the first case in the figure where the lookahead is 10. We can see that when the stride is less than 40, the execution time increases monotonically as the lookahead is increased from 10 to 640. But this is not the case when the stride is greater than 40, where the maximum reduction in execution time is achieved in the middle value of the lookahead.

We must note that when the lookahead is small and the stride is large, there is a large portion of late helper thread L2 requests which can be explained intuitively as the helper thread skips too little in the prelude and prefetches too much in the stable state to keep running ahead of the main thread to fetch the data. Too much late prefetches do great harm to the performance improvement of helper threading. In the other hand, when the lookahead is increased from 10 to 320 and the stride is large, the number of timely helper thread L2 requests diminishes, which implies the helper thread does too little prefetching work to provide tangible overall performance improvement.

### E. Impact of Prefetching Stride

From Fig.9, we can see the relationship between the values of stride and the overall performance varies under different values of lookahead:

- 1) When the lookahead is less than 40, the execution time increases monotonically as the stride is increased from 10 to 640. It can be obviously interpreted as the harmful impacts of the increasing prohibitively large portion of late prefetches;
- 2) When the lookahead are 40 and 80, the greatest speedups are achieved when the stride is in the middle values of 80 and 320, respectively. It reflects the ongoing battle between the positive and negative performance gains from timely and late helper thread prefetches, respectively;
- 3) When the lookahead is greater than 160, the number of late helper thread prefetches diminishes to zero. This can be explained as the large value of lookahead in the prelude prevents the helper thread from lagging behind the main thread in the stable state. However, in this case, the execution time increases monotonically again as the value of lookahead becomes greater.



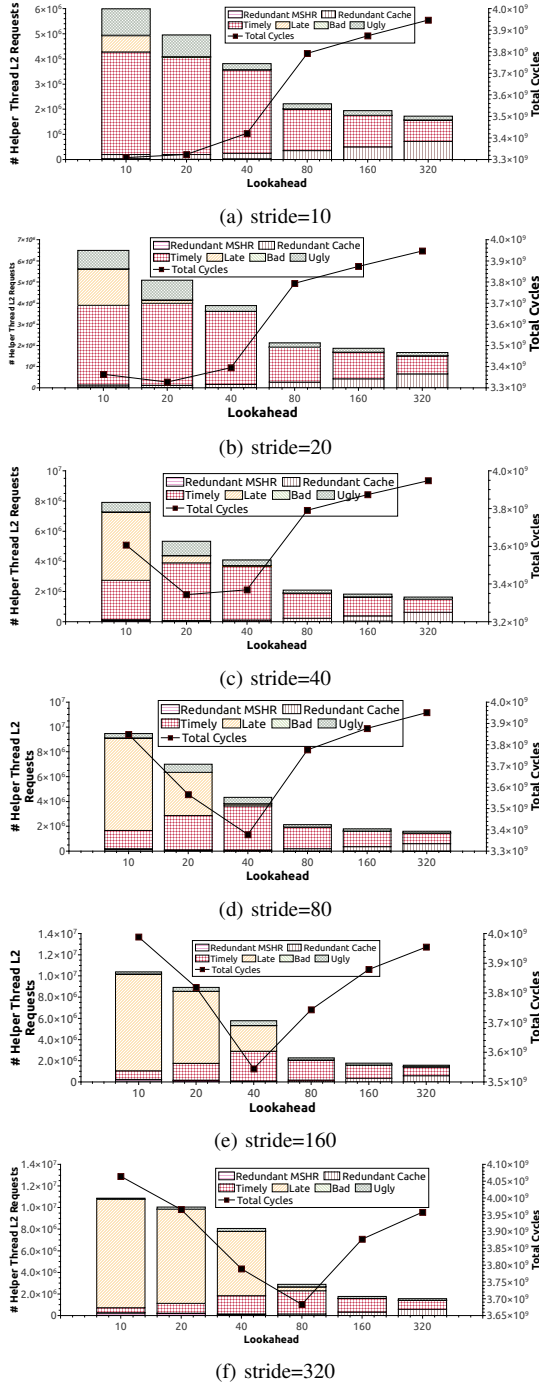


Figure 8. Impact of Prefetching Lookahead on mst Helper Thread L2 Request Breakdown and Execution Time

### F. Selecting Proper Values of Prefetching Lookahead and Stride

Furthermore, among the experiments exhibited in Fig.8, there exists an optimal value of lookahead, where values of lookahead both greater and smaller than that lead to lesser timely and greater late requests, thus lowering the overall performance. The position of optimal value of lookahead varies depending on the value of stride. Specifically, the optimal value of lookahead becomes greater as the value of stride increases. Among our experiments of mst "2048 1",

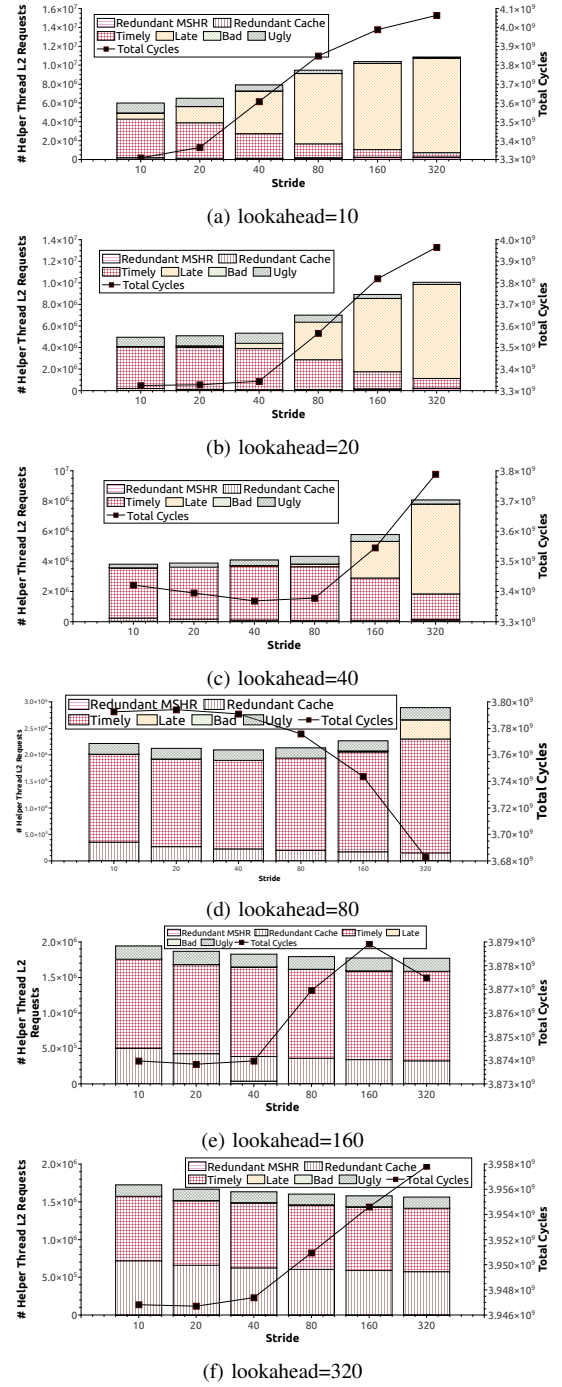


Figure 9. Impact of Prefetching Stride on mst Helper Thread L2 Request Breakdown and Execution Time

the combination of small values of lookahead=20, stride=10 achieves the maximum performance, which fits well to our above observation. The helper threading parameters of lookahead and stride should and can be dynamically changed to balance the portions of timely and late prefetches using feedback directed mechanisms, thus leading to the maximal performance of helper threading on CMPs. There is little bad prefetches observed in our experiments on mst "2048 1", but it is expected to be prevalent in larger input set of the mst benchmark and other memory-intensive workloads. Furthermore, very little hit-to-cache and hit-to-MSHR prefetches are

observed which show that they are minorities in the breakdown of helper thread L2 requests, and do little impact on overall performance.

## V. RELATED WORK

### A. Prefetch Breakdowns

Even though helper threading mechanisms have been studied for a long time, LLC interference and breakdown of helper thread LLC requests have not been studied before. Here we briefly describe previous work in the context of hardware prefetching. Our breakdown of helper thread LLC requests is mostly similar to the work in [6], which presented a taxonomy of hardware prefetches based on the idea of shared cache pollution in the hardware based data prefetching for shared L2 CMP. A hardware structure called the *Evict Table* (ET) is attached to the LLC to gauge the amount of shared cache pollution caused by hardware prefetching. The HTRVC in our proposal is similar to the evict table, however it is used for tracking helper thread request victims instead of hardware prefetch victims. Good, bad and ugly requests are identified based on cache replacement activities involved by hardware prefetches. [7] took the bandwidth consumption into account, and developed a multiprocessor prefetch traffic and miss taxonomy that builds on an existing uniprocessor prefetch taxonomy.

### B. Prefetch Aware Cache Content Management

The problem of cache content management in the presence of data prefetching, are studied in the previous works in the forms of software [8], hardware [9], [10] and hybrid [4]. [11] proposed a prefetch buffer that can be attached to the L2 cache to filter the prefetched data from polluting the L2 cache, which is similar to but different from our proposed HTRVC cache structure whose sole function is for profiling helper thread L2 requests' victims. [12] characterized the performance of state-of-the-art LLC management policies in the presence and absence of hardware prefetching. Prefetch-Aware Cache Management (PACMan) was proposed to dynamically estimates and mitigates the degree of prefetch-induced cache interference by modifying the cache insertion and hit promotion policies to treat demand and prefetch requests differently. [13] proposed a low-cost feedback directed mechanism for hardware prefetching. The mechanism can be applied to any hardware prefetchers such as sequential prefetchers, stream-based prefetchers, GHB based prefetchers and PC-based stride prefetchers.

## VI. CONCLUSION

For big data-crunching workloads exhibiting irregular memory access patterns in the era of data intensive computing, this paper first discusses the intra-application reuse distances in the helper threading on shared cache CMPs and their implications on helper thread performance. Based on this, we then proposes the intra-application interference aware breakdown of helper thread LLC requests and its implementation details on a cycle-accurate CMP architectural simulator. Detailed experimental

results of the memory intensive benchmark mst show that: (1) there exists an optimal value of lookahead, where values of lookahead both greater and smaller than that lead to lesser timely and greater late requests, thus lowering the overall performance. The position of optimal value of lookahead varies depending on the value of stride; (2) too much late prefetches do great harm to the performance improvement of helper threading. The helper threading parameters of lookahead and stride should and can be dynamically changed to balance the portions of timely and late prefetches, thus leading to the maximal exploitation of helper threading in improving the performance of irregular memory access workloads on shared cache CMPs. It can be part of our future work.

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