## **CS203 Midterm Review**

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## **Performance**

#### 1. Intro

For a single program,

$$Performance = rac{1}{ET}, ET = IC imes CPI imes CT, CT = rac{1}{frequency}$$

$$TFLOPS = rac{\#flops imes 10^{-12}}{ET} = rac{\%flops}{CPI imes CT}$$

IC is ignored, but with more iterations we might have larger datasets which potentially changes IC. It is better to consider all 3 factors.

- Goodput(Inference/Frames per second) vs Throughput(Bandwidth/IOPS/FLOPS) vs Latency(time)
- Benchmark suite: same program with same result and validate result from different machines

$$Energy = Power \times ET$$

Generally speaking, higher the power consumption, lower the time, leading to less energy(more efficient), even if with higher cooling cost.  $CO_2e$  is roughly proportional to Energy.

#### 2. Factors

- PLs: Java runs code in JVM, which translates virtual class code into physical machine code. So it is the most costly.
- Programmers: Can set cycle time; can reduce CPI; but usually increase IC.
- Compilers: Usually reduce IC, but CPI grows higher. No guarantee for performance.
- Complexity: Not every machine instruction takes the same amount of time; not every abstraction operation takes the same amount of time.

## 3. Speedup

Definition:

$$n = rac{ET_x}{ET_y}, Speedup = rac{ET_x}{ET_y}$$

• Amdahl's Law:

$$Speedup(f_1,\ldots,f_n,s_1,\ldots,s_n) = rac{1}{(1-\sum_i^n f_i) + \sum_i^n rac{f_i}{s_i}}$$

- Corollary:
  - 1. Each optimization has an upper bound  $\frac{1}{1-f}$ .
  - 2. Make the common case(most costly part) fast.
  - 3. Optimization has a moving target( $f_i$  and  $s_i$ , count separately or together).
  - 4. Parallelism is the key, but single-core performance still matters  $\frac{1}{1-f_{parallelizable}} = \frac{1}{f_{unparallelizable}}.$
  - 5. Don't hurt the non-common case too much  $(\frac{1}{\frac{(1-f)}{perf(r)} + \frac{f}{s}})$ .

# **Memory Basic**

1. In von Neumann Architecture machine, instruction are also from memory. So all instructions need to fetch from memory at least once, some memory loads/stores fetch again.

$$CPI_{avg} = 1 + (100\% + \% Memory\ Instruction) imes (CPI_{hit} + Miss\ Rate imes CPI_{miss\ penalty})$$

- 2. Locality
  - Spatial: Consecutive
    - Code: Sequential execution
    - Data: Sequential access
  - Temporal: Frequently
    - Code: Loops, frequently invoked functions.
    - Data: Reused data
- 3. Cache Design
  - Valid Bit & Dirty Bit
    - Hit
      - Read: Return data
      - Write: Update in L1 & set DIRTY
    - Miss: Load data from lower-level memory &
      - If still empty blocks(not VALID): place there
      - Else: Select a victim block(LRU)
        - If victim block is DIRTY & VALID: write back
          - If write-back or fetching causes any miss, repeat?
      - If Write: Update in L1 & set DIRTY (write-allocate)

- 2. Block size == Line size,
- 3. Tag Array: Hash table, reduce searching cost(approximately O(1), but in fact $O(\log(n))$ ).
- 4. Way-associativity: Tolerate some collision cases.
- 5. | tag | set index | block offset | Why this design?
  - 1. A line should be consecutive -> offset left
  - 2. Adjacent line should correspond to different sets -> index middle
- 6. Formula:

$$Capacity = Associativity imes Blocksize imes \#Sets$$
  $\#bits(block\ offset) = \log(B)$   $\#bits(set\ index) = \log(S)$   $\#bits(tag) = address\_length - \log(S) - \log(B)$   $set\ index = (address/blocksize)\%S$ 

# **Memory Optimizations**

#### 1.3Cs

- Compulsory: Cold start miss & First-time access
- Capacity: Working set size(size of visited cache block before the next reuse of the current block) bigger than cache size(capacity). It also shows conflict but in a manyto-many manner.
- Conflict: Collision in hash, mapping to the same set(associativity), even if there are enough space for working set.

## 2. 3Cs & A, B, C

- Without changing B & C, increasing A can reduce conflict misses but make each cache hit slower(need to compare more tags). Also need more power.
- Without changing A & C, increasing B can reduce compulsory miss but potentially lead to more conflict misses(meanwhile reducing S). It will also make each cache miss slower(with constant bandwidth, more memory needs to be fetched).
- Without changing A & B, increasing C can reduce capacity misses but make each cache hit slower(more bits). Also more costly and need more power.

## 3. Prefetch

- Fetch next block of data before using the current one.
- Hardware: The processor can keep track the distance between misses. It will overlap
  calculating and fetching(instead of exclusively waiting for data) by triggering the
  cache miss earlier to reduce miss penalty.
- Software

- x86 instruction: \_mm\_prefetch
- gcc flag: -fprefetch-loop-arrays
- But sometimes it won't bring benefit due to conflict miss or something else.

### 4. Stream buffer

- 1. Captures the prefetched blocks
- 2. Fully associative & Consult when miss & Retrieve if found
- 3. Reduce compulsory misses & Avoid conflict misses triggered by prefetching

### 5. Miss cache

- 1. Captures the missing blocks
- 2. Fully associative & Consult when miss & Retrieve if found
- 3. Reduce conflict misses

### 6. Victim cache

- 1. Captures the evicted blocks
- 2. Fully associative & Consult when miss & Swap if found
- 3. Better than miss cache

## 7. Programmable alongside buffer

- 1. Prefetching won't cause conflict misses
- 2. Virtually add an associative set to frequently used data
- 3. Need additional search time and power, but reduce power consumption overall(hit better than miss).
- 8. Multi-banked & non-blocking cache: Overlaps memory latency between different banks(but no benefit for query in same bank).
- 9. Early restart
  - As soon as the request word of the block arrives, send it to CPU letting it continue execution, instead of waiting for the whole block finished.
  - Useful with large blocks, but not a benefit if we want the next sequential word.
- 10. Critical word first / Warped fetch and requested word first
- Request the exact word first from memory and send it to CPU immediately. Let CPU continue execution while filling the rest of the block.
- Useful with large blocks

### 11. Write buffer

- Write back always requires a period of time writing dirty data back to memory before fetching a new conflicted one.
- Use a small piece of cache buffer to store the evicted data immediately and then it writes to memory asynchronously. Additionally, there are chances to merge adjacent

### write in write buffer.

## 12. Hardware optimizations

1. Prefetch: Compulsory

2. Write buffer: Miss penalty

3. Bank/pipeline: Miss penalty

4. Critical word first & Early restart: Miss penalty

## 13. Software optimizations

1. Data layout: 3Cs

2. Loop interchange: Conflict/Capacity miss

3. Loop fission: Conflict miss(when cache has limited way associativity)

4. Loop fusion: Capacity miss(when cache has enough way associativity)

5. Blocking/Tiling: Capacity miss(smaller working set), conflict miss(fewer rows)

6. Matrix transpose: Conflict miss

7. Use register whenever possible: Reduce memory access(but check commutativity and associativity carefully!)

8. Software prefetching

9. Sometimes with lower miss rate resulting higher CPI -> some vectorization issues

10. Lowest miss rate does not result fastest -> loop overhead causing high IC

## **VM**

## 1. Purpose

- 1. Abstraction for memory space(unified memory representation)
- 2. Share physical memory with protection & isolation
- Allow applications work while memory is smaller than working set(different machines / multiple programs)

## 2. Mechanism: page

- 1. Mapped by OS & hardware
- 2. On demand
- 3. Physical memory is a cache for virtual memory, storage is a lower level for physical memory(swap).
- 4. Fully-associate, page size = block size, page table = tag array

## 3. Address translation

- 1. Page table: Individual in each process, maintained by OS
- 2. Multi-level page table

• 
$$\#PTE = \frac{page\ size}{sizeof(entry)}$$

•  $\#levels = \lceil \log_{2^e ntries} \frac{memory\ space\ size}{page\ size} \rceil$ , 6 for 64-bit 4KB machine and 4 for x86-64(48 meaningful bits).

3. Data structure: B-tree (quick for both searching and inserting)

#### 4. TLB

- 1. Cache frequently used page table entries
- 2. TLB + Virtual cache? Conflict issues(different programs use same virtual address; a program use aliasing virtual address pointing to the same physical address). L1 cache represents physical memory, ONLY physical address is suitable.
- 3. Virtually indexed & physical tagged cache
  - 1. Offset unchanged, ignore it: |P tag|P index| & |V tag|V index|
  - 2. L1 cache uses physical address(both tag and index)
  - 3. Entries translate: virtual address -> physical address
  - 4. VM do not use V index to diverse pages(fully associate, all in one set).
  - 5. Thus, VM can use index as PM's index. In other words, they can be consistent.
  - 6. Only |V\_tag| -> |P\_tag| is needed.
  - 7. Question: Will this harm fully-associate?
- Further caching
  - 1. TLB miss is expensive
  - MMU have caches but not optimized for TLB(although TLB is almost the most important)
  - 3. Page Table Caches(AMD): Caches the address of Page Table Nodes
    - 1. Unified: Share same space
    - Split: Each level get a private cache location
  - 4. Translation caching(Intel): Indexed by the prefix of virtual address (multi-level match)
    - Pros: Allowing each level lookup to perform independently, in parallel
    - Cons: Less space efficient

# **Pipeline**

- 1. Lifetime of instruction
  - 1. IF
  - 2. ID
  - 3. **EX**
  - 4. MEM(read/write)
  - 5. WB(register)
  - 6. Update PC
- Pipelining design
  - 1. ILP
  - 2. Clock synchronize among stages
  - Pipeline register between stages

- 3. Throughput
  - "single-cycle and sequential" -> "multi-stage but sequential" -> "multi-stage and pipelined"
  - 2. Shorter cycle time
  - 3. Theoretical CPI remains the same
- 4. Pipeline hazards
  - 1. Structural hazards: Resource conflicts(register file, memory)
  - 2. Control hazards: PC changed by instruction
  - 3. Data hazard: Instruction use data that has not yet generated/propagated
- 5. Solution
  - 1. Universal: Stall
  - 2. Structural hazards
    - 1. ID&WB: Write early, read late (in register file)
    - 2. MEM&IF: Split L1 cache
    - 3. WB&WB: Multibanks&non-blocking caches

# **Assignments**

- 1. Latency(cycles) should be integer.
- 2. Miss rate lower than estimated: hardware prefetcher.
- 3. Miss penalty(cycles):

$$\#\ of\ Cycles = \sum_{case=hit, miss, other} \#\ of\ Cycles_{case} = \#\ of\ Cycles_{other} + \sum_{case=hit, miss} CPI_{case} imes ICPI_{case} imes ICPI_{case}$$

$$\begin{split} \sum_{case=hit,miss} CPI_{case} \times IC &= CPI_{hit} \times IC_{hit} + CPI_{miss} \times IC_{miss} \\ &= CPI_{hit} \times IC_{hit} + (CPI_{hit} + CPI_{miss\ penalty}) \times IC_{miss} \\ &= CPI_{hit} \times IC_{mem} + CPI_{miss\ penalty} \times IC_{miss} \\ &= CPI_{hit} \times IC_{mem} + CPI_{miss\ penalty} \times IC_{mem} \times Miss\ Rate \\ &= IC_{mem} \times (CPI_{hit} + CPI_{miss\ penalty} \times Miss\ Rate) \end{split}$$

Note that  $IC_{mem} = \# \ of \ Memory \ Accesses$ , thus

$$\# \ \mathbf{of} \ \mathbf{Cycles} = \# \ of \ Cycles_{other} + \# \ of \ Memory \ Accesses \ (CPI_{hit} + CPI_{miss \ penalty} \times Miss \ Rate$$

For these cases above,  $CPI_{hit}$ , # of  $Cycles_{other}$ , # of  $Memory\ Accesses$  are almost the same.

$$CPI_{miss\ penalty} = rac{\#\ of\ Cycles_2 - \#\ of\ Cycles_1}{\#\ of\ Memory\ Accesses_2 - \#\ of\ Memory\ Accesses_1}$$

And the number of cycles can be devided by IC,

$$CPI_{avg} = rac{\#\ of\ Cycles_{other}}{IC_{total}} + rac{\#\ of\ Memory\ Accesses}{IC_{total}} imes (CPI_{hit} + CPI_{miss\ penalty} imes Miss\ Rate)$$

Thus,

$$oldsymbol{\Delta CPI_{avg}} = \Delta CPI_{miss\ penalty} imes rac{\#\ of\ Memory\ Accesses}{IC_{total}} imes Miss\ Rate$$

4. Conflict gap

Number of sets:

$$C = A imes BlockSize imes S 
ightarrow S = rac{C}{A imes BlockSize}$$

The address gap between two closest conflicting cache blocks in an associative cache is

$$Gap = BlockSize \times S$$

Thus,

$$B = A + Gap imes k, k \in \mathbb{Z}$$

More rigorously, any address within the corresponding block (any offset) is acceptable.

$$B = \lfloor rac{A}{Linesize} 
floor imes Linesize + Gap imes k + t, k \in \mathbb{Z}, t \in \mathbb{Z} \cap [0, Linesize)$$

- 5. L1&L2 TLB is in L1 cache, when L2 TLB miss, it happens to be a TLB miss.
- 6. Compiler will automatically align in structures.
- 7. Static instructions: loop instructions in static code; dynamic instructions: loop instructions when running many times