

# ECAP:Energy Efficient CACHing for Prefetch Blocks in Tiled Chip MultiProcessors.

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## Abstract:

With the increase in processing cores performance have increased, but energy consumption and memory access latency have become a crucial factor in determining system performance. In Tiled Chip MultiProcessor, the tiles are interconnected using a network and different application runs in different tiles. Non-uniform load distribution of applications result in varying L1 cache usage pattern. Application with larger memory footprint uses most of its L1 cache. Prefetching on top of such application may cause cache pollution by evicting useful demand blocks from the cache. This generates further cache misses which increases the network traffic. Therefore, an inefficient prefetch block placement strategy may result in generating more traffic that may increase congestion and power consumption in the network. This also dampens the packet movement rate which increases miss penalty at the cores thereby affecting Average Memory Access Time (AMAT). We propose an energy efficient caching strategy for prefetch blocks, ECAP. It uses the less used cache set of nearby tiles running light applications as virtual cache memories for the tiles running high applications to place the prefetch blocks. ECAP reduces AMAT, router and link power in NoC by 23.54%, 14.42%, and 27%, respectively as compared to the conventional prefetch placement technique.

## 1 Introduction

With the advancement towards green computing, it is important to design multicore architectures that can provide efficient power savings and enhanced system performance with minimal hardware overhead. Advancements of CMOS technology enabled in an increase of computational units to be placed in the same chip area known as Chip MultiProcessor (CMP). Though transistor scaling has enabled an increase in computational units but the power consumed by the other on-chip units is no more negligible. Hence, the design choice has now been shifting its focus in developing energy-aware architectures satisfying the needs of modern data-intensive applications.

For processors like Intel Xeon-Phi [1], Tiler TILEPro [2] architectures, the processors are organized as tiles and each tile consists of an out-of-order superscalar processor (core), a private L1 cache and a slice of shared L2 cache. Such architectures are also called as Tiled CMP (TCMP) [3]. The L2 cache is inclusive, and it is equally divided among all the tiles. Each such slice of L2 cache is called a bank. The tiles are arranged in a mesh topology and interconnected by an underlying Network on Chip (NoC) [4, 5] as shown in

Figure 1. A conventional NoC consists of routers and bi-directional links that communicates cache block request (cache misses) and cache block reply (data) as packets. The packets are further divided into multiple flits with each flit size equal to the inter-router link bandwidth. All cache miss request and replies are carried to the destination tile as per the SNUCA bank mapping policy [6].

As shown in Figure 2, different application in TCMP runs at different cores with individual data requirements. The cache block demand and cache access pattern of the application varies across the cores. Such a distributed system provides high-throughput computing [3]. But in these systems, data communication and on-chip interconnect has become a costly affair in terms of energy consumption [7, 8]. Therefore in TCMPs, a high throughput and energy efficient communication backbone is must to achieve a better system performance.

All tile to tile communication in TCMP travels through the NoC as either cache miss request, cache block reply or coherence packets. Miss penalty of a cache miss can be estimated in traditional CMPs having monolithic L2 cache. But in TCMPs, miss penalty consists of memory access latency of L2 cache bank and the round trip network latency between the respective tiles. The round trip network

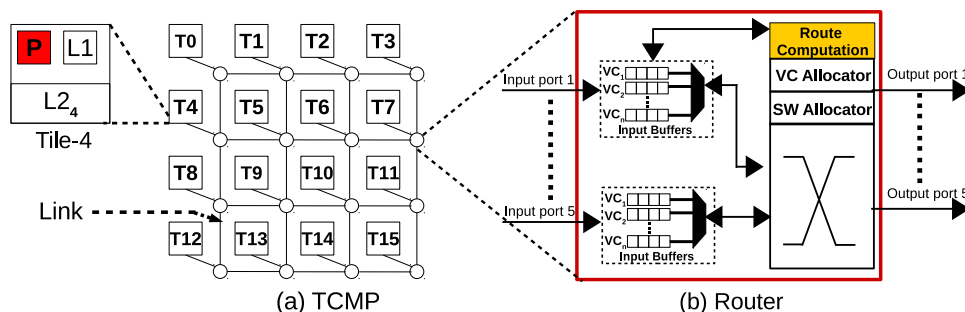


Fig. 1: a) 4x4 TCMP. b) Router in NoC

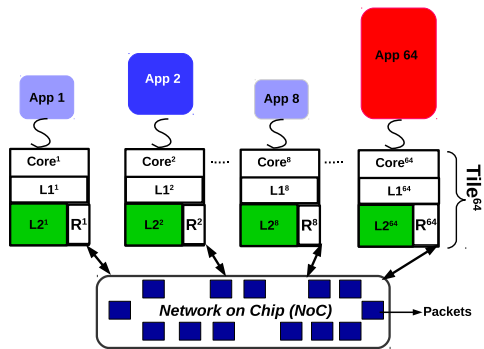


Fig. 2: Different application running at different cores in TCMP.

latency in such a scenario depends on the network congestion. Hence in TCMP, the network contributes in miss penalties occurring during cache misses which in turn regulates the average memory access time (AMAT). Reduction of AMAT is imperative in achieving high throughput. This is possible if the underlying NoC provides a low latency communication backbone for packet movement. Since the NoC characteristic changes dynamically based on the network traffic status, prefetching comes handy in this regard.

Prefetching is a technique that helps in hiding the long memory access latency and the underlying network latency by speculatively bringing cache blocks for future use [9–16]. A prefetch engine monitors the runtime activities of cache access pattern by the core. Upon observing a pattern, the prefetch engine fetches the desired block into the cache for later use. Since in TCMP, the L2 cache is distributed among all the tiles, the cache access pattern is also distributed across them. Therefore in TCMP, the prefetch engine is trained using the L1 cache access patterns which is local to each tile.

In TCMP, an enormous amount of energy and power is consumed by the underlying NoC, after the cores. NoC consumes around 28% of each tile-power in Intel-Teraflop chip [17] and 36% in MIT-RAW chip [18]. NoC being the bottleneck in inter-tile communication, the energy and power consumed by NoC has become a major concern. The power consumption in NoC can be classified into two categories: static power and dynamic power. Static power is mostly consumed by buffers (Virtual Channels, VC) in the router as shown in Figure 1(b). On the other hand, dynamic power is consumed due to switching activity per cycle which occurs during transmitting a flit from an upstream router to a downstream router. Hence, reducing the number of packets will result in reducing network congestion as well as reduction in the static and dynamic power consumption in NoC.

In a prefetch enabled cache, there are two types of blocks: Demand, and Prefetch blocks. Demand blocks are fetched when the processor requests for them and prefetch blocks are fetched ahead of its use. In conventional prefetching, the prefetch block is placed in the local cache (L1 or L2) of the requesting core. In this paper, we call such prefetch block placement as Source Core Placement (SCP). In SCP, placing a prefetch block may result in evicting a useful demand block from the cache location where it is placed. Thus, the speculative nature of a prefetcher can pollute the cache which triggers frequent cache block replacements [10]. In TCMP, cache replacement increases the network packets which in turn increases power consumption in NoC. There are many notable techniques that focuses in reducing power consumption in NoC like Dynamic Voltage Frequency Scaling (DVFS) [19], Bufferless NoC [8, 20, 21], Packet Compression [22]. Thus taking this into account, we propose a prefetch block placement technique which can prefetch aggressively as in L2 cache and achieves a faster cache access time as that of an L1 cache.

This paper proposes to increase the L1 cache size virtually at run-time. Increase in cache size will result in placing more prefetch blocks which in turn will reduce cache misses. Reduction in cache misses will also reduce network packets. Hence, we build an Energy

efficient Caching strategy for Prefetch blocks (ECAP) in TCMPs by reducing the number of network packets and AMAT during cache misses. ECAP uses the fact that applications running in each tile has different cache miss rates. For application experiencing heavy misses, it may happen that the L1 cache size is not sufficient to hold the working set size. Prefetching in such cases may harm the application performance by causing severe cache pollution. To reduce cache pollution, ECAP uses an intelligent prefetch block placement strategy at the L1 caches of neighboring tiles that has less used cache sets. This helps in virtually increasing the L1 cache size without harming the useful demand blocks of that application. ECAP also reduces the number of network transactions by reducing cache pollution and also providing the extra storage options for the prefetch blocks.

We evaluate ECAP using out-of-order simulations with gem5 [23], booksim [24] simulator and multi-programmed workloads from SPEC CPU 2006 benchmark suite [25]. We compare ECAP with the baseline prefetch block placement technique (see Section 4 for more details). The result shows that ECAP is capable of having power savings in the network routers and links by around 14.42%, and 27%, respectively over the other techniques in a 64-core system. Moreover the average memory access time in ECAP is reduced to 23.56% with respect to the baseline prefetch block placement technique. It incurs only a small hardware overhead per tile with a power savings in the NoC for tile-to-tile communication.

Additional experimental result confirms that ECAP performs fairly well for a wide variety of system parameters as described in section 4. Therefore, by virtually increasing cache size with minimal hardware overhead, can result in achieving enhanced system performance with reduced energy and power consumption. This results in addressing the following questions:

- How does ECAP searches less used space in adjacent tiles?
- How is a prefetch block located when it is placed in adjacent tiles?
- How does ECAP helps in achieving reduced network transactions?
- What are the hardware overheads involved in ECAP?

This paper addresses the above queries in the subsequent sections. Section 2 provides the motivation behind this work. Section 3 describes the proposed technique, ECAP followed by a detailed experimental analysis in Section 4. Section 5 analyses the sensitivity of different parameters that determines the best performance of ECAP. Section 6 contains the hardware aspect of our proposed technique. Section 7 presents the related work done in this regard and finally the paper is concluded in Section 8.

## 2 Motivation

Some important terms used in this paper are defined as follows:

**Target-set:** The target-set of a block in a cache indicates the set index in the cache where the block is mapped.

**Home cache:** In TCMP, when a core  $c$  associated with a tile  $T_c$  requests for a block  $b$ , then the private L1 cache of  $T_c$  is considered as the home cache for the block  $b$ .

**Remote cache:** In TCMP, for a block  $b$ , the neighboring (one-hop distant neighbors) L1 caches of its home cache are considered as remote cache.

We use next-line prefetcher as the baseline prefetching technique. This prefetcher on a cache miss for a block  $b$  initiates a prefetch request for the next sequential block  $(b + 1)$ , if it is not already present in the cache. If the target-set of cache block  $b$  is  $I$ , then next-line prefetcher fetches the block  $(b + 1)$  and places it in  $I + 1$ .

We model a 64-core TCMP in gem5 [23] running real workloads from the SPEC CPU 2006 benchmark suite [25]. The workloads are generated by choosing different benchmarks with various cache footprints. Figure 3 shows the tile-wise distribution of L1 cache misses in a 64-core TCMP enabled with next line prefetcher. We can observe that the number of L1 cache misses vary significantly across the cores. This is due to the diversity in cache footprints of applications running on these cores.

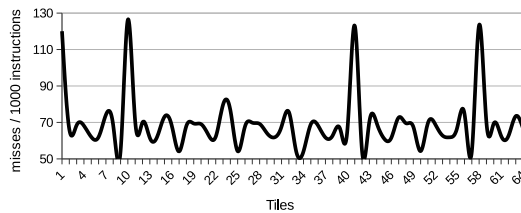


Fig. 3: Distribution of L1 cache misses per tile.

We categorize the applications into high and low based on the number of L1 cache misses. For high applications, the working set size is much larger than the available L1 cache size. Such applications suffer from cache space constraints resulting in an increase in the cache miss count. Prefetching for such applications may exacerbate the problem of cache pollution which may increase the number of cache block replacements. Each cache block replacement contributes to a network transaction, leading to increase in network traffic. Moreover, the evicted cache blocks may be subsequently re-requested by the cores. This can further lead generation of additional cache block request and reply packets. Light applications on the other hand, may under-utilize the available L1 cache space. This may occur in two cases: 1) L1 cache space is sufficient to hold the working set of the application. 2) application exhibit more temporal locality than spatial locality. For such applications, the available L1 cache space may remain under-utilized resulting in cache space wastage.

Figure 4 shows the frequency of set access pattern in L1 cache averaged across all the tiles in a 64-core TCMP enabled with next line prefetcher. This statistics are collected for a time window of 10K cycles after performing sufficient fast forwarding to eliminate cold misses. We can observe that the cache access pattern is non-uniformly distributed across the cache sets. Some of the sets are heavily used while some of them are lightly used. Thus, we can conclude that some applications under-utilize their cache space. Few cache sets of such cores can be utilized by the neighboring cores running high applications for which either the cache is of insufficient size or has higher miss rates. Hence, a high application can utilize the lightly used cache sets of other cores to temporarily accommodate its prefetch blocks.

This motivated us to propose ECAP that increases the cache size of high applications as per its need. Further, it reduces cache miss and cache pollution for high applications. It has an incremental effect in reducing the number of network packets thereby reducing network congestion and power consumption in NoC. Reducing network congestion has a direct impact in reducing network latency which is responsible in reducing the AMAT of cache misses in the cores. Thus, the throughput of the core increases resulting in improved system throughput.

### 3 Energy efficient Caching of Prefetch blocks (ECAP)

ECAP is a placement strategy for prefetch cache blocks in a TCMP system. When an L1 cache miss occurs at a core, a request packet is sent from the source tile to the L2 cache bank where the block is mapped. The L2 cache bank sends the demand block as well as the next sequential block (prefetch block) as reply packets to the source tile. Upon reaching the source tile, the demand block is placed in the target-set of its home cache. Our proposed technique ECAP finds the most suitable location to place the prefetch block.

Considering the L1 cache access time, the first suitable location to place a prefetch block is the target-set in its home cache. But if the target-set in the home cache is heavily used then placing a prefetch block there may result in evicting a useful demand block thereby causing cache pollution. Therefore, ECAP then tries to search for a lightly used target-set in the remote cache of its

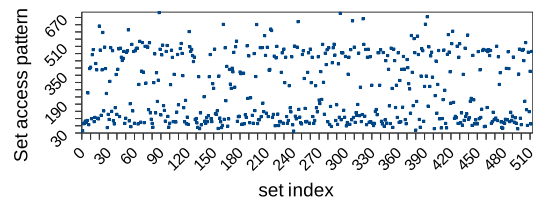


Fig. 4: Cache set access behavior during execution of workloads from SPEC CPU 2006 benchmark suite.

neighboring tiles. Subsection 3.1 explains this searching procedure in detail. The prefetch block is stored in the suitable remote cache upon finding a lightly used target-set. Some meta data is stored in the home cache of the prefetch block which gives the information of prefetch cache blocks placed in the remote caches. A detailed description of the meta data storage is explained in subsection 3.2. If no suitable target-set is found in a remote cache, ECAP uses a special buffer called as Prefetch Buffer Pool (PBP) in each local tile to accommodate few such prefetch blocks.

Figure 5(a) shows a 4x4 TCMP where tile 6 is running a high application. The illustration of ECAP technique is described as follows. ECAP initially explores the possibility of placing a prefetch block brought during a cache miss by tile 6 at its home cache itself. If ECAP could not place the prefetch block in the target-set of its home cache (due to heavy usage of the existing cache blocks already present in the target-set) then it explores the possibility of finding a suitable remote cache. ECAP searches for a lightly used target-set in the remote caches i.e., tile 2, 5, 7, and 10. If none of the target-set is lightly used, ECAP uses the PBP of local tile i.e., tile 6 to place the prefetch block.

For prefetch block placement the remote caches are limited to one hop distance only from the home cache. This is to reduce the traffic in NoC. It also reduces the cache access time when there is a hit in the remote cache. On a hit in remote cache, the prefetch block is placed in its home cache and the corresponding meta data is updated accordingly. The block searching mechanism in ECAP is explained in detail at subsection 3.3. Throughout the paper we use the term “adjacent” and “neighbor” interchangeably to indicate tiles that are at one hop distance away from the source tile.

SCP and ECAP are not prefetch engines. A prefetch engine speculates the cache access pattern of an application. But SCP and ECAP only uses caching strategy to place prefetch blocks in a cache (remote or home). Hence both SCP and ECAP can be implemented on top of any prefetchers like stream, correlating prefetchers [14, 26]. If ECAP is implemented, an L1 cache block can be classified into one among the four categories:

- **Invalid Blocks (I):** These are unused blocks.
- **Demand Blocks (D):** These blocks contain words that are fetched on a cache miss by the local core.
- **Local Prefetch Blocks (P):** These blocks contain words that are prefetched on a cache miss by the local core.
- **Satellite Blocks (S):** These blocks contain words that are prefetched on a cache miss by one of the adjacent core.

#### 3.1 Searching for a target-set in adjacent tiles.

Once the prefetch request is sent to the L2 cache tile, searching for a suitable target-set in remote caches is done in parallel, if the target-set of the home cache is heavily used. ECAP adopts a simple neighbor searching scheme for prefetch block placement at remote caches. The source core searches for a suitable target-set in the remote caches. This is done by sending probe packets to one hop neighbors of the source core.

For prefetch block placement at remote caches, ECAP uses two policies: (a) Prefetch block placement policy, and (b) Cache block replacement policy. Prefetch block placement policy deals with the selection of a target-set in the remote cache. It uses the frequency

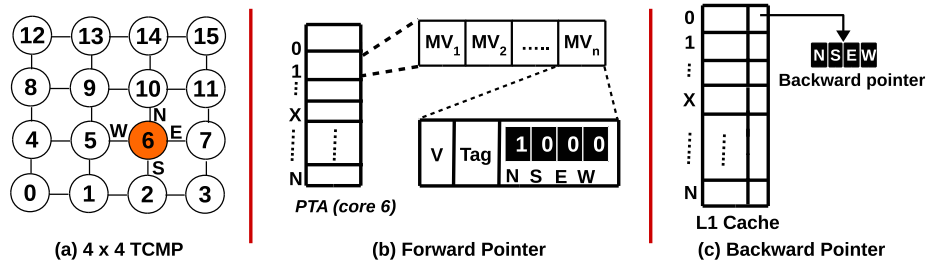


Fig. 5: Meta data storage for ECAP.

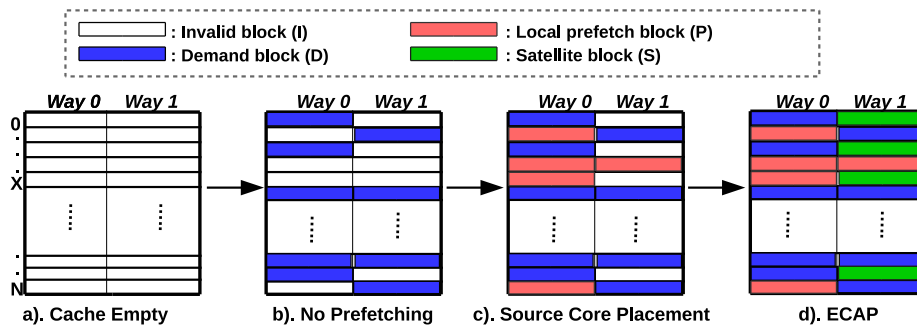


Fig. 6: Contents of cache block in different scenarios.

of set access pattern of applications running in the remote caches and classify them as either heavy or light. We define a cache set as heavy or light by counting the frequency of accesses per set within an interval of 1024 cycles. We use a 4-bit saturating counter per set with a threshold value of 12 for categorizing sets into heavy and light. The cache replacement policy proposed in ECAP is *Confidence-Aware Replacement policy* (CARP) which assigns different confidence value to the blocks present in the cache. Section 3.5 explains CARP in detail.

If one such target-set is identified, the corresponding remote cache acknowledges with a positive response to the home cache. The remote cache also books a cache way in the target-set to avoid race conditions. The satellite block upon reaching at the home cache is forwarded to the corresponding target-set in the remote cache.

### 3.2 Meta data management for satellite block mapping

For maintaining the records of satellite blocks and its subsequent management, ECAP uses *forward pointer* and *backward pointer* for each set of the L1 cache. The forward pointer is used for identifying the remote cache where the block is currently residing and the backward pointer is used to identify the owner of a cache block (local cache block or satellite block).

**3.2.1 Forward pointer:** ECAP uses an additional map per tile called as Prefetch Tag Array (PTA). The number of PTA entries is equal to the number of L1 cache set. It contains the details of all prefetch blocks placed at the remote caches. The target-set of the prefetch block in the remote cache is same as that of the home cache. Similarly, the PTA also is indexed by the same target-set. The meta data of the prefetch block is stored in PTA as shown in Figure 5(b). Each PTA index contains a set of Mapping Vectors (MV) for prefetch blocks. Since PTA index and target-set of remote cache is same, we need not store the set number in an MV.

A mapping vector contains a valid bit (V), tag bits for a prefetch block, and four flag bits for each direction (N, S, E, W). In a mesh topology, a tile is surrounded by four adjacent tiles. The direction

flag corresponds to one of the four neighbors. Since MV is used to forward a cache miss request to a remote cache, we call the mapping vector as forward pointer. In a valid MV, exactly one of the direction flags will be set. Experimentally we have found that in ECAP, each PTA index can store at most four prefetch blocks ( $n = 4$ ) for optimized system performance.

**3.2.2 Backward pointer:** As shown in Figure 6(d), an ECAP enabled cache may contain four types of blocks in its home cache i.e., Invalid block, demand block, local prefetch block, and satellite block. To indicate whether the block stored in an L1 cache belongs to itself or to a neighbor (satellite), four bit flag is used. Each flag bit corresponds to one of the four neighbors in a mesh topology. For satellite blocks, exactly one of the flag bits are set. On the other hand, for demand blocks and local prefetch blocks, none of the flag bit is set. Since the flag points back to the owner of the block, these flags are also called as backward pointers as shown in Figure 5(c).

### 3.3 Block searching and identification

In a conventional cache, whenever a core generates a request for a word, the block containing the word is searched in its home cache. For a TCMP enabled with ECAP, the block is searched in its home cache, PTA of the local tile and also PBP of the local tile in parallel. Figure 7 depicts the block searching procedure in ECAP.

If the block is a hit in its home cache, it is called as “direct hit”. On a direct hit, the word is returned to the core immediately. If the block is found either in PTA or PBP, it is called as an “indirect hit”. If the indirect-hit is from PTA, this indicates that the block is placed in a remote cache. The forward pointer in the corresponding mapping vector of the PTA index will identify the remote cache. Request packets are sent from the source tile to the remote cache tile to bring the cache block in its home cache. Upon placing the block in home cache, the backward/forward pointers are updated in the remote cache and the local PTA, respectively. Similarly on a hit in PBP, the block is removed from PBP and placed in the target-set

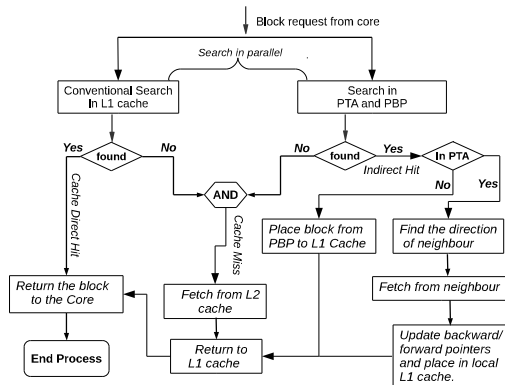


Fig. 7: Flowchart for block searching.

of its home cache. Once the block is placed in the home cache after an indirect hit, it is considered as a demand block.

### 3.4 Cache coherence management

Multicore processors can have the same data cached in the private caches of different cores. We use MESI CMP protocol for maintaining data coherence across multiple cores. Neighbor placement of prefetch blocks is hidden from the underlying coherence protocol. The actual placement of prefetch blocks is known to the L1 cache only but not to its L2 cache bank. Implementation of ECAP requires minor modification in the cache coherence protocol as described in the following example.

Example: Figure 8 shows that core 42 sends a prefetch request for a block whose L2 bank is in tile-19 as per the SNUCA block mapping policy. Consider that the prefetch block is stored as a satellite block in tile-43 with backward pointer set to tile-42. Hence, the tag address of the block is stored in the PTA of tile-42. The coherence protocol running in the system updates the block status as E (Exclusive) and owner as 42 (not tile-43). Upon receiving any request for the same block (RD/WR) from a different tile-54, the L2 bank sends a request to the current owner of the block i.e. tile-42 as per the record. Tile-42 searches for the block using block searching procedure as described above. The block search procedure results into a hit in its PTA. From the mapping vector, the location of the block is determined i.e. tile-43. Hence, tile-42 sends a request to tile-43 in order to forward the block corresponding block from tile-43 to the requesting core in tile-54. On successfully forwarding the block, tile-54 acknowledges back to the L2 bank (tile-19) and the status of the block is changed from E to S (Shared) with an addition of another owner as 54. The remote cache have no RD or WR access permission on its satellite blocks. This avoids the case of data inconsistency that may arise when the block resides in a remote cache.

### 3.5 Confidence-Aware Replacement Policy (CARP)

The simplest block replacement policy used in traditional CMPs is Least Recently Used (LRU). LRU works within each cache set to identify a victim block during cache replacement [27–29]. It exploits the reuse factor of the cache block. A newly inserted block is placed in MRU position and for every reuse of the block, it is promoted to MRU. Otherwise, the block eventually reaches the LRU position and gets evicted from the cache.

But the inherent problem of LRU is that a block once promoted to MRU position requires a longer time period to become LRU [27, 28], if the access to the cache set is very less. Hence, the demand blocks in such cache sets become dead blocks [30, 31]. A cache block is called dead if it is never accessed again before its eviction. Eviction of such blocks from the set gets delayed resulting in poor usage of critical resources like cache space. Some interesting dead block

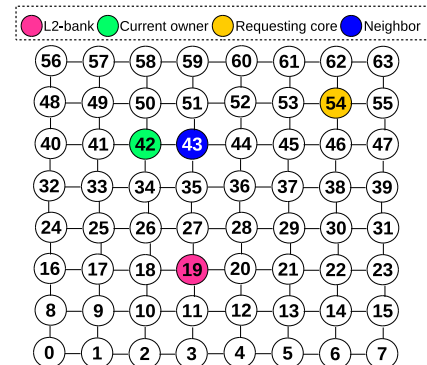


Fig. 8: Example of coherence protocol for  $8 \times 8$  2D mesh in ECAP

prediction mechanisms are already been proposed [30, 31]. Most of the existing proposals are for the Last Level Caches. We understand this limitation of conventional LRU policy and propose a new Confidence-Aware Replacement Policy (CARP) that is more suited for ECAP enabled caches.

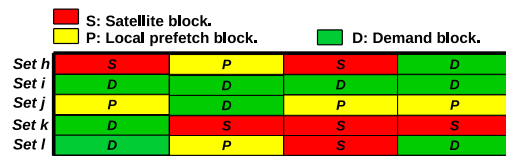


Fig. 9: Snapshot of ECAP enabled cache.

To discuss this issue in detail we have taken an example as shown in Figure 9. The figure shows the structure of a 4-way set-associative L1 cache filled with three possible type of blocks. Multiple colors are used to show the different type of blocks present in each cache set.

- **Category I:** Lightly used sets (*set i*) containing all demand blocks.
- **Category II:** Lightly used sets (*set j*) containing a combination of demand blocks and local prefetch blocks.
- **Category III:** Lightly used sets (*set h, k, l*) containing a combination of demand blocks, local prefetch blocks and satellite blocks.
- **Category IV:** Heavily used sets. These sets can also be divided into two sub categories based on the presence of local prefetch, and demand blocks. Since ECAP does not use such sets for satellite blocks, the sub-categorization is not relevant for this discussion.

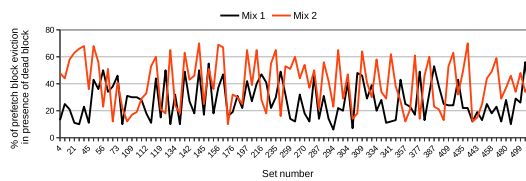
For the placement of a satellite block, ECAP may choose a lightly used set of any category i.e., I, II or III as the target-set (in a remote cache). The category shown in the figure is for a particular instance and the set behavior may change dynamically. Such a behavior of cache set is discussed in Section 3.6.

During classification of sets into heavy or low, ECAP uses the core behavior of local tile only (access by neighboring tiles are not considered). Since the cache set is lightly used by the local core, demand blocks residing in such a cache set may experience minimal access. In addition to these if LRU replacement policy is used, such cache blocks will require a longer time in demoting to LRU position (due to low access by the local core) before finally evicting from the cache. Hence, the chances of a demand block becoming a dead block is more for a lightly used set. Since prefetch blocks (both local prefetch blocks and satellite blocks) are speculatively brought into the cache for future use; such blocks are expected to experience a hit after a longer time period than a demand block. Hence, LRU replacement policy will result in demoting the prefetch blocks faster



than a demand block. For category II and III, such a dead block may result in evicting the prefetch blocks early. Therefore, LRU replacement policy may result in decreasing the effectiveness of prefetch block placement strategy used in ECAP.

Dead blocks in category IV can also create similar issues and may remove important blocks from the set. Since this work uses only the lightly used set of remote caches, CARP gives equal priority to every local block that is placed in the heavily used sets. The policy gives benefit for sets belongs to Category I, II and III. For category-IV, the policy may not improve the performance but at least gives the same performance as that of LRU.



**Fig. 10:** Percentage of prefetch blocks evicted (due to replacement policy) from a set in presence of dead block in the same set.

Figure 10 shows the percentage of prefetch blocks evicted from a cache set in presence of dead blocks. The percentage is calculated as (total prefetch blocks evicted in presence of dead blocks / total prefetch blocks evicted)\*100. The experiment is performed in an in-house stand alone cache memory simulator written in C++. In order to detect dead blocks with 100% accuracy, the program takes the traces as input and simulates the cache evictions. Without trace, the detection of a dead block with 100% accuracy is not possible as the future cache access pattern is unknown. From the figure we can observe that in most of the cache sets, the prefetch blocks are unnecessarily evicted in presence of dead blocks within the same set. Our proposed CARP handle this issues effectively. This is done by assigning different confidence values to cache blocks pertaining to different categories of cache sets (heavy / light).

A replacement algorithm has three policies: insertion, promotion and eviction. Insertion means where to place the block initially. Promotion policy deals with how to handle the block when there is a hit in the block. Replacement/eviction policy selects the victim block to be replaced from the cache.

**Table 1** Confidence values used in CARP for a lightly used set.

Block types	Confidence Value
Demand block	3
Local Prefetch block	4
Satellite block	4

### 3.5.1 Insertion, Promotion and Demotion Policy of CARP:

CARP uses a 3 bit saturating counter per block, also known as the *confidence-value* of the block. Confidence-value is used as a weight to define how important the cache block is for the local core's performance. Lower the confidence-value, lower is the reuse frequency of the cache block. During the event of cache block replacement in a target-set in remote cache, the cache block with lowest confidence value is chosen as the victim.

When a block is newly inserted to a cache set, based on the type of the block, the confidence-value is initialized with either 3 or 4. The confidence-values are decided experimentally. Whenever the cache block experiences a hit, its confidence-value is incremented. At the end of every 32 cycles also called as *window*, the confidence-value of all the blocks are decremented by one. By this process, the confidence value of dead blocks will eventually become lower than the blocks that are frequently accessed. However, the confidence-value

of those blocks that are accessed frequently keeps on increasing. This results in clear separation of cache blocks based on its access pattern within each set. For a heavily used set, since the set is accessed frequently, equal confidence-value is given to each cache blocks that are mapped to it. Thus, the confidence-value of each blocks are initialized with 4 irrespective of its type. This is similar to LRU where each block is initially placed to MRU position. For a lightly used set, the confidence-value is initialized as mentioned in Table 1.

The main motive of attaching a higher value, 4 to the satellite block is to retain such blocks for a longer period of time. This is because replacing a satellite block incurs more cost in terms of network packets. Moreover, when the cache set is lightly used; the usage of such set by the local core is also less. Therefore, more priority is given to the satellite blocks so that it is kept for a longer time period. This helps in effectively utilizing the less used sets in L1 caches of low applications.

**3.5.2 Replacement Policy of CARP:** During a cache block replacement, a block with least confidence-value is considered as the victim block. If more than one such block is present, then CARP selects a random block. Before a victim block is evicted, the L1 cache controller checks the direction flags in its backward pointer. In case any of the direction flag is set (the victim is a satellite block), the cache controller informs the owner of the satellite block by sending an invalidation message. In the meantime, the evicted block is stored in the victim buffer until it hears from the owner. Meanwhile, the tile can store the incoming block in its target-set.

The owner of the prefetch block upon receiving the invalid request, invalidates the forward pointer in its PTA. It then acknowledges back to the remote cache. Upon receiving the acknowledgment from the block owner, the evicted block which is temporarily stored in the victim buffer for ensuring consistency is removed. With this the replacement procedure is completed.

### 3.6 Behavioral changes of cache sets

In TCMP, the access pattern of cache set changes with time [32]. Some cache sets which are lightly used previously may change its pattern to heavy and vice versa. This is because the load on the cache set changes as the application makes progress. Hence, the heavy sets that are not used to place the satellite blocks in one phase may be used for prefetch block placement in another phase. A cache replacement policy should also handle the dynamic nature of cache sets.

CARP handles this issue very efficiently. When a heavily used set changes into lightly used, new incoming satellite blocks are given higher priority by attaching a higher confidence-value (4). For the existing blocks in the set, the blocks are evicted based on the least confidence-value as explained in subsection 3.5.2. On the other hand, when a lightly used set changes to heavily used, no satellite blocks are further mapped to such sets. Hence, blocks further mapping to such sets are local to the core and are initialized with the same confidence-value as mentioned in the previous subsection. In addition to these, the confidence-value of the previously mapped satellite blocks to such lightly sets are gradually decremented after every window. Therefore, CARP dynamically avoids the insertion of any new satellite blocks into a newly converted heavily used set.

### 3.7 Near Vicinity Prefetcher

The idea of prefetch block placement in neighboring tiles is taken from our previous work, Near Vicinity Prefetcher (NVP) [33]. On top of the naive NVP design, ECAP uses additional features like the replacement policy CARP and suitable neighbor selection which significantly improves its performance. NVP focused on increasing the performance of prefetch-enabled caches running multiple applications in TCMP. It uses LRU replacement policy in the caches.

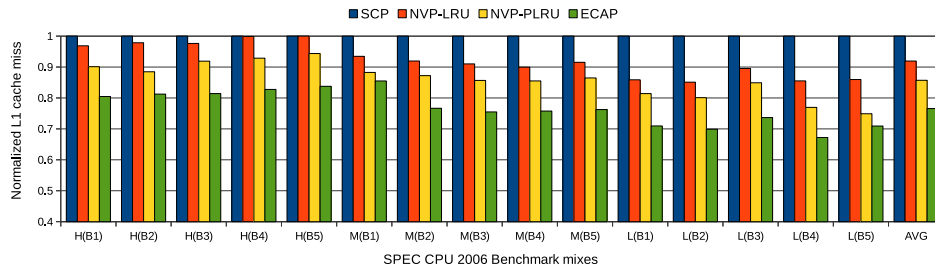
On the other hand, ECAP specially focuses on providing the best choices on satellite block placement and dead block removal. ECAP proposes a replacement policy, CARP to remove such blocks from

**Table 2** Simulation Parameters

gem5 and Booksim Configuration.	
Processor	64, x86 cores with out-of-order execution
Processor frequency	3 GHz
L1 cache/core	64KB, 4-way associative, 32B block
L2 cache/core	1MB, 16-way associative, 64B block
L1 cache access latency	2cycles
L2 cache access latency	12 cycles
Prefetcher	Next line prefetcher
Prefetch block placement	SCP (Baseline), ECAP (proposed)
NoC topology	8 × 8 2D mesh with XY routing
Packet size	1-flit request and 4-flit reply

**Table 3** Details of SPEC CPU 2006 workload constituents;
 $X(Y)^n$  : Benchmark  $X$  runs in  $Y$  cores with repetition of  $n$  times

<b>High MPKI (H):</b>	hammer, leslie3d, lbm, mcf
<b>Medium MPKI (M):</b>	bwaves, gcc, bzip2, games
<b>Low MPKI (L):</b>	calculix, gromacs, h264ref, gobmk
B1 (Mix1)	$P(16), Q(16), R(16), S(16)$
B2 (Mix2)	$(P(4), Q(4), R(4), S(4))^4$
B3 (Mix3)	$(P(2), Q(2), R(2), S(2))^8$
B4 (Mix4)	$(P(4), Q(4))^4, (R(4), S(4))^4$
B5 (Mix5)	$(P, Q, R, S, S, R, Q, P)^8$

**Fig. 11:** Reduction of L1 cache misses for different prefetch block placement techniques.

the lightly used set of remote caches thereby enabling efficient utilization of cache space in remote caches. This also helps in reducing the network packets by providing more time for a satellite block to reside in the caches. Hence, ECAP also contributes in reducing the power and energy saving aspects of prefetch block placement in remote caches. This is supported by additional results produced using extensive experimental analysis as described in the subsequent sections.

#### 4 Experimental Analysis and Workload Characterization

**Experimental Setup:** We evaluate the effectiveness of our proposed technique, ECAP using gem5 [23], a cycle-accurate full system simulator. Booksim 2.0 [24] is closely integrated with gem5 to model the NoC. We also use CACTI 6.0 [34] to evaluate the power and area analysis of ECAP, and Orion 2.0 [35] to calculate the network power. The experiments are conducted using workloads generated from SPEC CPU 2006 benchmark suite [25].

The system is modeled with out-of-order x86 superscalar processor, two level of memory hierarchy and uses directory-based MESI CMP coherence protocol. The L2 cache is shared among all the tiles and the L1 caches (L1I-cache and L1D-cache) are private to each core. The access latency of L1 cache is 2 cycles while that of L2 cache is 12 cycles. We assume that the access latency of PBP and PTA is same as that of L1 cache. The main memory latency is modeled as 100 cycles. We use SCP as the baseline prefetch block placement technique with the conventional next line prefetcher for data prefetching. The simulation parameters are summarized in Table 2.

We have also implemented NVP with LRU replacement policy (NVP-LRU), NVP with PLRU replacement policy (NVP-PLRU), and our proposed technique ECAP with CARP replacement policy. We analyze the performance of ECAP with different replacement policies in terms of cache misses (in MPKI), network packets, packet latency in the network, AMAT, percentage of direct and indirect hits, and packet distribution per hop. We also analyze the sensitivity of various design parameters to evaluate the performance of ECAP in section 5.

**Workload Description:** The workloads used to evaluate ECAP are created from real SPEC CPU 2006 benchmark suite. As mentioned in table 3, 12 benchmarks from SPEC 2006 suite are used as single core applications. The benchmarks are classified into three categories based on their MPKI values as Low (MPKI < 5), Medium (25 > MPKI < 5), and High (MPKI > 25) as described in Table 3. The MPKI's are calculated after fast-forwarding for 10L cycles in order to avoid cold misses. Using the benchmarks, 64-core multi-programmed workloads are generated where in each core one of the SPEC CPU 2006 benchmark application (high, low or medium) is mapped.

We have generated 5 workload mixes (B1 to B5) each consisting of four (P, Q, R, S) benchmarks chosen from high, low or medium MPKI benchmark categories. H(Bi), M(Bi), and L(Bi) indicates that the workload Bi (1 ≤ i ≤ 5) is generated from high, low or medium MPKI benchmarks, respectively. The workload B1 is generated for 64-core TCMP by mapping benchmark P to first 16-cores (0-15), Q to next 16-cores (16-31), R to the next set of 16-cores (32-47) and S to the remaining set of 16-cores (48-63). B2 is generated by dividing 64-cores into four equal clusters where each cluster has 16-cores. Within each cluster, benchmark P runs on core 0-3, Q runs on core 4-7, R runs on core 8-11 and S runs on core 12-15. The pattern is repeated across all the four clusters. Similarly for B3, 64-cores are divided into 8 clusters where each cluster has 8 cores. With the pattern repeated within each cluster, P runs on first two cores, Q runs on next two cores and so on. In a similar fashion B4 and B5 workloads are also generated.

##### 4.1 Effect on L1 cache miss

As detailed above, we examine the impact of ECAP and NVP with different replacement policies on L1 cache misses using real workloads from SPEC CPU 2006 benchmark mixes. Figure 11 shows the normalized reduction in L1 cache miss of various workloads generated from the three benchmark categories (high/low/medium). From the figure we can observe that on an average the L1 cache miss for NVP-LRU, NVP-PLRU and ECAP reduces by 8.05%, 14.28%, and 23.42% as compared to SCP.

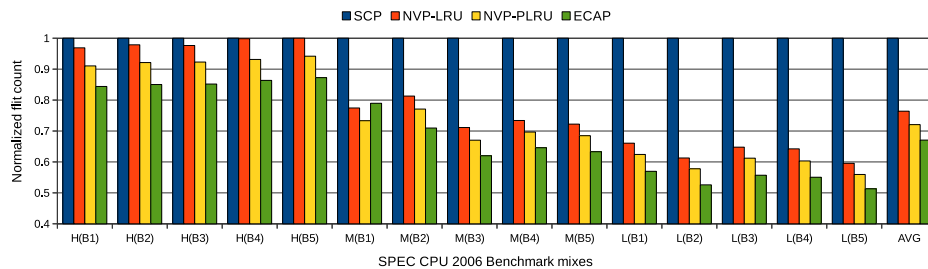


Fig. 12: Reduction of flits in NoC for different prefetch block placement techniques.

L1 cache miss reduction in ECAP is due to many reasons. ECAP increases the cache space of high applications dynamically at run-time. This increase in cache space allows placing more prefetch blocks in remote caches and in PBP. Applications that has good spatial locality benefits from this placement. ECAP also reduces cache pollution. A useful demand block that is already cached can reside for a longer time period. The confidence-value associated with a demand block increases when it experiences re-referencing during its residency in the cache. Therefore, the cache sets where such blocks are mapped turns out to be a heavily used set. ECAP targets only lightly used set for prefetch block placement in its home cache and also in the remote caches. Thus, ECAP avoids evicting useful demand blocks from the cache thereby decreasing the L1 cache miss count.

From Figure 11, we can observe that for high MPKI workloads, the performance improvement of NVP-LRU is negligible as compared to that of SCP. The load on local L1 cache is more when high MPKI applications are running on the cores. As a result of this, the home caches as well as the remote caches are almost utilized by the applications running on the respective cores. This makes it hard for NVP to place prefetch blocks in remote caches. In addition to this, LRU replacement policy cannot recognize dead blocks within a cache set. Hence, NVP-LRU cannot utilize the cache space efficiently.

However, NVP-PLRU and ECAP perform better than NVP-LRU. The relative reduction of L1 cache misses in both the techniques is due to the fact that NVP-PLRU provides a sub-optimal choice whereas ECAP produces an optimal choice in identifying victim blocks during cache replacement. PLRU policy distinguishes only the most recently accessed cache block within a set. Apart from the most recently accessed block, PLRU selects a victim randomly among other blocks within the cache set. This results in providing a sub-optimal solution to find a victim block during prefetch block placement in the home cache and remote caches. Hence, NVP-PLRU may also evict a demand block that has been accessed by the core within few cycles.

CARP on the other hand, provides an optimal solution by replacing a less used cache block or a dead block within a cache set. If a cache block is not accessed periodically within a window, the confidence value of the block reduces. The eviction policy of CARP chooses a victim block that has the least confidence value. Hence, ECAP evicts the least used cache block from the cache. This results in fewer cache misses as compared to SCP, NVP-LRU, and NVP-PLRU. This also improves the efficiency of ECAP in placing prefetch blocks in home cache and remote caches. In the figure, we can clearly observe a considerable reduction of L1 cache miss in ECAP as compared to NVP-PLRU and NVP-LRU in all the workloads.

#### 4.2 Effect on network traffic

Figure 12 shows the normalized reduction of flits (basic flow control unit in NoC) in 64-core TCMP organized as 8x8 2D mesh network running SPEC CPU 2006 benchmark mixes. Reduction in number of

flits reduces traffic in the network. From the figure we can observe that there is an average reduction of flits by 23.58%, 27.93%, and 32.93% in NVP-LRU, NVP-PLRU, and ECAP, respectively as compared to SCP.

As described in subsection 4.1, ECAP reduces the number of L1 cache misses in the system by efficiently utilizing the less used cache space as well as removing dead blocks from remote caches. Efficient utilization of cache space increases the cache size virtually which in turn reduces cache misses. Reduction in cache misses results in generating less network packets. Therefore, the amount of network traffic decreases in ECAP.

In NVP, the reduction of network packets for high MPKI workload is less than that of medium and low MPKI workloads. This is evident from the fact that in high MPKI workloads, the number of lightly used set is less. Therefore, most of the prefetch blocks are placed in the PBP of local tiles. Hence, high MPKI applications are not NVP friendly. But for all types of application, ECAP reduces network packets by identifying dead blocks from the cache irrespective of the set type (light/heavy). So removal of an inactive demand block results in placing useful demand blocks in the cache. Hence, the cache space is efficiently utilized resulting in fewer cache misses which further reduces network packets.

#### 4.3 Effect on average packet latency

Reduction in network packet reduces the traffic in NoC. This results in faster tile to tile communication. Hence, the average packet latency in the network reduces. This can be clearly observed in Figure 13 where NVP-LRU, NVP-PLRU, and ECAP reduces packet latency by 16.2%, 20.05%, and 25.34%, respectively. For high MPKI applications, H(B1), H(B2), and H(B3) performs better than H(B4) and H(B5). Because of the cache usage pattern for such applications, the performance of ECAP is nominal.

For medium and low MPKI applications, the variations in cache set usage leads in increased performance of ECAP. From the average packet latency figure we can observe that ECAP performs better than NVP-LRU and NVP-PLRU. This is because in lightly used sets, the demand blocks residing in such sets becomes inactive. Satellite blocks residing in such cache sets may experience a delayed access due to its speculative nature. Therefore, the chances of evicting such block is more than an inactive demand block. CARP gives more chances for a satellite block to stay in a remote-cache by assigning them higher confidence-values. This effectively helps in utilizing the less used cache sets in remote caches thereby increasing the cache size for a high applications.

#### 4.4 Effect on Average Memory Access Time.

In TCMP, the average memory access time of an L1 cache depends upon the hit time of L1 cache, miss rate of L1 cache, miss penalty of L1 cache and also on the underlying network condition. Since each cache miss is carried as packets in the network, the network congestion plays a major role in determining the AMAT. As shown in Figure 14, NVP-LRU, NVP-PLRU, and ECAP reduces 12.9%,



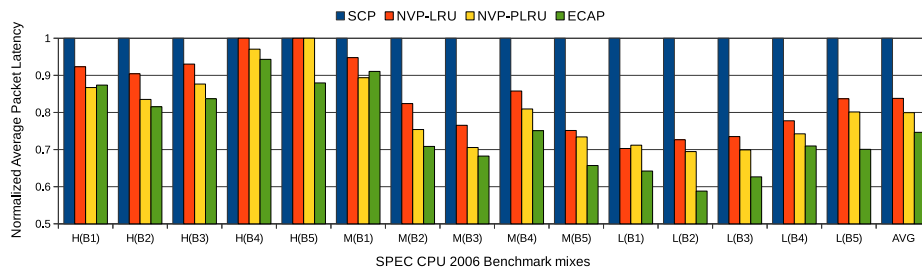


Fig. 13: Reduction of packet latency in the network for different prefetch block placement techniques.

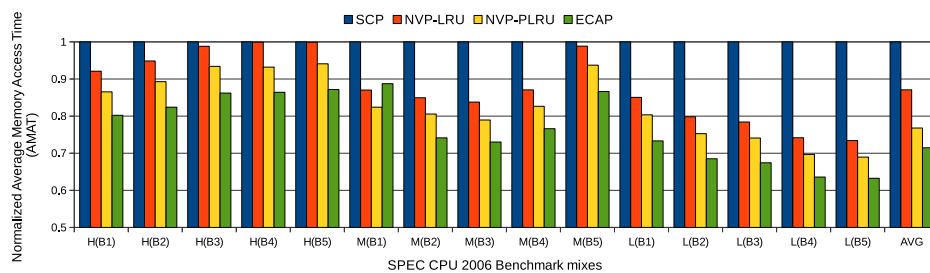


Fig. 14: Reduction of AMAT for different prefetch block placement techniques

17.86%, and 23.56% of AMAT as compared to SCP. On an average reduction of 32.93% network packets in ECAP, results in reducing the packet latency by 25.34%. This has a direct impact on reducing AMAT during cache misses occurring in the core.

For high applications, the reduction of packets in the network is less as compared to SCP. Therefore, the reduction of AMAT is also less for such applications. On the other hand, for medium and low MPKI applications, NVP-LRU, NVP-PLRU and ECAP performs better in reducing the network packets. Therefore, the AMAT for medium and low applications shows significant reduction as compared to high MPKI benchmarks. However, ECAP helps in achieving best performance than NVP-LRU and NVP-PLRU as shown in the figure.

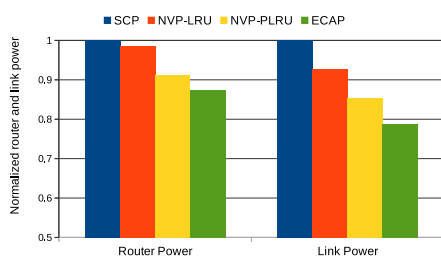


Fig. 15: Power consumption across routers and links in NoC.

#### 4.5 Effect on Dynamic Power Consumption across routers and links in NoC

Orion 2.0 tool [36] is used to evaluate the dynamic power consumption of routers and links in NoC. The proposed techniques are built using 32nm process technology and the operating frequency of the

NoC is 1 GHz. The tiles in NoC are arranged as 8x8 2D mesh topology. For our experimental purpose, the routers are input-queued with five input/output ports. The number of Virtual Channel (VC) used per input port is four. Power is consumed when a flit resides in the VCs and also during flit traversal from one router to another through NoC links.

Figure 15 shows the dynamic power consumption across routers and links in NoC. From the figure, we can observe that for various techniques i.e., SCP, NVP-LRU, NVP-PLRU and ECAP, ECAP achieves the best reduction in power consumption across routers and links. ECAP on an average reduces the router power and link power by 14.42% and 27%, respectively as compared to SCP. This is because the reduction of cache pollution reduces the number of cache misses. Thus, the number of flits in the NoC reduces. Hence, the routers and links in the underlying NoC have to carry less number of traffic across the tiles. This resulted in reducing the dynamic power consumption at the routers and links in NoC.

#### 4.6 Percentage of hits in different categories.

Figure 16 shows the percentages of direct and indirect hits in ECAP for different types of benchmark mixes. In this figure, we have shown the hit percentages for ECAP only because CARP replacement policy helps in achieving better performance than NVP-LRU or NVP-PLRU. Indirect hits are achieved either from PTA or PBP. Hit in PTA means that the prefetch block is placed in remote caches. Such hits are mentioned as PTA-hits in the figure. More PTA-hits indicates that more number of prefetch blocks are placed in remote caches. Therefore, applications with more PTA-hits are better ECAP friendly than those with less PTA-hits.

Clearly from the figure we can observe that for most of the high applications, the number of PBP-hits is more than that of PTA-hits. From 18.8% of indirect hits, around 7.9% of the hits are from PTA and rest 10.9% of the hits are from PBP. As mentioned earlier, for High MPKI application, the number of lightly used set is substantially less. Therefore, experimentally it is found that most of the prefetch blocks are accommodated in the PBP of its local tile as shown in the figure. For medium MPKI applications, 21.74% of hits

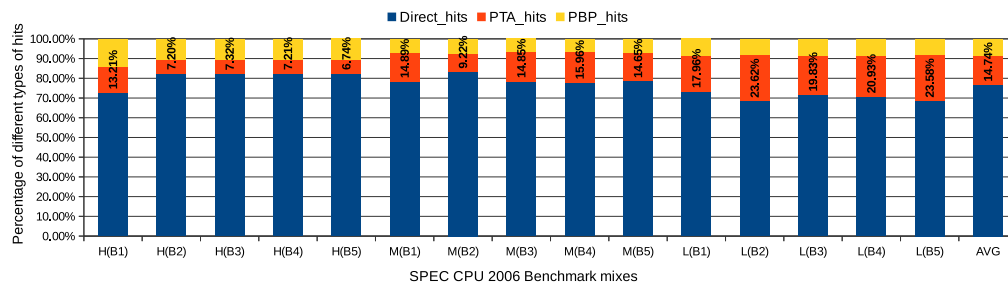


Fig. 16: Percentage distribution of direct and indirect hits in ECAP.

are indirect hits. Out of the total indirect hits, most of the hits are from PTA i.e., 15.04%. In low MPKI applications, a total of 30% hits are indirect hits and maximum hits are PTA-hits which constitutes around 21.26% of total indirect hits.

Therefore, it is clear that ECAP combined with CARP replacement policy performs better for benchmark mixes that has a combination of high, medium and low MPKI or some specific patterns of high MPKI workloads like H(B1).

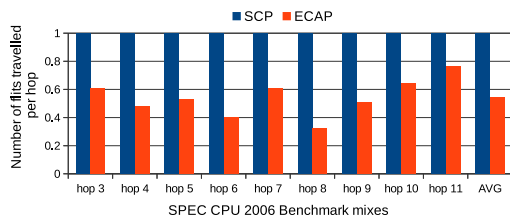


Fig. 17: Normalized reduction of long distance communication during cache miss in NoC.

#### 4.7 Reduction of long distance network packets in ECAP

Figure 17 shows the normalized reduction of long distance packets occurring during cache misses in ECAP as compared to the baseline prefetch block placement technique, SCP. In this figure, we call those packets as long distance that requires equal or more than three hop to reach its destination. From the figure we can observe that on an average ECAP reduces around 49.2% of long distance packets in the network during cache miss.

In ECAP, the prefetch blocks are placed at remote caches that are at one-hop distance away from the requesting core. Hence, such prefetch blocks are fetched from shorter distances thus avoiding long distance communication during cache misses. As a result of this, ECAP hides the number of long distance communication required to travel for a cache miss packet in the network by placing the prefetch blocks in a remote cache. This also justifies the fact that due to placement of prefetch blocks in remote caches, the existing demand blocks from the cache is not evicted. Thus, in a prefetch-enabled cache, ECAP reduces cache pollution caused by prefetch blocks.

## 5 Sensitivity Analysis

We hereafter concentrate solely on CARP and examine its sensitivity to various parameters. CARP uses various parameters like Window size (W), and different confidence values for satellite block and local block (prefetch and demand block) in each L1 caches. We change

different parameters and plot the results as network packet latency, cache misses, number of PTA hits, and number of flits. For ECAP, the PBP size is also one of the parameters that determines the performance of ECAP. Combining the parameters like PBP size with window and confidence values plays a significant role in determining the performance of ECAP.

This section describes the variation among the parameters and tries to come up with an optimal design parameter for better system performance. For each PBP size, we change different parameters of CARP and we name each variations as *CARP\_W\_S\_D* where W is the window size, S is the confidence value for satellite block and local prefetch block and D is the confidence value for local demand block. Figure 18, 19, 20 shows variation in different parameters and its impact on system performance.

From the figures we observe that for different PBP size, the least value of average packet latency in figure 18(a), 19(a), and 20(a) is around 21.8, 21, and less than 21, respectively. This behavior is found in *CARP\_32\_4\_3* (PBP size = 32). It is self explanatory from the fact that larger the PBP size, more number of prefetch blocks can be placed in the PBP of local tile. Hence, the average packet latency in the network reduces. Among all the variation of CARP parameter, *CARP\_32\_4\_3* performs better than *CARP\_32\_5\_4*, *CARP\_16\_5\_4*, and *CARP\_16\_4\_3*.

In figure 18(b), 19(b), and 20(b) we can observe that the number of PTA-hits is almost similar for all the variations of CARP parameter in larger window size i.e. W=32 (*CARP\_32\_5\_4* and *CARP\_32\_4\_3*). For W=16, the PTA-hits are less as compared to that of W=32. Figure 18(c), 19(c), and 20(c) shows the number of L1 cache misses occurred in different combination of W and confidence values. Among the three figures, in 19(c), *CARP\_32\_4\_3* experiences less misses as compared to *CARP\_32\_5\_4*, *CARP\_16\_5\_4*, and *CARP\_16\_4\_3*. This scenario is also similar for 18(c), and 20(c).

This behavior can be well explained because if the window size is small, then CARP reduces the confidence value of blocks faster. As a result of this, the blocks are demoted faster. This may result into evicting a cache block from the lightly used set much prior than experiencing a hit. Experimentally it is found that *CARP\_32\_4\_3* is the optimal combination of PBP size, window size, and confidence value as compared to other combinations. This is also evident from figure 18(d), 19(d), and 20(d) which shows that the reduction of flits is maximum for W=32 and confidence value for satellite block and local prefetch block as four and that of demand block as three.

Therefore, we use the combination of PBP size = 16, and CARP parameters as window of 32 cycles and confidence values as mentioned in Table 1 throughout our experiments.

## 6 Hardware Analysis

The extra hardware used in ECAP is a prefetch tag array, prefetch buffer pool, backward pointer, access counter per set (to check whether the set is lightly used or heavily used), and confidence value

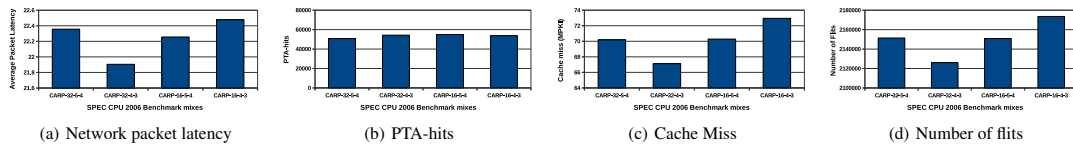


Fig. 18: PBP = 8, Change in window size and confidence value in CARP replacement policy.

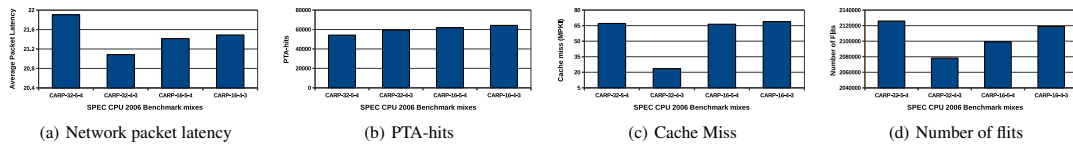


Fig. 19: PBP = 16, Change in window size and confidence value in CARP replacement policy.

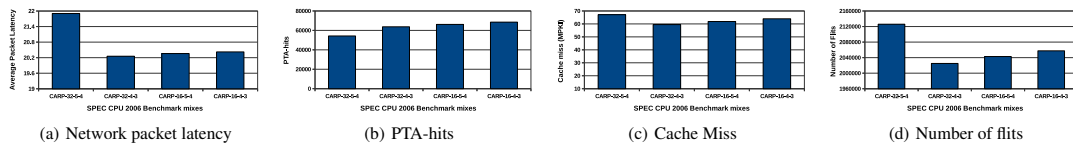


Fig. 20: PBP = 32, Change in window size and confidence value in CARP replacement policy.

Table 4 Additional hardware cost per tile in ECAP.

Cache size per tile:	1024 KB (L2) + 64 KB (L1) = 1088 KB		
Component	Bits/entry	number of entries	Bytes per tile
Backward Pointer	4	512 (sets) * 4 (ways)	1024
PTA	22	512 (sets) * 4 (MV)	5632
PBP	274	16	548
Access counter/set	4	512 (sets)	256
Confidence value/block	3	512 (sets) * 4 (ways)	768
Additional storage in ECAP per tile:	≈9 KB		
Hardware cost per tile (in %):	0.83%		

Table 5 Area and Power consumption analysis in ECAP

Component	L1 cache	L2 cache	PTA	PBP
Area(mm <sup>2</sup> )	0.1374	1.92	0.0074	0.00027
Power (nJ)	0.0304	0.2872	0.0017	0.00006
Total Area (in SCP): (L1 + L2)				2.0574 mm <sup>2</sup>
Total Area (in ECAP):				2.066 mm <sup>2</sup>
Total Power (in SCP): (L1 + L2)				0.3176 nJ
Total Power (in ECAP):				0.3194 nJ
Increase in area per tile (in %):				0.42%
Increase in power per tile (in %):				0.57%

per block for CARP replacement policy. The detailed hardware analysis of ECAP in terms of the additional storage as well as energy and power consumption is shown in Table 4 and Table 5. The main memory used in our experiment is of 4GB. Hence, 32-bit address is used. Based on the conventional address split-up, 17-bits are reserved as tag bits per block and 9-bits are reserved for set index bits.

Experimentally it has been found that ECAP performs well when each PTA index holds four mapping vectors. Since each mapping vector has 1-valid bit, 17-bits of tag, and 4-bits of direction flag, the total bits required for each mapping vector is 22-bits. The backward pointer require 4-bits of direction flag per cache block. As mentioned in subsection 5, the optimal value of PBP size is 16 which requires around 5632B. ECAP also stores a 4-bit value per set to check the access count within 1024 cycles.

When CARP is implemented in conjunction with ECAP then an additional hardware overhead of 3-bits per block is used for the confidence value that is attached with each block. If LRU replacement policy is used then the number of bits required for a 4-way set associative cache is 2-bits per block. Hence, the additional overhead required in ECAP with CARP replacement policy is 512 x 4 x 3 bits ≈ 768B. This has a marginal impact on the hardware overhead in ECAP.

Table 4 shows that the additional hardware cost per tile for ECAP design increases by only 0.83% as compared to SCP. If 64-bit address is used then ECAP has an additional hardware overhead of 1.47% per tile because of the increase in tag bits per mapping

vector. From table 5, we can observe that the area and power consumption of ECAP increases minimally by 0.42% and 0.57% per tile as compared to SCP.

## 7 Related Work

Existing works in prefetching focused in reducing the cache pollution, timeliness etc. of prefetchers [12, 15, 16, 37–39]. But these works are compatible with either a non-banked cache [39] or a banked cache with centralized access [12]. Prefetching in a distributed banked cache like TCMP is still an active research area and very less works have been done in this regard. Since this paper focuses on distributed banked cache architecture we summarize related work for such cache structures only.

Albericio et al. [11] proposed an adaptive controller, ABS to prefetch blocks in the last level cache. The controller controls the number of misses generated from each L2 cache bank when the prefetch aggressiveness varies. Since increase in miss count reduces system performance, ABS dynamically assigns different aggressiveness value to each L2 bank. It uses a hill climbing approach to control the aggressiveness of prefetchers running at each L2 bank separately.

Maria et al. [13] proposed a prefetch system that uses a server and client for each core. Upon encountering a cache miss, the client feeds

this information to a finite state machine. The finite state machine uses time series prediction to predict the time when the core will generate a next request. The server prefetches block based on the prediction to increase the timeliness of the prefetcher.

Andre et al. [40] proposed a balanced prefetch controller to prefetch blocks in L1 cache. The controller reduces miss penalty by controlling the aggressiveness of prefetchers in TCMPs. The author uses a cache sniffer and a directory sniffer at each tile. The directory sniffer samples out misses to predict the next cache request. The cache sniffer estimates the delay involved in fetching a block from lower level of memory to L1 cache. Both together controls the aggressiveness of prefetchers by reducing the network delays. Hence, the miss penalties in a core also reduces. This paper also emphasizes in reducing miss penalty by placing prefetch blocks closer to the source core.

## 8 Conclusion

In this paper, we propose an energy efficient prefetch block placement technique to reduce the negative impact of prefetching like cache pollution which in turn increases the number of network packets in TCMP. For high MPKI applications, ECAP leverages the less used cache space of remote caches that are running low applications. Hence, prefetch blocks of high applications are placed in the remote caches. This results in virtually increasing the cache space of high applications thereby reducing cache pollution. Experimentally we found that ECAP achieves an overall reduction of 23.42% of L1 cache misses as compared to SCP. This results in reduction of around 32.93% of network packets. As a result of this, the packet latency of cache miss packets reduces by 25.34% which further reduces the AMAT by 23.56%, router and link power by 14.42%, and 27%, respectively.

## 9 Acknowledgments

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