Project 2: Understanding Cache Memories

Yanjie Ze, 519021910706 zeyanjie@sjtu.edu.cn

June 1, 2021

1 Introduction

The project: **Understanding Cache Memories** is the second project for CS359: Computer Architecture. By finishing this project, we will understand cache memories from a higher perspective. The project consists of two parts:

• Part A: Writing A Cache Simulator

In this part, we will finish a C program to simulate the cache's behaviours and count the number of **cache hits**, **cache misses**, **evictions**. We take the *valgrind* memory trace as the input of this simulator, to observe the actions of the cache.

This part aims to get us better and deeper understand the cache.

• Part B: Optimizing Matrix Transpose

In this part, we focus on how to optimize the performance of **Matrix Transpose**, which is to store the transpose of matrix A into matrix B. To optimize the function, we need to make the cache misses as few as possible and have a full comprehension in the cache miss.

This part aims to teach us the methods of optimizing a program by attaching special attention on the cache.

2 Experiments

2.1 Part A

2.1.1 Analysis

We are required to implement a cache simulator in Part A. Let's figure out how to finish this part by the following analysis.

Cache Placement: The most important thing for us is to know how the cache

works before constructing the frame of codes. In our class, we have learned about three block placement way: **fully associative**, **direct mapped**, **set associative**, which are very similar essentially. By showing Fig.1 we know that they are actually all set associative, different in the set size. [1].

As shown in Fig. 1, direct-mapped is 1-way set associative and fully associative is m-way set associative, where m is the number of blocks. Thus, what we care about is how to implement **set associative**.

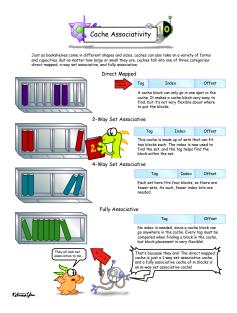


Figure 1: Illustration of Cache Associativity[1]

Simulation: To know in detail how to simulate the cache, let's take a look at **trace files** generated in the form same as **valgrind**:

```
1 L 10,1
2 M 20,1
3 L 22,1
4 S 18,1
5 L 110,1
6 L 210,1
7 M 12,1
```

In this trace file, there are 3 instructions, and each of them has the form like: Operation, Address, Size:

- L(load). Load size bytes from address.
- **M(modify)**. Load *size* bytes from *address*, modify them, and store them back into *address*.(load + store)

• **S(store)**. Store *size* bytes into *address*.

Thus, when we are parsing each operation, it's very important to consider the M operation may lead to hit/miss twice.

LRU: When a miss happens, we use **LRU** to replace the blocks, whose full name is **Least Recently Used**. LRU algorithm is shown in Alg. 1. In Alg. 1, $b_i t$ refers to the recently used time of the block i.

```
Algorithm 1: LRU Replacement
```

```
1 Input: Blocks B = \{b_1, b_2, ..., b_n\}
2 Output: Replaced Block b
3 Define t_{min} = \infty;
4 Define idx = 0;
5 for each \ b_i \ in \ B \ do
6 | if b_i.t < t_{min} \ then
7 | t_{min} = b_i.t;
8 | idx = i;
9 return b_{idx}
```

2.1.2 Structure

In this section, we briefly show the structure of Cache Simulator, which mainly consists of three parts: **parsing, cache initialization, cache updating, cache free**, as shown in Fig. 2.

In the next section, we will give the detailed implementation.

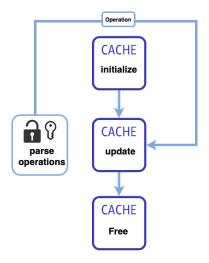


Figure 2: Structure of Cache Simulator

2.1.3 Code

In this section, we show the specific implementation of our simulator.

Basically, we define a data structure called **cache line**, the unit of the cache:

```
/* basic data structure for caches*/
typedef struct CACHE_LINE
{
    int valid_bit;
    int tag;
    int time;
} cache_line;
```

Then our cache is made up of the cache lines:

```
cache_line **cache;
```

And the initialization of the cache is shown below. We initialize each elements in a cache line.

```
void cache_init()
2
      cache = (cache_line**)malloc(sizeof(cache_line*) * S);
3
      for(int i=0; i<S; ++i)</pre>
5
           cache[i] = (cache_line*)malloc(sizeof(cache_line) * E);
6
           for(int j=0; j < E; ++j)
               cache[i][j].tag = -1;
9
               cache[i][j].time = -1;
10
               cache[i][j].valid_bit = 0;// set to invalid
11
12
      }
13
14 }
```

First, we need to parse the operations read from the trace files. There are three operations as introduced before: $\mathbf{L}, \mathbf{M}, \mathbf{S}$. Note that the order we place them: $L \to M \to S$. This is because Modify Operation needs to access the cache twice and there's no break after case 'M'. The function operation_parse is shown below.

```
void operation_parse()
2
3
      char operation;
      unsigned int address;
      int size;
5
6
      char comma;
      while (fscanf(file_pointer, " %c %xu%c%xu", &operation, &address,&
      comma, &size)>0)
9
10
           switch (operation)
          {
11
           case 'L': // Load Data
               cache_update(address);
13
14
               break;
```

```
case 'M':// Modify Data
16
               cache_update(address);// Modiy also need Store
           case 'S': // Store Data
18
               cache_update(address);
19
               break;
20
21
           default:
22
               break;
23
24
           time_update();
25
26
27
```

Second, we provide the implementation of cache_update, which takes the address as the input and access the corresponding cache line in the cache. The process of this functio is:

- 1. Parse the address into tag_idx and set_idx.
- 2. Search in the set for the existence.
 - (a) If hit, update and return.
 - (b) If not hit, go to next step.
- 3. Search in the set for the empty space.
 - (a) If found, update and return.
 - (b) If not found, go to next step.
- 4. Use LRU to replace the block. Update and return.

Thus, the code below implements this process.

```
void cache_update(unsigned int address)
2
      int tag_idx = (address>>(num_b+num_s));
3
      int set_idx = (address>>num_b) & ((0xfffffffff)>>(64-num_s));
4
      for(int i=0; i<E; ++i)// search in set</pre>
6
          // if hit
           if((cache[set_idx][i].tag == tag_idx) && cache[set_idx][i].
       valid_bit==1)
9
          {
10
               hits ++;// hit
               cache[set_idx][i].time = current_time;
12
               return;
13
      }
14
15
       for(int i=0; i<E; ++i)// not hit</pre>
16
```

```
if(cache[set_idx][i].valid_bit == 0)// invalid, means empty
18
19
               cache[set_idx][i].tag = tag_idx;
20
               cache[set_idx][i].time = current_time;
21
               cache[set_idx][i].valid_bit = 1;
22
               misses ++;// miss
23
24
                return;
           }
25
26
27
       // not hit and not empty, need eviction
28
29
       evictions ++;
       misses ++;
30
       // We use LRU here
31
       int min_time = 10000;
32
       int min_idx;
33
34
       for(int i=0; i<E; ++i)</pre>
35
36
           if(cache[set_idx][i].time<min_time)</pre>
37
               min_time = cache[set_idx][i].time;
38
               min_idx = i;
39
40
       }
41
       cache[set_idx][min_idx].tag = tag_idx;
42
       cache[set_idx][min_idx].time = current_time;
43
44 }
```

Third, we provide the implementation of time_update, which is used to update the current time simply, and cache_free, which is to free the cache after all the operations.

```
/*update current time*/
  void time_update()
2
3 {
      current_time ++;
4
5 }
6
  /* free the cache */
8 void cache_free()
      for(int i=0; i<S; ++i)</pre>
10
11
          free(cache[i]);
      free(cache);
12
13 }
```

Finally, we give our main function, which parse the command line parameters and call functions we create before:

```
int main(int argc, char*argv[])

{
   int command_param; // get the command from getopt()

num_b = -1;
num_E = -1;
```

```
num_s = -1;
7
8
       // parse command
9
10
       while ((command_param = getopt(argc,argv,"s:E:b:t:hv"))!= -1)
11
           switch (command_param)
12
13
           case 'h':
14
15
               print_help();
               break;
16
17
           case 's':
18
               num_s = atoi(optarg);
19
20
               break;
21
           case 'E':
22
               num_E = atoi(optarg);
23
               break;
24
25
           case 'b':
26
               num_b = atoi(optarg);
27
               break;
28
29
           case 't':
30
               strcpy(tgt_file, optarg);
31
32
               break;
33
           default:
34
               printf("./csim: Wrong required command line argument\n");
35
               print_help();
36
37
                break;
           }
38
39
40
41
       // Basic Check
42
       if(num_b <= 0 || num_E <= 0 || num_s <= 0)</pre>
43
44
           return -1;
45
46
       file_pointer = fopen(tgt_file, "r");
       if(file_pointer==NULL)
47
48
           printf("File Error: Can't Open File.\n");
49
           return -1;
50
51
52
53
       hits = 0;
54
       misses = 0;
55
56
       evictions = 0;
57
       S = 1 << num_s;
58
       B = 1 << num_b;
59
       E = num_E;
60
61
       current_time = 0;
62
63
       cache_init();
```

```
operation_parse();
cache_free();
fclose(file_pointer);
printSummary(hits, misses, evictions);

return 0;
}
```

2.1.4 Evaluation

In Fig. 3, we show the results of our program, autograded by **test-csim**. Thus, we successfully build our Cache Simulator.

Figure 3: Evaluation Results

2.2 Techniques in Part B

This section is used to introduce several tricks we apply in Part B. We first introduce them here and show how we apply them in the next section.

2.2.1 Blocking

Blocking is a technique introduced in [2], which utilizes large chunks called blocks to improve the temporal locality of inner loops.

For example, to calculate a matrix multiplication, i.e. C = AB, we can partition A and C into $1 \times bsize$ row silvers and B into $bsize \times bsize$ blocks, as shown in Fig. 4.

In order to improving the performance of our function **Matrix Transpose**, we also apply this technique.

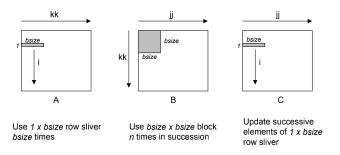


Figure 4: Illustration of Matrix Multiplication using Blocking[2]

2.2.2 Read All Only Once

We propose a trick called **Read All Only Once**, to further improve the performance.

Read All Only Once is a trick that when doing blocking, we read the full line of the block.

Then we explain why this trick works.

For example, the matrix A has the size 32×32 . When CPU reads A[0][0], one cache line is filled with A[0][0], A[0][1], ..., A[0][7]. If we just read one element then transpose the element, the cache line is replaced with B[0][0], ..., B[0][7]. Thus, there are extra elements that are not read but placed in the cache. If we not use them in this time, they are still in requirement. We can read these elements at one time, which is called **Read All Only Once**.

2.2.3 Save and Load

We propose a trick called **Save and Load**, to make the use of the data which has been read into the cache more efficiently.

We use an example of how we apply **Save and Load** to illustrate why we propose this trick and how this works.

For example, the matrix A has the size 64×64 .

Thus, the cache can store 4 lines of the matrix $(64 \times 4 = 32 \times 8)$. We need to refresh the cache every 4 lines.

On such a condition, if we perform *blocking* of size 8, as shown in Fig. 5, the cache can only be filled with *line*1 to *line*4 or *line*5 to *line*8. A natural idea is to use **Read All Only Once**, but it can not work since the number of variables is greater than 8.

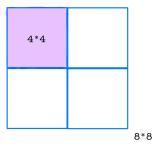


Figure 5: Illustration of Save and Load in 8 Blocking

To solve this problem, we first read 4 elements in A's lower left quarter and store the transposition of them in B's lower left quarter. This is called Save. Then, when transposing A's upper right corner, we first load the elements in B we store before and do the transposition of the upper right corner and the lower left corner of B. This trick is named as **Save and Load**.

2.3 Part B

2.3.1 Analysis

In Part B, we are required to optimize the performance of the function Matrix Transpose, to make the cache misses as few as possible. Matrix Transpose stores the transposition of matrix $A_{n\times m}$ into matrix $B_{m\times n}$.

In test-trans, the cache has the following parameters:

$$s = 5, E = 1, b = 5$$

Which means the number of sets is $2^5 = 32$, the number of line per set is 1, and the block size is $2^5 = 32$. Thus, the cache size is:

$$cache\ size = \#sets \times \#line\ per\ set \times block\ size = 2^{10}byte = 1kB$$

$$set\ size = \#line\ per\ set \times block\ size = 32byte$$

One integer demands 4byte. Thus one cache set can store 8 integers at a time, and one cache can store 32×8 integers at a time.

When we consider how to optimize the performance, we merely consider three different sizes of the matrix: 32×32 , 64×64 , 61×67 . Different sizes have different features and we utilize the techniques we propose before to optimize them one by one.

2.3.2 Code

In this section, we give the implementation of the function with the best performance for three sizes separately. Some other trys will be shown in the next section, in compared with the best functions.

First, for $A_{32\times32}$, we apply **Blocking 8** (we use the size as the suffix) and **Read All Only Once**, which has the performance of **hits:1766**, **misses:287**, **evictions:255**, reaching the full score.

```
char blocking8_readall[] = "Blocking 8 Read All Only Once transpose";
  void transpose_blocking8_readall(int M, int N, int A[N][M], int B[M][N
       1)
       // using 3 + 8 = 11 variable
3
       int t0,t1,t2,t3,t4,t5,t6,t7;
       for(int i=0; i<N; i+=8)</pre>
           for(int j=0; j < M; j+=8)
               for(int k=i; k<i+8; k++)</pre>
                    // read all only once
9
                    t0 = A[k][j];
10
                    t1 = A[k][j+1];
                    t2 = A[k][j+2];
12
                    t3 = A[k][j+3];
13
                    t4 = A[k][j+4];
14
15
                    t5 = A[k][j+5];
                    t6 = A[k][j+6];
16
17
                    t7 = A[k][j+7];
                    // update
19
                    B[j][k] = t0;
20
                    B[j+1][k] = t1;
21
                    B[j+2][k] = t2;
22
                    B[j+3][k] = t3;
23
                    B[j+4][k] = t4;
24
25
                    B[j+5][k] = t5;
                    B[j+6][k] = t6;
26
                    B[j+7][k] = t7;
27
28
29
```

Second, for $A_{64\times64}$, we apply Blocking 8+Read All Only Once+Save and Load, which has the performance of hits:9066, misses:1179, evictions:1147, reaches the full score.

```
char blocking8_readall_improve[] = "Blocking 8 Read All Only Once
      Improved transpose";
  void transpose_blocking8_readall_improve(int M, int N, int A[N][M], int
       B[M][N])
      // using 4 + 8 = 12 variable
3
      int t,t1,t2,t3,t4,t5,t6,t7,t8;
      for(int i=0; i<N; i+=8)</pre>
5
          for(int j=0; j < M; j+=8)
                  // save and load
                   for (t = i; t < i + 4; ++t)
8
9
          // read all only once
10
             t1 = A[t][j]; t2 = A[t][j+1]; t3 = A[t][j+2]; t4 = A[t][j+3];
11
             t5 = A[t][j+4]; t6 = A[t][j+5]; t7 = A[t][j+6]; t8 = A[t][j+7]
12
      ];
13
```

```
B[j][t] = t1; B[j+1][t] = t2; B[j+2][t] = t3; B[j+3][t] = t4;
14
            B[j][t+4] = t5; B[j+1][t+4] = t6; B[j+2][t+4] = t7; B[j+3][t+4]
15
      41 = t8:
          }
16
          for (t = j; t < j + 4; ++t)
18
             t1 = A[i+4][t]; t2 = A[i+5][t]; t3 = A[i+6][t]; t4 = A[i+7][t]
19
      ];
             t5 = B[t][i+4]; t6 = B[t][i+5]; t7 = B[t][i+6]; t8 = B[t][i+7]
20
      ];
21
             B[t][i+4] = t1; B[t][i+5] = t2; B[t][i+6] = t3; B[t][i+7] =
22
      t4;
            B[t+4][i] = t5; B[t+4][i+1] = t6; B[t+4][i+2] = t7; B[t+4][i+3]
      3] = t8;
24
          for (t = i + 4; t < i + 8; ++t)
25
26
27
             t1 = A[t][j+4]; t2 = A[t][j+5]; t3 = A[t][j+6]; t4 = A[t][j+7]
      ];
            B[j+4][t] = t1; B[j+5][t] = t2; B[j+6][t] = t3; B[j+7][t] =
      t4;
          }
29
30
           }
31 }
```

Third, for $A_{61\times67}$, we apply **Blocking 16+Read All Only Once**. Since the shape of the matrix is not a square, we need to first transpose the square part then transpose the remaining part, which is called *Compensate*. This function has the performance of **hits:6264**, **misses:1993**, **evictions:1961**, reaching the full score.

```
char blocking16_readall_shape[] = "Blocking 16 Read All Random Shape
       transpose";
  void transpose_blocking16_readall_shape(int M, int N, int A[N][M], int
       B[M][N])
4
       int t0,t1,t2,t3,t4,t5,t6,t7;
5
6
       int i,j;
       for (i=0; i<N-N%16; i+=16)
8
           for(j=0; j<M-M%16; j+=16)</pre>
9
               for(int k=i; k<i+16; k++)</pre>
10
                    // read all only once
12
                    t0 = A[k][j];
13
                    t1 = A[k][j+1];
14
                    t2 = A[k][j+2];
                    t3 = A[k][j+3];
16
17
                    t4 = A[k][j+4];
                    t5 = A[k][j+5];
18
                    t6 = A[k][j+6];
19
                    t7 = A[k][j+7];
20
21
```

```
// update
22
23
                    B[j][k] = t0;
                    B[j+1][k] = t1;
24
                    B[j+2][k] = t2;
25
                    B[j+3][k] = t3;
26
                    B[j+4][k] = t4;
27
                    B[j+5][k] = t5;
28
                    B[j+6][k] = t6;
29
30
                    B[j+7][k] = t7;
31
                    // read all only once
32
                    t0 = A[k][j+8];
33
                    t1 = A[k][j+9];
34
                    t2 = A[k][j+10];
                    t3 = A[k][j+11];
36
                    t4 = A[k][j+12];
37
                    t5 = A[k][j+13];
38
                    t6 = A[k][j+14];
39
40
                    t7 = A[k][j+15];
41
42
                    // update
                    B[j+8][k] = t0;
43
                    B[j+9][k] = t1;
44
                    B[j+10][k] = t2;
45
                    B[j+11][k] = t3;
46
47
                    B[j+12][k] = t4;
                    B[j+13][k] = t5;
48
                    B[j+14][k] = t6;
49
                    B[j+15][k] = t7;
50
                }
51
52
        // compenstate
53
54
       for (i = 0; i < N; ++i)
       for (j = M-M%16; j < M; ++j)
55
56
57
           t0 = A[i][j];
           B[j][i] = t0;
58
     for (i = N-N\%16; i < N; ++i)
60
       for (j = 0; j < M; ++j)
61
62
63
           t0 = A[i][j];
           B[j][i] = t0;
64
65
66
```

2.3.3 Evaluation

In this section, we compare the results of the experiments we do with different techniques applied in different size. Note that Blocking is short for **B**, Read All Only Once is short for **RAOO** and Save and Load is short for **LS**.

First, for matrix $A_{32\times32}$, we test different blockings and RAOO, shown in table. 1.

technique	blocking 4	blocking 8	blocking 16	blocking 8+RAOO
hit	1566	1710	870	1766
miss	487	343	1183	287
eviction	455	311	1151	255

Table 1: Results for $A_{32\times32}$

Second, for matrix $A_{64\times 64},$ we test different blockings , RAOO and LS, as shown in table. ${\color{gray}2}$

technique	b4	b 8	b 16	b 4+RAOO	b 8+RAOO	b 8+RAOO+LS
hit	6306	3474	3474	6498	3586	9066
miss	1891	4723	4723	1699	4611	1179
eviction	1859	4691	4691	1667	4579	1147

Table 2: Results for $A_{64\times64}$

Third, for matrix $A_{61\times67}$, we test different blockings and RAOO, as shown in table. 3

technique	b 15	b 16	b 17	b 8+RAOO	b 16+RAOO
hit	5922	6194	5902	7888	6264
miss	2271	2063	2597	2113	1993
eviction	2239	2031	2565	2081	1961

Table 3: Results for $A_{61\times67}$

Finally we show the results of our program with the best performance, as shown in Fig. 6.

```
Zyjewbuntu:-/Documents/project2-handouts ./test-trans -M 32 -N 32

Function 0 (1 total)
Step 1: Validating and generating memory traces
Step 2: Evaluating performance (s-5, E=1, b-5)
func 0 (Transpose submission): hits:1766, misses:287, evictions:255

Summary for official submission (func 0): correctness=1 misses=287

TEST_TRANS_RESULTS=1:287
Zyjewbuntu:-/Documents/project2-handouts ./test-trans -M 64 -N 64

Function 0 (1 total)
Step 1: Validating and generating memory traces
Step 2: Evaluating performance (s-5, E=1, b-5)
func 0 (Transpose submission): hits:9666, misses:1179, evictions:1147

Summary for official submission (func 0): correctness=1 misses=1179

TEST_TRANS_RESULTS=1:1179
Zyjewbuntu:-/Documents/project2-handouts ./test-trans -M 61 -N 67

Function 0 (1 total)
Step 1: Validating and generating memory traces
Step 2: Evaluating performance (s-5, E=1, b-5)
func 0 (Transpose submission): hits:6264, misses:1993, evictions:1961

Summary for official submission (func 0): correctness=1 misses=1993

TEST_TRANS_RESULTS=1:1993
```

Figure 6: Running Results for 3 sizes

3 Conclusion

3.1 Problems

In Project 2 Understanding Cache Memories, we encounter many difficulties and problems and solve them in the end, and we list the problems below:

- In Part A, building the structure of the cache simulator is somewhat difficult in the beginning, and it takes some effort to further understand the cache and construct the code structure.
- In Part B, the first problem is that why **Blocking** technique works. After we dig into this technique and understand the principle of **Blocking**, we actually know how to optimize the function further.
- In Part B, when we are optimizing $A_{64\times64}$, it's difficult to get the full score, and after many experiments we propose **LS**(load and use) to improve the performance further.

3.2 Achievements

Our achievements in this project include:

- In Part A, we successfully simulates the cache by constructing a cache simulator which works the same as **csim-ref**. What's more, we visualize the structure of our codes.
- In Part B, we propose three techniques: Blocking, Read All Only Once, Save and Load and introduce the principles of them in detail.
- In Part B, we achieve the full score performance on all matrix sizes: 32×32 , 64×64 , 61×67 . And we do a number of experiments to compare different techniques.
- In both Part A and Part B, we write the codes with readability, which means our codes are explained very specifically.

The total evaluation of two parts is shown below, using driver.py, which shows our simulator and the optimized function both work well.

Figure 7: Total Evaluation for Part A and Part B

4 Acknowledgements

- Thanks for the teacher of CS359, Prof.Yanyan Shen to teach us the basic knowledge of the cache and give us the chance to do this interesting project.
- Thanks for Bryant and other writers of CS:APP, who provide the material about Blocking and the basic design of the challenging lab.
- Thanks for my roommate David Guo to give some hints and guidance to understand the cache well.

References

- [1] Cache associativity. http://csillustrated.berkeley.edu/PDFs/handouts/cache-3-associativity-handout.pdf.
- [2] R. E.Bryant and D. R. O. Hallaron. Cs:app2e web aside mem:blocking: Using blocking to increase temporal locality, 2012.