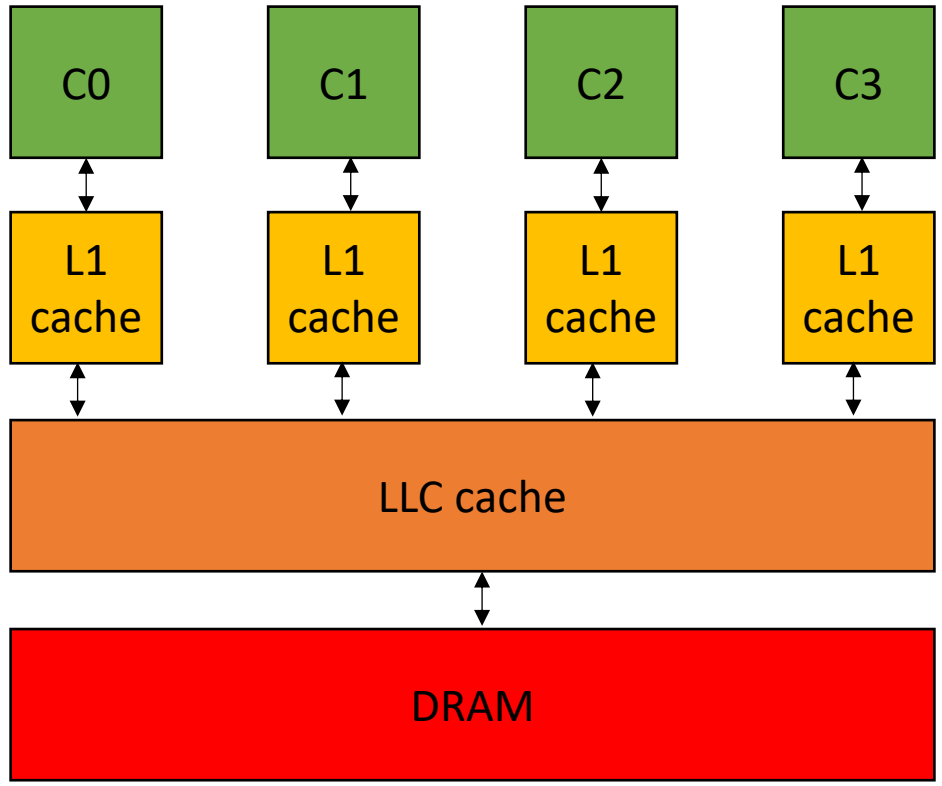
CSE113: Parallel Programming

- **Topic**: Architecture and Compiler Overview
  - Programming Language to ISA compilation
  - 3-address code
  - multiprocessors
  - memory hierarchy



Announcements

- Homework 1 released tonight (or Thursday)!
  - A week to do it
  - 3 free late days
- It will utilize github classroom and docker. There is a tutorial assignment. Please do it! (not graded, but you are expected to know it)
- Solutions require a design doc.
  - Not harshly graded but liable to lose points for low-effort
  - Forces you to think about your solution before you start

Announcements

- Instrcutor and TAs: Office hours announced on the webpage
- Tutors: Office hours announced by Thursday.

Quiz – Getting to know your classmates

What year are you in your studies?

Jr.	29 respondents	**32 %**
Sr.	63 respondents	68 %
Grad Student		0 %

Quiz – Getting to know your classmates

Python	90 respondents	**98 %** ✓
C	91 respondents	99 %
C++	78 respondents	85 %
JavaScript	56 respondents	61 %
GPU Programming	5 respondents	5 %
Docker	32 respondents	35 %
Unix command line	85 respondents	92 %
console text editor (e.g. vim, emacs)	64 respondents	70 %

Review

In a perfect world...

- Historically this worked well

The negotiators:
Specifications
Compiles
Runtimes
Interpreters

- Dennard's scaling:
  - Computer speed doubles every 1.5 years.

2003

700 MHz

3x ***increase***
over 4 years

2007

2.1 GHz

However…

These trends slowed down in ~2007

The negotiators:
Specifications
Compiles
Runtimes
Interpreters

2007
2.1 GHz

2 cores

1.2x increase
over 10 years

2017
2.5 GHz

4 cores

Compiler refresher

Compilation:

Language


```
int add(int a, int b) {
    return a + b;
}
```

Officially defined by the specification

ISO standard: costs $200

~1400 pages


```
add(int, int): # @add(int, int)
push rbp
mov rbp, rsp
mov dword ptr [rbp - 4], edi
mov dword ptr [rbp - 8], esi
mov eax, dword ptr [rbp - 4]
add eax, dword ptr [rbp - 8]
pop rbp
ret
```

official specification

Intel provides a specification: *free*

2200 pages

Compilation:

Language


```
int add(int a, int b) {
    return a + b;
}
```


```
add(int, int):
sub sp, sp, #16
str w0, [sp, #12]
str w1, [sp, #8]
ldr w8, [sp, #12]
ldr w9, [sp, #8]
add w0, w8, w9
add sp, sp, #16
ret
```

Officially defined by the specification

ISO standard: costs $200

~1400 pages

How about a more complicated program?

Quadratic formula

$$x = \frac{-b \pm \sqrt{b^2 - 4ac}}{2a}$$

```
x = (-b - sqrt(b*b - 4 * a * c)) / (2*a)
```

official specification

Intel provides a specification: *free*

2200 pages

There is not an ISA instruction that combines all these instructions!

Simplify this code:

post-order traversal, using temporary variables

```
r0 = neg(b);
r1 = b * b;
r2 = 4 * a;
r3 = r2 * c;
r4 = r1 - r3;
r5 = sqrt(r4);
r6 = r0 - r5;
r7 = 2 * a;
r8 = r6 / r7;
x  = r8;
```

- This is not exactly an ISA
  - unlimited registers
  - not always a 1-1 mapping of instructions.
- but it is much easier to translate to the ISA
- We call this an intermediate representation, or IR
- Examples of IR: LLVM, SPIR-V

Memory accesses

```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

Unless explicitly expressed in the programming language, loads and stores are split into multiple instructions!

New material – Instruction Level Parallelism

Instruction-level Parallelism (ILP)

- Parallelism from a **single stream of instructions**.
  - Output of program must match exactly a sequential execution!

- Widely applicable:
  - most mainstream programming languages are **sequential**
  - most deployed **hardware** has components to execute ILP

- Done by a combination of **programmer, compiler, and hardware**

Instruction-level Parallelism (ILP)

- What type of instructions can be done in parallel?

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two instructions can be executed in parallel if they are independent

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two instructions can be executed in parallel if they are ***independent***

```
x = z + w;
a = b + c;
```

Two instructions are independent if the ***operand registers*** *are disjoint from the* ***result registers***

(assume all letter variables are registers)

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Two instructions are independent if the operand registers are disjoint from the result registers

(assume all letter variables are registers)

instructions that are not independent cannot be executed in parallel

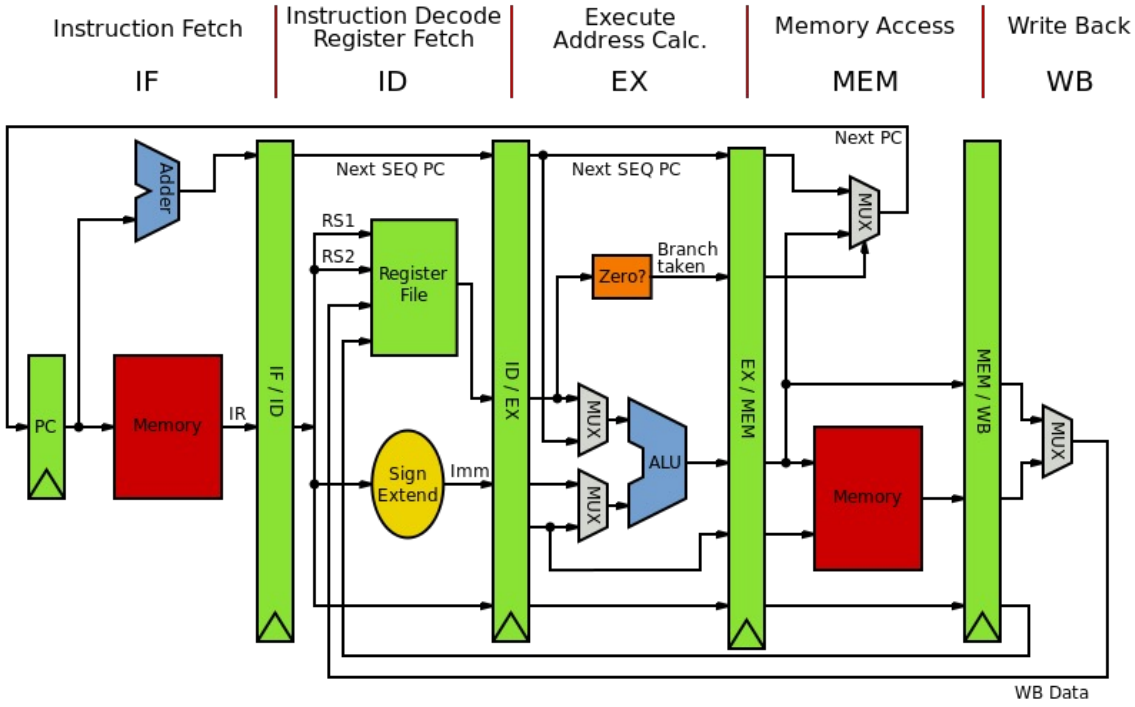
```
x = z + w;
a = b + x;
```

*Many times, dependencies can be easily tracked in the **compiler**:*

How can hardware execute ILP?

- Pipeline parallelism

- Abstract mental model:
  - N-stage **pipeline**
  - N instructions can be in-flight
  - **Dependencies stall** pipeline



MIPS pipeline image from:
https://commons.wikimedia.org/wiki/Pipeline_(computer_hardware)

Pipeline

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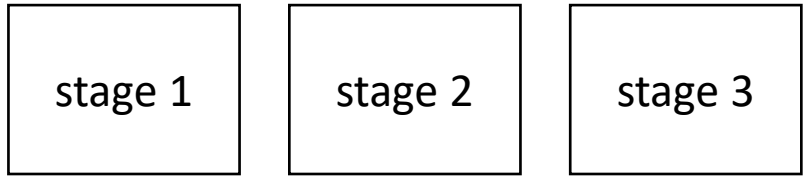


```
instr1;
instr2;
instr3;
```

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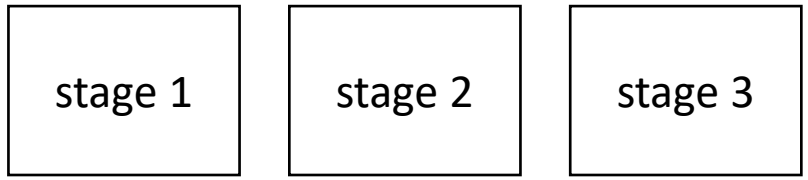


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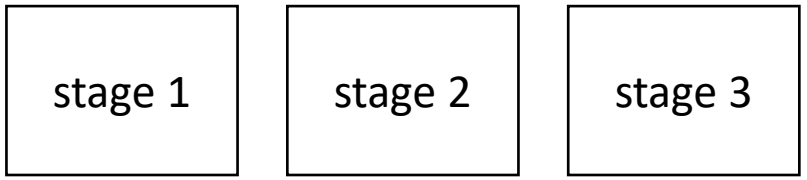


```
instr2;    instr1;
```

```
instr3;
```

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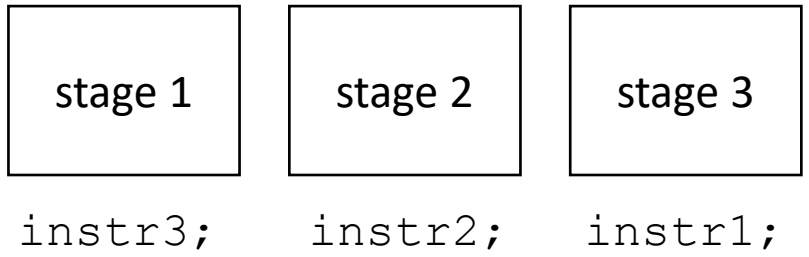

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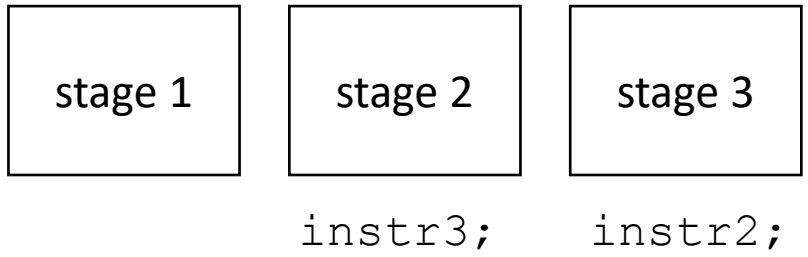

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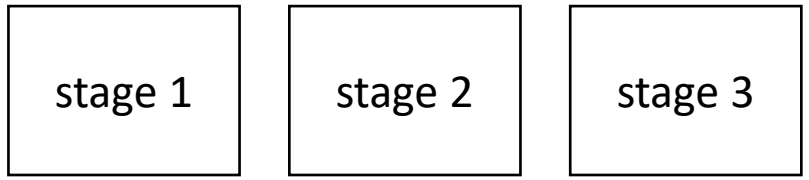


```
instr3;
```

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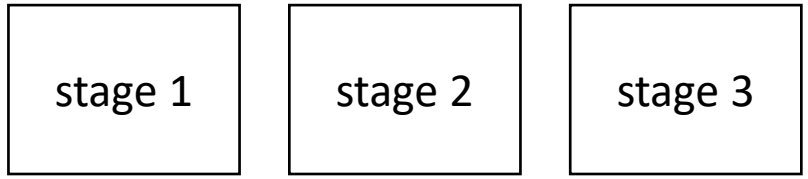

6 cycles for 3 independent instructions

Converges 1 instruction per cycle

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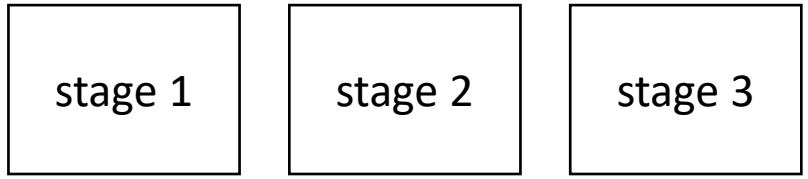


```
instr1;
instr2;
instr3;
```

What if the instructions depend on each other?

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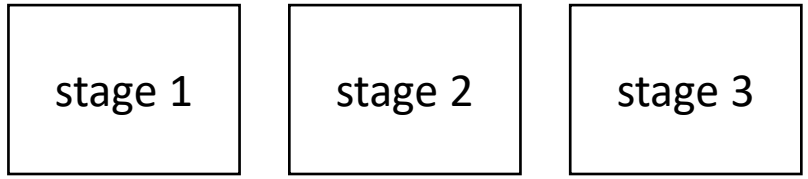


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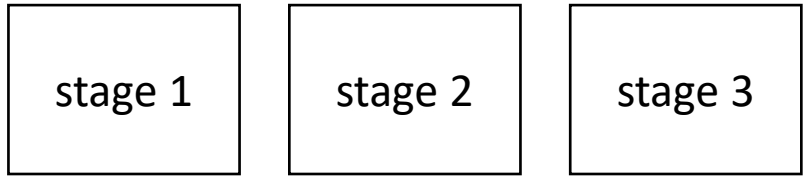


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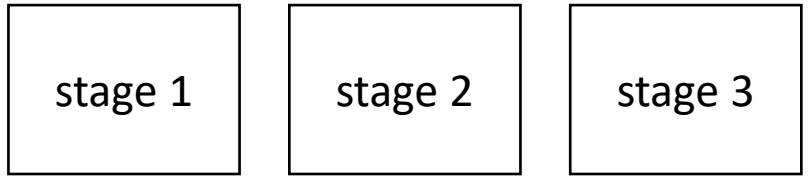


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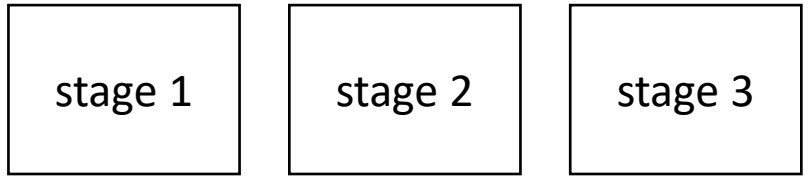


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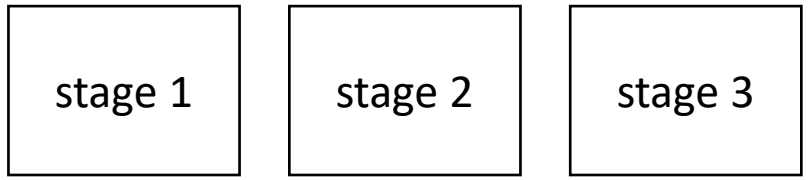


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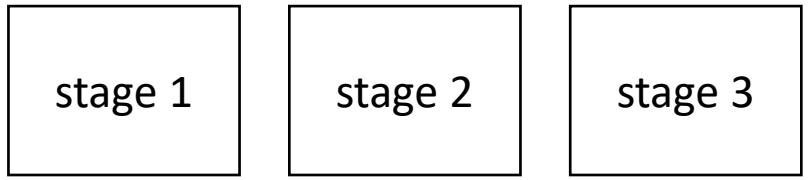


```
instr2;
```

```
instr3;
```

and so on…

What if the instructions depend on each other?

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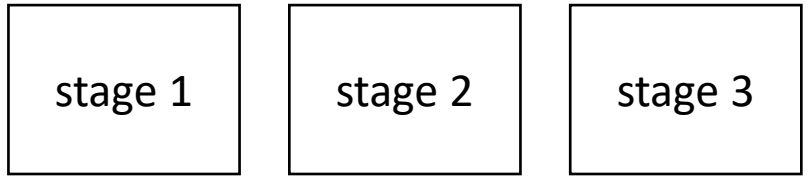

What if the instructions depend on each other?

9 cycles for 3 instructions

converges to 3 cycles per instruction

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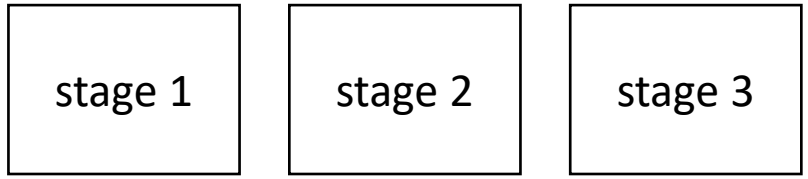


```
instr1;
instrX0;
instrX1;
instr2;
instrX2;
instrX3;
instr3;
```

If there are non-dependent instructions from other places in the program that we can interleave then we can get back performance!

Pipeline

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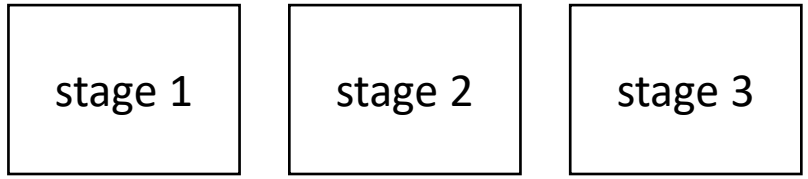


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```
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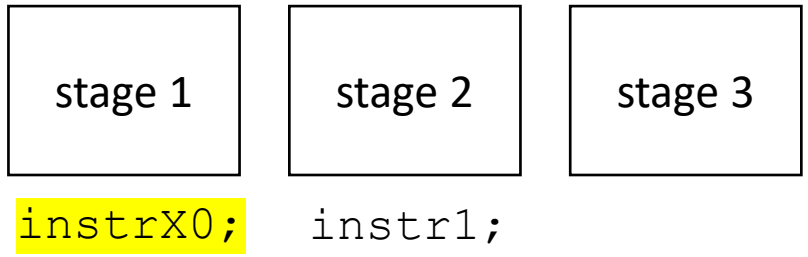


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instr2;
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instrX2;
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```
instrX2;
instrX3;
instr3;
```

and so on...

We converge to 1 cycle per instruction again!

If there are non-dependent instructions from other places in the program that we can interleave then we can get back performance!

How can hardware execute ILP?

- Executing multiple instructions at once:

- Very Long Instruction Word (VLIW) architecture
  - Multiple instructions are combined into one by the compiler

- Superscalar architecture:
  - Several sequential operations are issued in parallel

How can hardware execute ILP?

- Executing multiple instructions at once:

- Superscalar architecture:
  - Several sequential operations are issued in parallel
  - hardware detects dependencies

issue-width is maximum number of instructions that can be issued in parallel

```
instr0;
instr1;
instr2;
```

How can hardware execute ILP?

- Executing multiple instructions at once:

- Superscalar architecture:
  - Several sequential operations are issued in parallel
  - hardware detects dependencies

issue-width is maximum number of instructions that can be issued in parallel

```
instr0;
instr1;
instr2;
```

if instr0 and instr1 are independent, they will be issued in parallel

Independent Instructions

- Out-of-order execution
  - Hardware looks ahead for independent instructions
  - Hardware delays dependent instructions

What does this look like in the real world?

- Intel Haswell (2013):
  - Issue width of 4
  - 14-19 stage pipeline
  - OoO execution
- Intel Nehalem (2008)
  - 20-24 stage pipeline
  - Issue width of 2-4
  - OoO execution
- ARM
  - V7 has 3 stage pipeline; Cortex V8 has 13
  - Cortex V8 has issue width of 2
  - OoO execution
- RISC-V
  - Ariane and Rocket are In-Order
  - 3-6 stage pipelines
  - some super scaler implementations (BOOM)

What does this mean for us?

- We should have an abstract performance model for instruction scheduling (the order of instructions)
- Try not to place dependent instructions in sequence
- Many times the compiler will help us here, but sometimes it cannot!

Two techniques to optimize for ILP

- Independent for loops (loop unrolling)
- Reduction for loops (loop unrolling)

What is loop unrolling?

```
for (int i = 0;  i < 12;  i++) {
  a[i] = b[i] + c[i];
}
```

Can we unroll this loop?
Data and control dependencies

```
for (int i = 0;  i < 6;  i+=2) {
  a[i] = b[i] + c[i];
  a[i+1] = b[i+1] + c[i+1];
}
```

Using Loop Unrolling to Exploit ILP

- for loops with independent chains of computation

```
for (int i = 0; i < SIZE; i++) {
    SEQ(i);
}
```

where:

```
SEQ(i) = instr1;
         instr2;
         ...
         a[i] = instrN;
```

and let instr(N) depends on instr(N-1)

loops only write to memory addressed by the loop variable

Using Loop Unrolling to Exploit ILP

- Simple loop unrolling:

```
for (int i = 0; i < SIZE; i+=2) {
    SEQ(i);
    SEQ(i+1);
}
```

Saves one addition and one comparison per loop, but doesn't help with ILP

Using Loop Unrolling to Exploit ILP

- Simple loop unrolling:

```
for (int i = 0; i < SIZE; i+=2) {
    SEQ(i);
    SEQ(i+1);
}
```

Let green highlights indicate instructions from iteration `i`.

Let blue highlights indicate instructions from iteration `i + 1`.

Using Loop Unrolling to Exploit ILP

- Simple loop unrolling:

```
for (int i = 0; i < SIZE; i+=2) {
    SEQ(i);
    SEQ(i+1);
}
```

Let `SEQ(i,j)` be the jth instruction of `SEQ(i)`.

Let each instruction chain have N instructions

Using Loop Unrolling to Exploit ILP

- Simple loop unrolling:

```
for (int i = 0; i < SIZE; i+=2) {
     SEQ(i,1);
     SEQ(i,2);
     ...
     SEQ(i,N); // end iteration for i
     SEQ(i+1,1);
     SEQ(i+1,2);
     ...
     SEQ(i+1, N); // end iteration for i + 1
}
```

Let `SEQ(i,j)` be the jth instruction of `SEQ(i)`.

Let each instruction chain have N instructions

Using Loop Unrolling to Exploit ILP

- Simple loop unrolling:

```
for (int i = 0; i < SIZE; i+=2) {
    SEQ(i,1);
    SEQ(i+1,1);
    SEQ(i,2);
    SEQ(i+1,2);
    ...
    SEQ(i,N);
    SEQ(i+1, N);
}
```

They can be interleaved

Using Loop Unrolling to Exploit ILP

- Simple loop unrolling:

```
for (int i = 0; i < SIZE; i+=2) {
    SEQ(i,1);
    SEQ(i+1,1);
    SEQ(i,2);
    SEQ(i+1,2);
    ...
    SEQ(i,N);
    SEQ(i+1, N);
}
```

They can be interleaved

two instructions can be pipelined, or executed on a superscalar processor

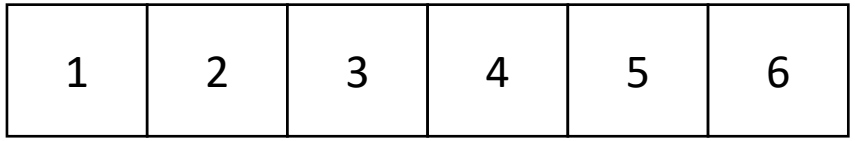
Using Loop Unrolling to Exploit ILP

- This is what you are doing in part 1 of homework 1
- You are playing the role of a compiler unrolling loops
- Your “compiler” is written in Python. You print out C++ code
- You the code is parameterized by dependency chain and by unroll factor

Loop Unrolling for Reduction Loops

- Prior approach examined loops with independent iterations and chains of dependent computations

- Now we will look at reduction loops:
  - Entire computation is dependent
  - Typically short bodies (addition, multiplication, max, min)



addition: 21

max: 6

min: 1

Loop Unrolling for Reduction Loops

- Simple implementation:

```
for (int i = 1; i < SIZE; i++) {
    a[0] = REDUCE(a[0], a[i]);
}
```

1 + 2 + 3 + 4 + 5 + 6

Loop Unrolling for Reduction Loops

- Simple implementation:

```
for (int i = 1; i < SIZE; i++) {
    a[0] = REDUCE(a[0], a[i]);
}
```

What is associativity?

(1 + 2 + 3) + (4 + 5 + 6)

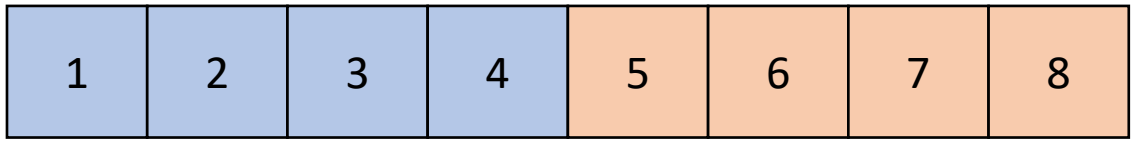
Loop Unrolling for Reduction Loops

- chunk array in equal sized partitions and do local reductions
- Consider size 2:

1	2	3	4	5	6	7	8

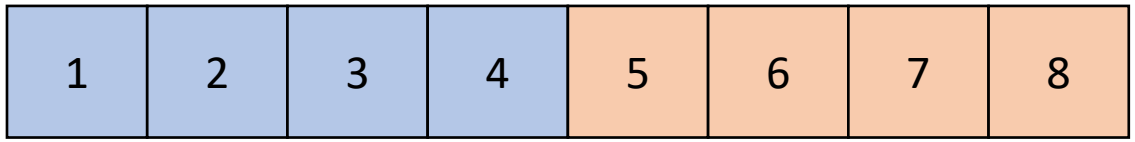
Loop Unrolling for Reduction Loops

- chunk array in equal sized partitions and do local reductions
- Consider size 2:



Loop Unrolling for Reduction Loops

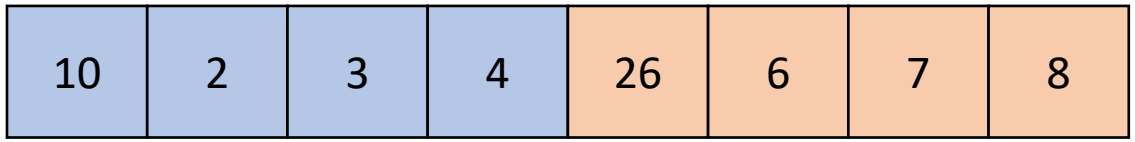
- chunk array in equal sized partitions and do local reductions
- Consider size 2:



Do addition reduction in base memory location

Loop Unrolling for Reduction Loops

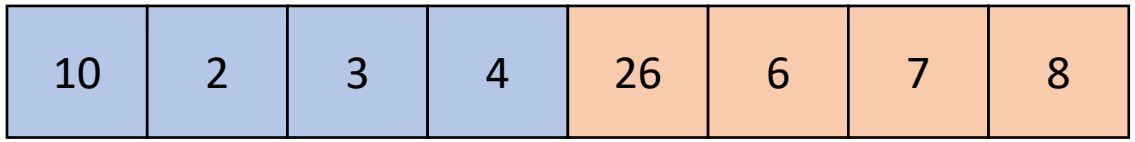
- chunk array in equal sized partitions and do local reductions
- Consider size 2:



Do addition reduction in base memory location

Loop Unrolling for Reduction Loops

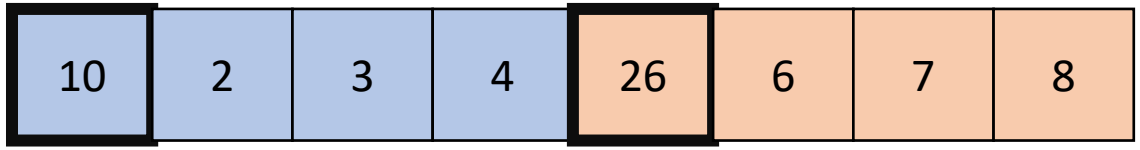
- chunk array in equal sized partitions and do local reductions
- Consider size 2:



Add together base locations

Loop Unrolling for Reduction Loops

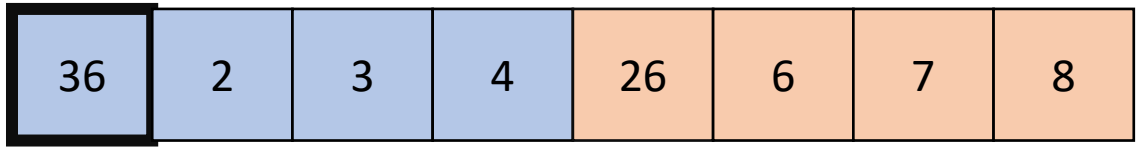
- chunk array in equal sized partitions and do local reductions
- Consider size 2:



Add together base locations

Loop Unrolling for Reduction Loops

- chunk array in equal sized partitions and do local reductions
- Consider size 2:



Add together base locations

Loop Unrolling for Reduction Loops

- Simple implementation:

```
for (int i = 1; i < SIZE/2; i++) {
    a[0] = REDUCE(a[0], a[i]);
    a[SIZE/2] = REDUCE(a[SIZE/2], a[(SIZE/2)+i]);
}

a[0] = REDUCE(a[0], a[SIZE/2])
```

Loop Unrolling for Reduction Loops

- Simple implementation:

```
for (int i = 1; i < SIZE/2; i++) {
    a[0] = REDUCE(a[0], a[i]);
    a[SIZE/2] = REDUCE(a[SIZE/2], a[(SIZE/2)+i]);
}

a[0] = REDUCE(a[0], a[SIZE/2])
```

Loop Unrolling for Reduction Loops

- Simple implementation:

```
for (int i = 1; i < SIZE/2; i++) {
    a[0] = REDUCE(a[0], a[i]);
    a[SIZE/2] = REDUCE(a[SIZE/2], a[(SIZE/2)+i]);
}

a[0] = REDUCE(a[0], a[SIZE/2])
```

independent instructions can be done in parallel!

Watch out!

- Our abstraction: separate dependent instructions as far as possible

- Pros:
  - Simple

- Cons:
  - Can lead to register spilling, causing expensive loads

consider `instr1` and `instr2` have a data dependence, and `instrX's` are independent

```
instr1;
instrX0;
instrX1;
...
Instr2;
```

independent instructions. If they overwrite the register storing `instr1's` result, then it will have to be stored to memory and retrieved before `instr2`

Watch out!

- Our abstraction: separate dependent instructions as far as possible

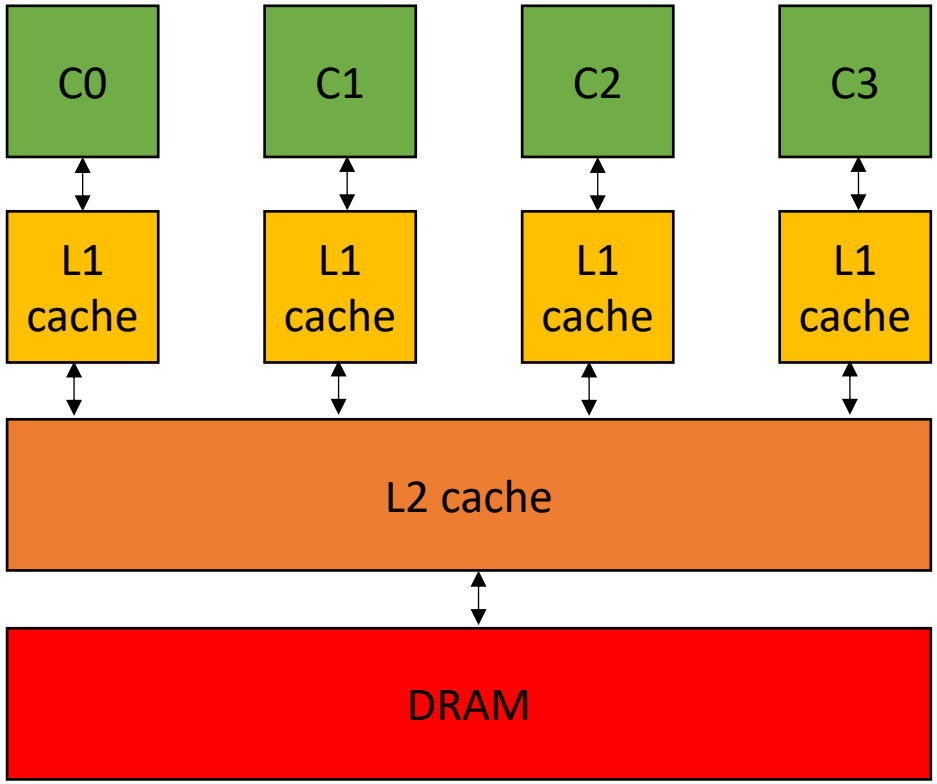
- Pros:
  - Simple

- Cons:
  - Can lead to register spilling, causing expensive loads

Solutions include using a **resource model** to guide the topological ordering. Highly architecture dependent. Compiler algorithms become more expensive.

Consider timing the compile time in your homework assignment.

Memory hierarchy overview


C0
C1
C2
C3
L1 cache
L1 cache
L1 cache
L1 cache
L2 cache
DRAM

Core

A core executes a stream
of sequential ISA instructions

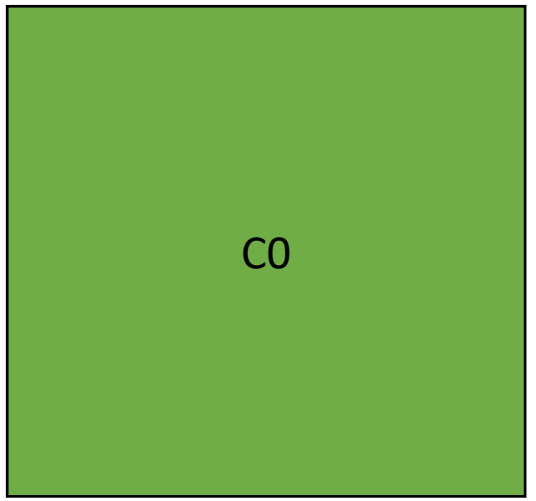
A good mental model executes
1 ISA instruction per cycle

3 Ghz means 3B cycles per second
1 ISA instruction takes .33 ns

Compiled function #0

```
13        movd    eax, xmm0
14        xor     eax, 2147483648
15        movd    xmm0, eax
16        movss   dword ptr [rbp - 16], xmm0
17        movss   xmm0, dword ptr [rbp - 8]
18        mulss   xmm0, dword ptr [rbp - 8]
19        movss   xmm1, dword ptr [rip + .LCPI0_1]
20        mulss   xmm1, dword ptr [rbp - 4]
21        mulss   xmm1, dword ptr [rbp - 12]
22        subss   xmm0, xmm1
23        call    sqrt(float)
24        movaps  xmm1, xmm0
25        movss   xmm0, dword ptr [rbp - 16]
26        subss   xmm0, xmm1
27        movss   xmm1, dword ptr [rip + .LCPI0_0]
28        mulss   xmm1, dword ptr [rbp - 4]
29        divss   xmm0, xmm1
```

Thread 0



Core

Core

Sometimes multiple programs want to share the same core.

Compiled function #0

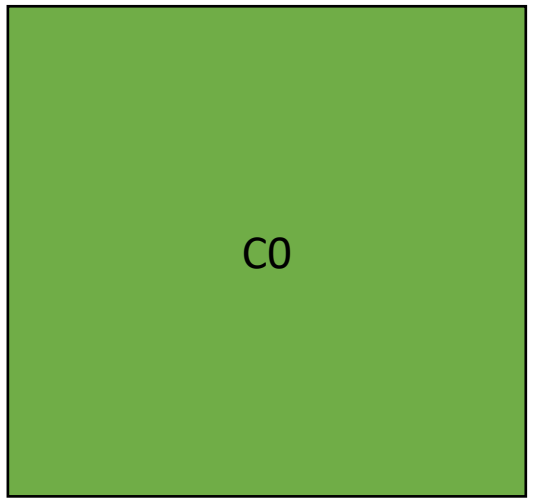
```
13      movd    eax, xmm0
14      xor     eax, 2147483648
15      movd    xmm0, eax
16      movss   dword ptr [rbp - 16], xmm0
17      movss   xmm0, dword ptr [rbp - 8]
18      mulss   xmm0, dword ptr [rbp - 8]
19      movss   xmm1, dword ptr [rip + .LCPI0_1]
20      mulss   xmm1, dword ptr [rbp - 4]
21      mulss   xmm1, dword ptr [rbp - 12]
22      subss   xmm0, xmm1
23      call    sqrt(float)
24      movaps  xmm1, xmm0
25      movss   xmm0, dword ptr [rbp - 16]
26      subss   xmm0, xmm1
27      movss   xmm1, dword ptr [rip + .LCPI0_0]
28      mulss   xmm1, dword ptr [rbp - 4]
29      divss   xmm0, xmm1
```

Thread 0

Compiled function #1

```
        movss   xmm0, dword ptr [rbp - 8]
        mulss   xmm0, dword ptr [rbp - 8]
        movss   xmm1, dword ptr [rip + .LCPI0_1]
        mulss   xmm1, dword ptr [rbp - 4]
        mulss   xmm1, dword ptr [rbp - 12]
        subss   xmm0, xmm1
        call    sqrt(float)
        movaps  xmm1, xmm0
        movss   xmm0, dword ptr [rbp - 16]
        subss   xmm0, xmm1
        movss   xmm1, dword ptr [rip + .LCPI0_0]
        mulss   xmm1, dword ptr [rbp - 4]
        divss   xmm0, xmm1
        add     rsp, 16
```

Thread 1



Core

Core

Sometimes multiple programs want to share the same core.

Compiled function #0

```
13      movd    eax, xmm0
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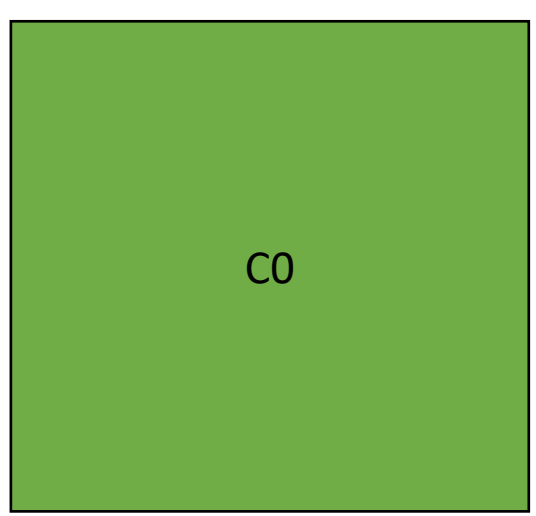
17      movss   xmm0, dword ptr [rbp - 8]
18      mulss   xmm0, dword ptr [rbp - 8]
19      movss   xmm1, dword ptr [rip + .LCPI0_1]
20      mulss   xmm1, dword ptr [rbp - 4]
21      mulss   xmm1, dword ptr [rbp - 12]
22      subss   xmm0, xmm1
23      call    sqrt(float)
24      movaps  xmm1, xmm0
25      movss   xmm0, dword ptr [rbp - 16]
26      subss   xmm0, xmm1
27      movss   xmm1, dword ptr [rip + .LCPI0_0]
28      mulss   xmm1, dword ptr [rbp - 4]
29      divss   xmm0, xmm1
```

Thread 0

Compiled function #1

```
        movss   xmm0, dword ptr [rbp - 8]
        mulss   xmm0, dword ptr [rbp - 8]
        movss   xmm1, dword ptr [rip + .LCPI0_1]
        mulss   xmm1, dword ptr [rbp - 4]
        mulss   xmm1, dword ptr [rbp - 12]
        subss   xmm0, xmm1
        call    sqrt(float)
        movaps  xmm1, xmm0
        movss   xmm0, dword ptr [rbp - 16]
        subss   xmm0, xmm1
        movss   xmm1, dword ptr [rip + .LCPI0_0]
        mulss   xmm1, dword ptr [rbp - 4]
        divss   xmm0, xmm1
        add     rsp, 16
```

Thread 1



Core

The OS can preempt a thread
(remove it from the hardware resource)

Core

Compiled function #1

```
movss   xmm0, dword ptr [rbp - 8]
mulss   xmm0, dword ptr [rbp - 8]
movss   xmm1, dword ptr [rip + .LCPI0_1]
mulss   xmm1, dword ptr [rbp - 4]
mulss   xmm1, dword ptr [rbp - 12]
subss   xmm0, xmm1
call    sqrt(float)
movaps  xmm1, xmm0
movss   xmm0, dword ptr [rbp - 16]
subss   xmm0, xmm1
movss   xmm1, dword ptr [rip + .LCPI0_0]
mulss   xmm1, dword ptr [rbp - 4]
divss   xmm0, xmm1
add     rsp, 16
```

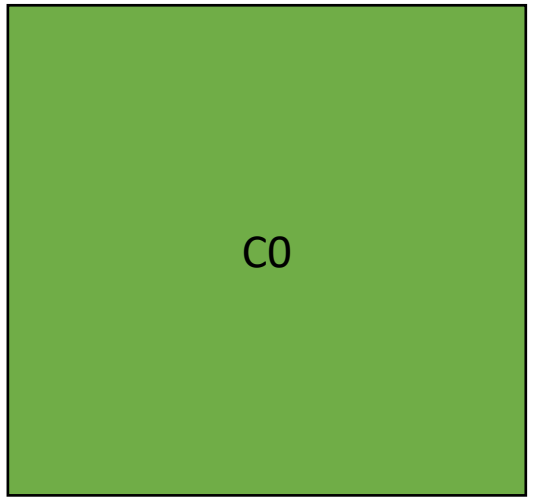
Thread 1

Compiled function #0

```
13      movd    eax, xmm0
14      xor     eax, 2147483648
15      movd    xmm0, eax
16      movss   dword ptr [rbp - 16], xmm0
17      movss   xmm0, dword ptr [rbp - 8]
18      mulss   xmm0, dword ptr [rbp - 8]
19      movss   xmm1, dword ptr [rip + .LCPI0_1]
20      mulss   xmm1, dword ptr [rbp - 4]
21      mulss   xmm1, dword ptr [rbp - 12]
22      subss   xmm0, xmm1
23      call    sqrt(float)
24      movaps  xmm1, xmm0
25      movss   xmm0, dword ptr [rbp - 16]
26      subss   xmm0, xmm1
27      movss   xmm1, dword ptr [rip + .LCPI0_0]
28      mulss   xmm1, dword ptr [rbp - 4]
29      divss   xmm0, xmm1
```

Thread 0

Sometimes multiple programs want to share the same core.



Core

And place another thread to execute

This is called concurrency: multiple threads taking turns executing on the same hardware resource

Core

Compiled function #1

```
movss   xmm0, dword ptr [rbp - 8]
mulss   xmm0, dword ptr [rbp - 8]
movss   xmm1, dword ptr [rip + .LCPI0_1]
mulss   xmm1, dword ptr [rbp - 4]
mulss   xmm1, dword ptr [rbp - 12]
subss   xmm0, xmm1
call    sqrt(float)
movaps  xmm1, xmm0
movss   xmm0, dword ptr [rbp - 16]
subss   xmm0, xmm1
movss   xmm1, dword ptr [rip + .LCPI0_0]
mulss   xmm1, dword ptr [rbp - 4]
divss   xmm0, xmm1
add     rsp, 16
```

Thread 1

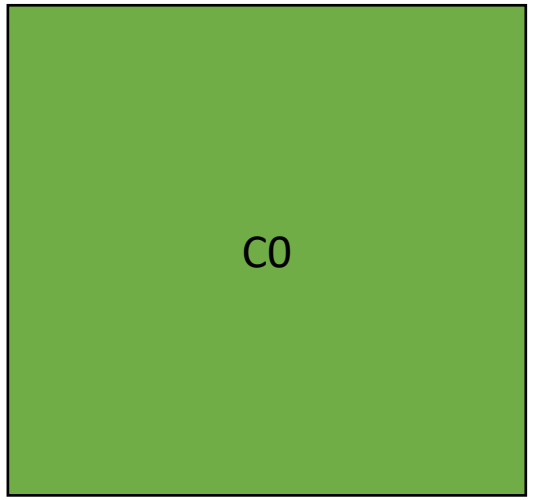
Compiled function #0

```
13      movd    eax, xmm0
14      xor     eax, 2147483648
15      movd    xmm0, eax
16      movss   dword ptr [rbp - 16], xmm0
17      movss   xmm0, dword ptr [rbp - 8]
18      mulss   xmm0, dword ptr [rbp - 8]
19      movss   xmm1, dword ptr [rip + .LCPI0_1]
20      mulss   xmm1, dword ptr [rbp - 4]
21      mulss   xmm1, dword ptr [rbp - 12]
22      subss   xmm0, xmm1
23      call    sqrt(float)
24      movaps  xmm1, xmm0
25      movss   xmm0, dword ptr [rbp - 16]
26      subss   xmm0, xmm1
27      movss   xmm1, dword ptr [rip + .LCPI0_0]
28      mulss   xmm1, dword ptr [rbp - 4]
29      divss   xmm0, xmm1
```

Thread 0

Preemption can occur:

- when a thread executes a long latency instruction
- periodically from the OS to provide fairness
- explicitly using sleep instructions



Core

And place another thread to execute

Multicores

Threads can execute simultaneously (at the same time) if there enough resources.

This is also concurrency. But when they execute at the same time, its called: parallelism.

Compiled function #0

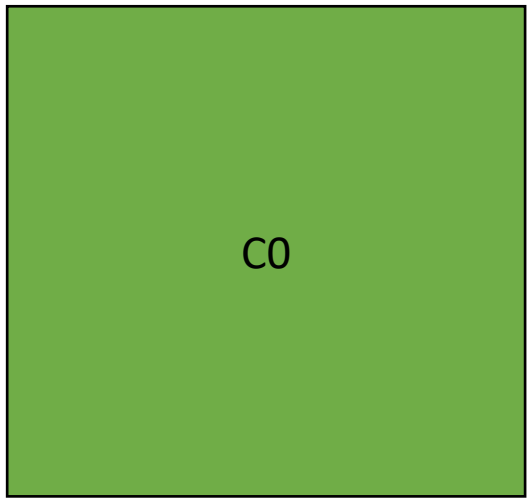
```
13        movd    eax, xmm0
14        xor     eax, 2147483648
15        movd    xmm0, eax
16        movss   dword ptr [rbp - 16], xmm0
17        movss   xmm0, dword ptr [rbp - 8]
18        mulss   xmm0, dword ptr [rbp - 8]
19        movss   xmm1, dword ptr [rip + .LCPI0_1]
20        mulss   xmm1, dword ptr [rbp - 4]
21        mulss   xmm1, dword ptr [rbp - 12]
22        subss   xmm0, xmm1
23        call    sqrt(float)
24        movaps  xmm1, xmm0
25        movss   xmm0, dword ptr [rbp - 16]
26        subss   xmm0, xmm1
27        movss   xmm1, dword ptr [rip + .LCPI0_0]
28        mulss   xmm1, dword ptr [rbp - 4]
29        divss   xmm0, xmm1
```

Thread 0

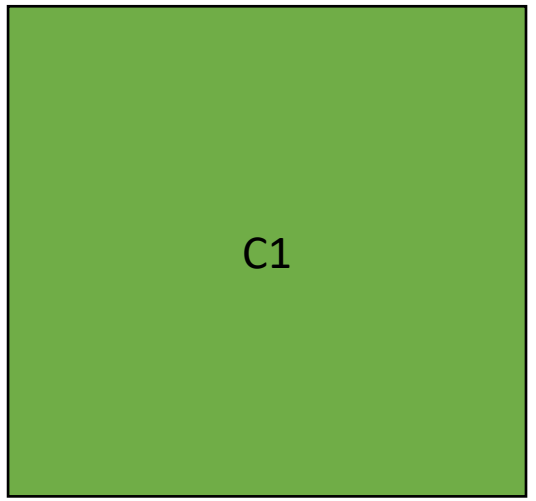
Compiled function #1

```
        movss   xmm0, dword ptr [rbp - 8]
        mulss   xmm0, dword ptr [rbp - 8]
        movss   xmm1, dword ptr [rip + .LCPI0_1]
        mulss   xmm1, dword ptr [rbp - 4]
        mulss   xmm1, dword ptr [rbp - 12]
        subss   xmm0, xmm1
        call    sqrt(float)
        movaps  xmm1, xmm0
        movss   xmm0, dword ptr [rbp - 16]
        subss   xmm0, xmm1
        movss   xmm1, dword ptr [rip + .LCPI0_0]
        mulss   xmm1, dword ptr [rbp - 4]
        divss   xmm0, xmm1
        add     rsp, 16
```

Thread 1



Core



Core

Multicores

Compiled function #0

```
13      movd    eax, xmm0
14      xor     eax, 2147483648
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16      movss   dword ptr [rbp - 16], xmm0
17      movss   xmm0, dword ptr [rbp - 8]
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20      mulss   xmm1, dword ptr [rbp - 4]
21      mulss   xmm1, dword ptr [rbp - 12]
22      subss   xmm0, xmm1
23      call    sqrt(float)
24      movaps  xmm1, xmm0
25      movss   xmm0, dword ptr [rbp - 16]
26      subss   xmm0, xmm1
27      movss   xmm1, dword ptr [rip + .LCPI0_0]
28      mulss   xmm1, dword ptr [rbp - 4]
29      divss   xmm0, xmm1
```

Thread 0

Compiled function #1

```
        movss   xmm0, dword ptr [rbp - 8]
        mulss   xmm0, dword ptr [rbp - 8]
        movss   xmm1, dword ptr [rip + .LCPI0_1]
        mulss   xmm1, dword ptr [rbp - 4]
        mulss   xmm1, dword ptr [rbp - 12]
        subss   xmm0, xmm1
        call    sqrt(float)
        movaps  xmm1, xmm0
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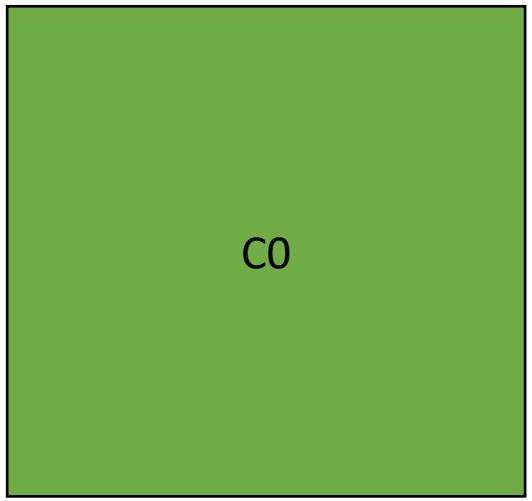
        subss   xmm0, xmm1
        movss   xmm1, dword ptr [rip + .LCPI0_0]
        mulss   xmm1, dword ptr [rbp - 4]
        divss   xmm0, xmm1
        add     rsp, 16
```

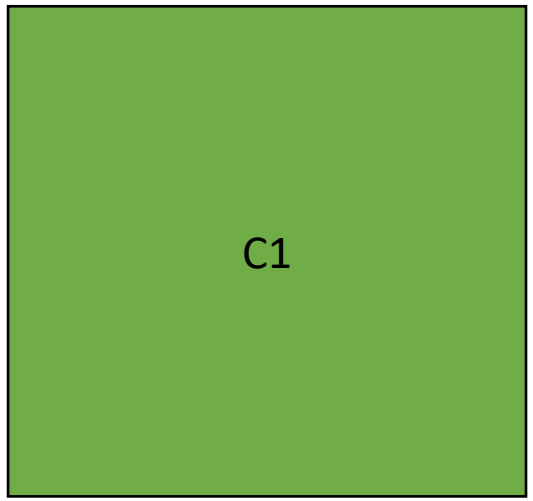
Thread 1

This is fine if threads are independent: e.g. running Chrome and Spotify at the same time.

If threads need to cooperate to run the program, then they need to communicate through memory



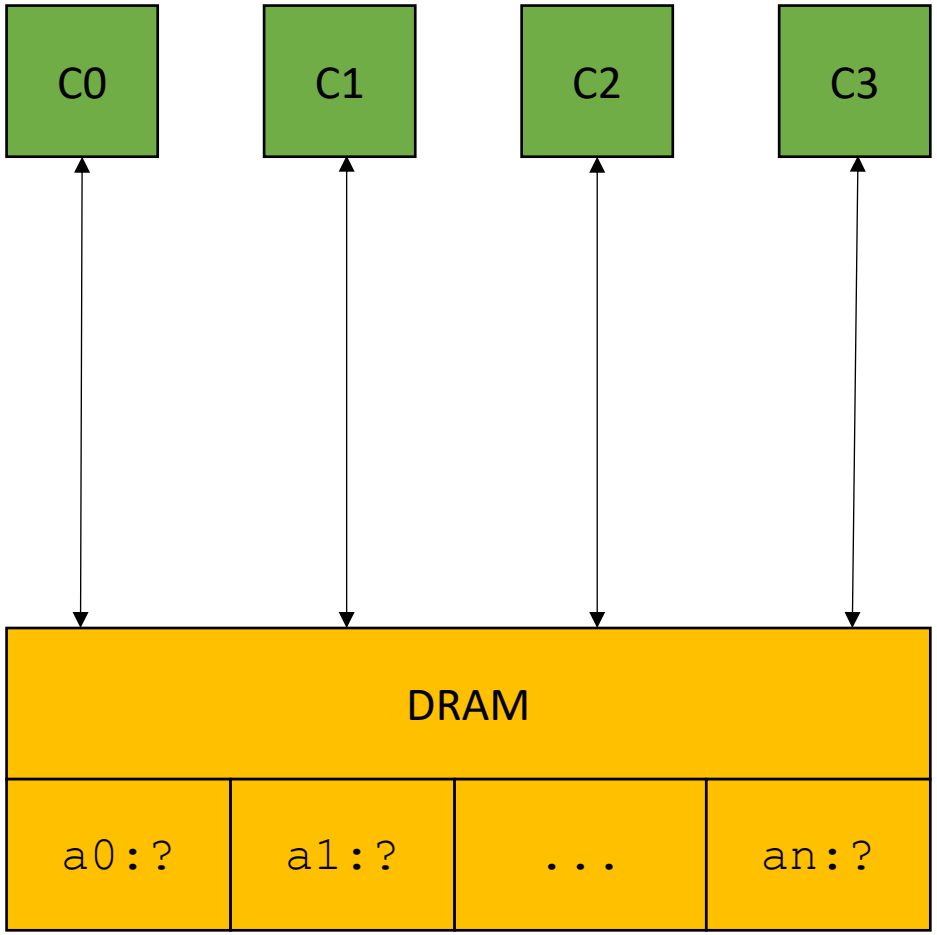
Core



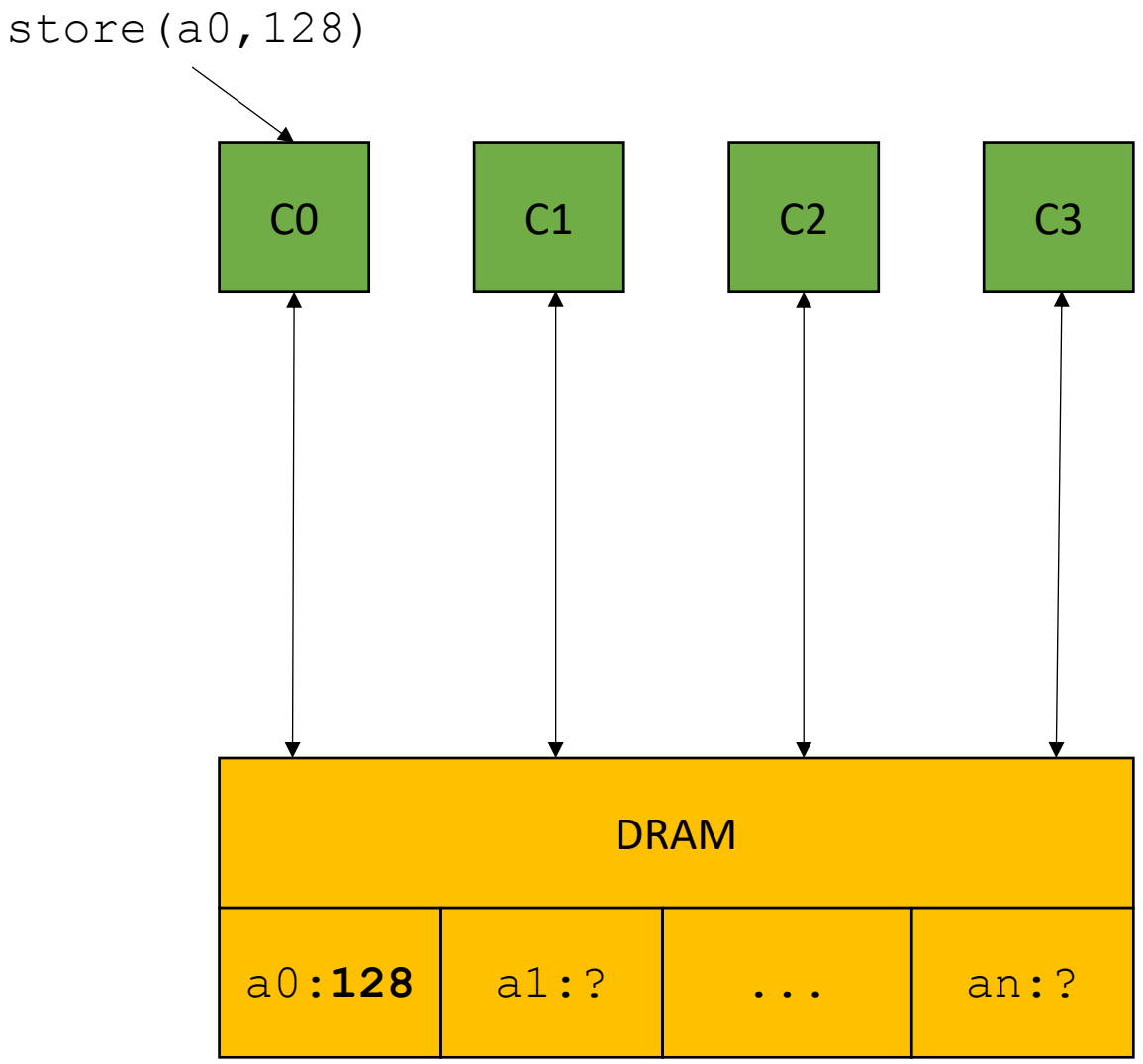
Core

Main memory

`store(a0,128)`

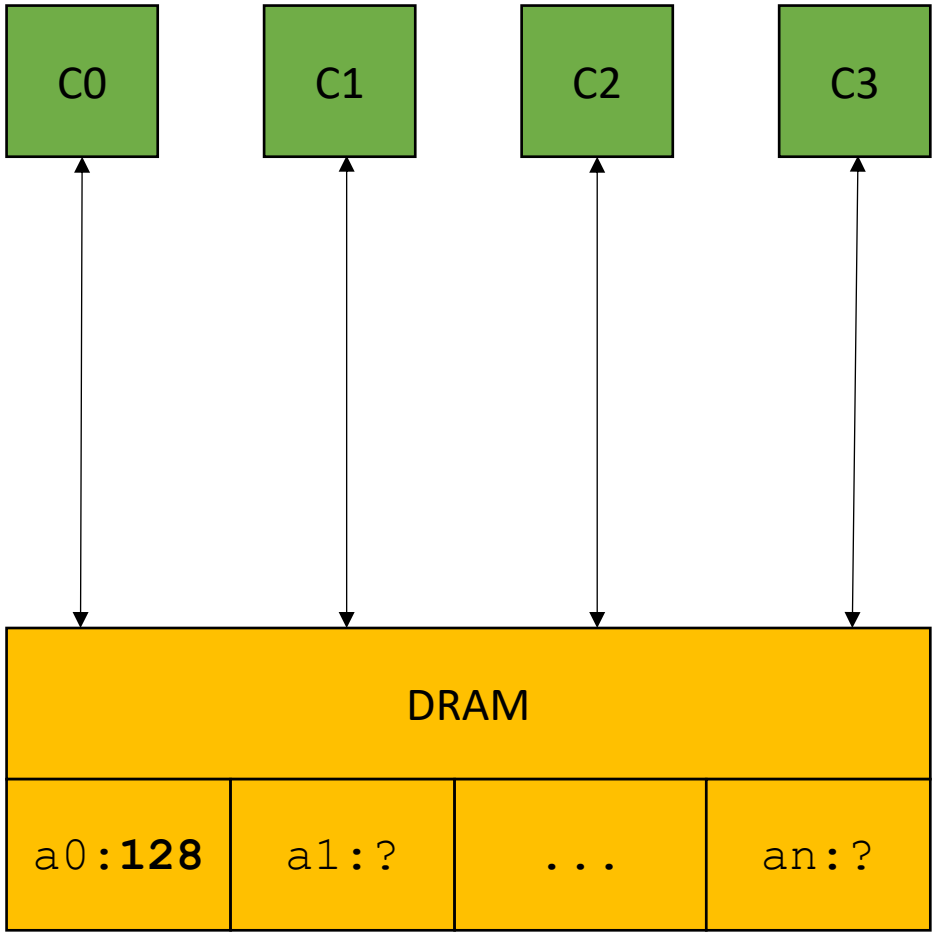


Main memory

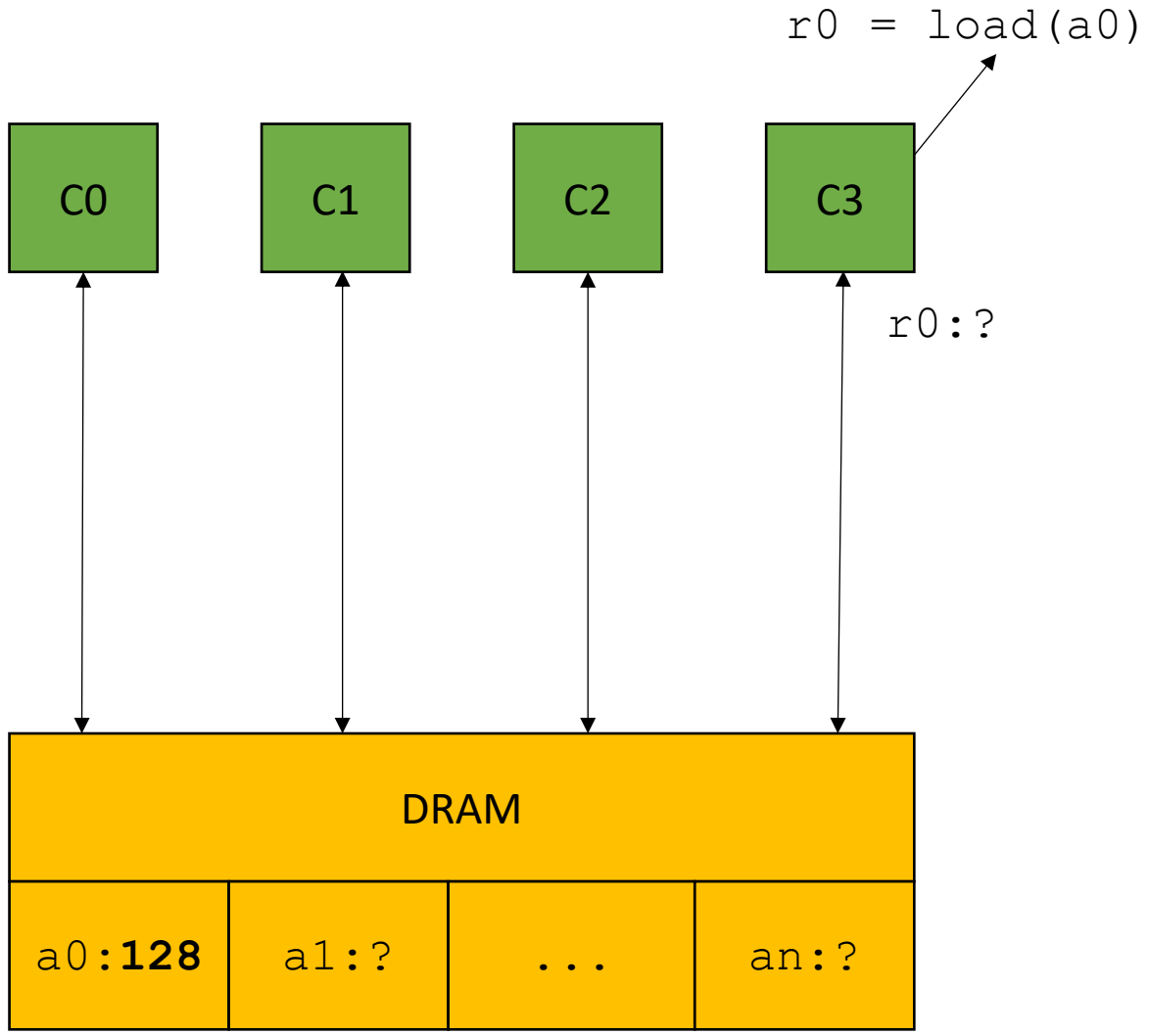


Main memory

```
r0 = load(a0)
```

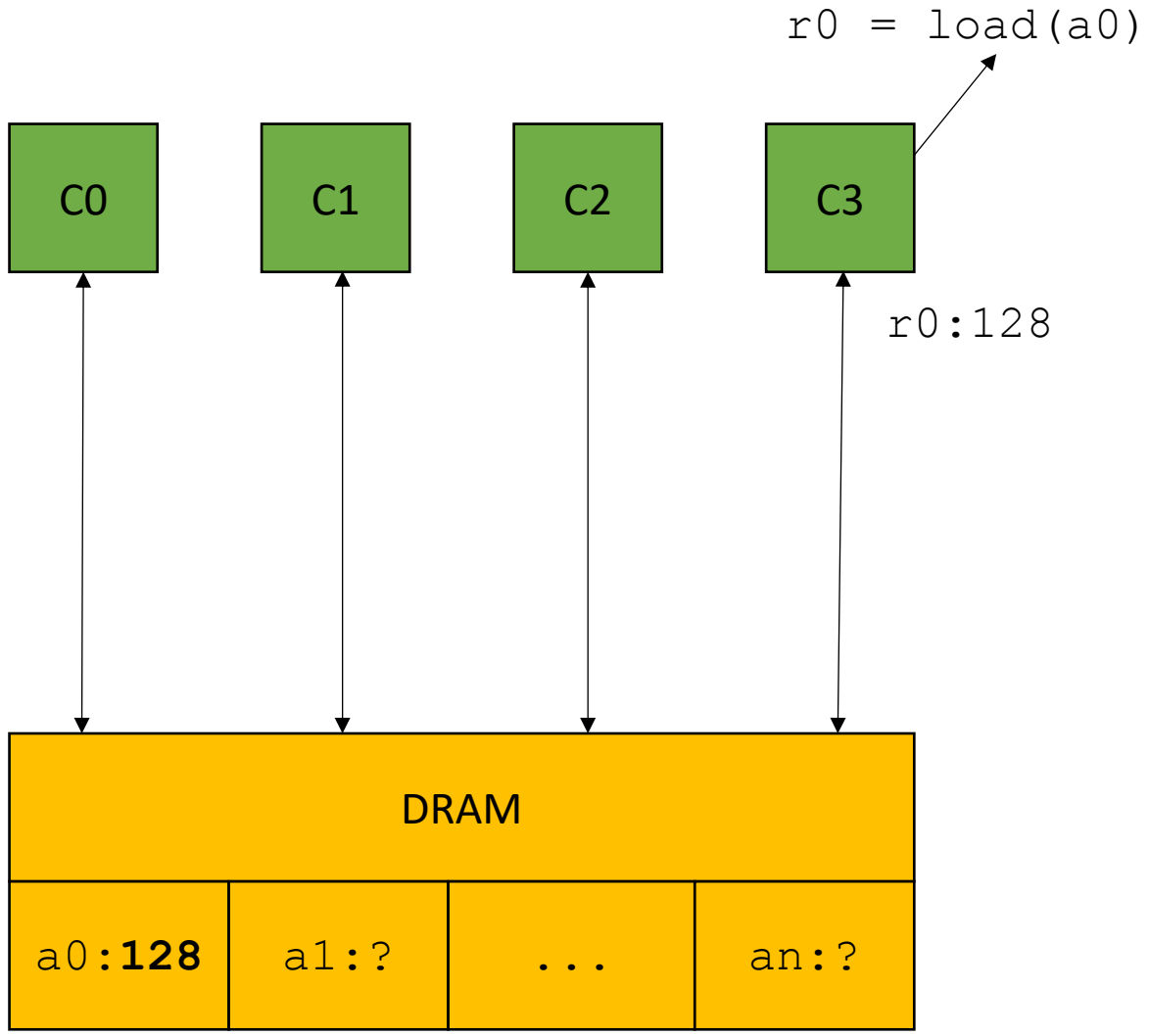


Main memory



Main memory

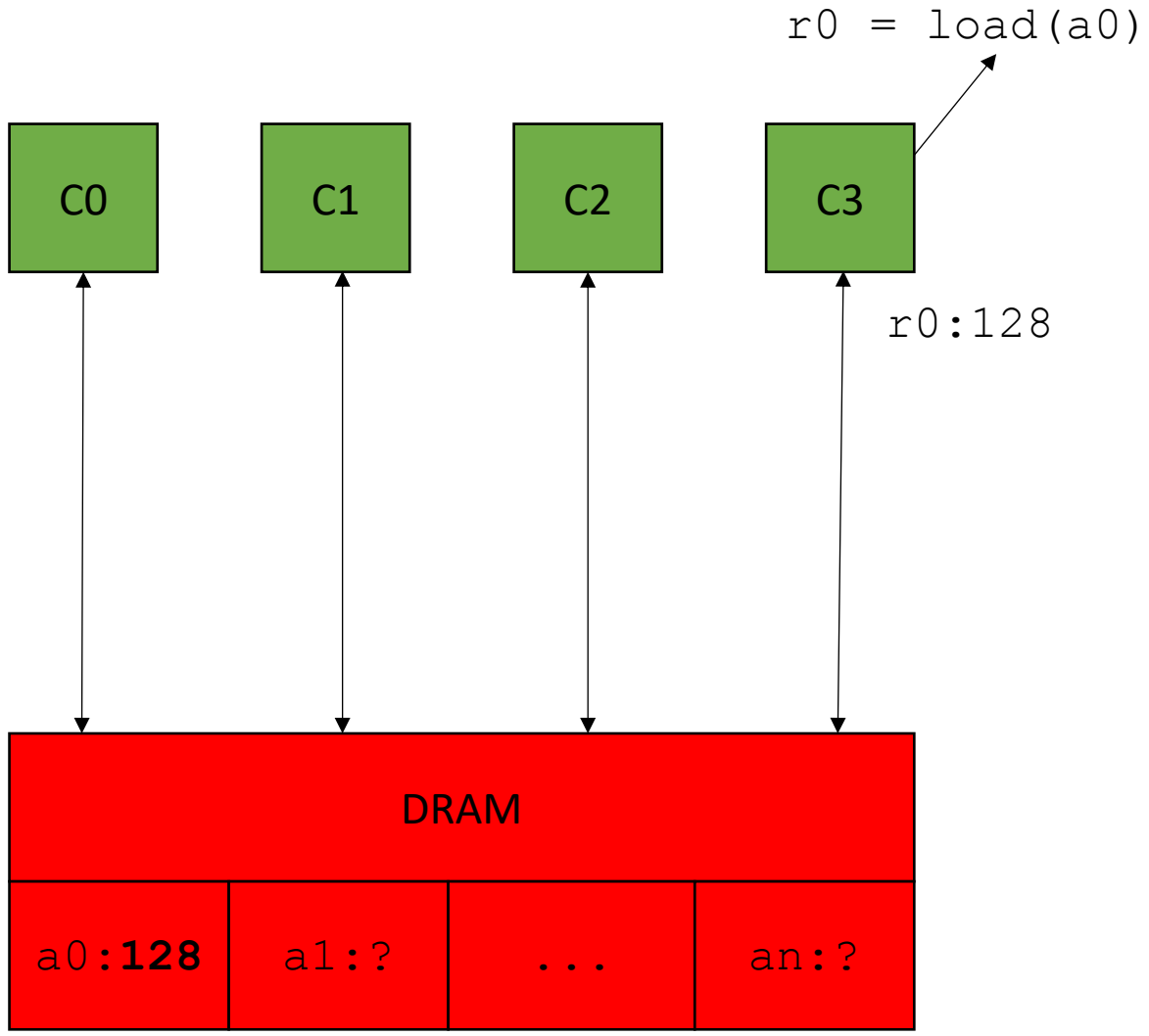
Problem solved!
Threads can communicate!



Main memory

Problem solved!
Threads can communicate!

reading a value takes ~200 cycles

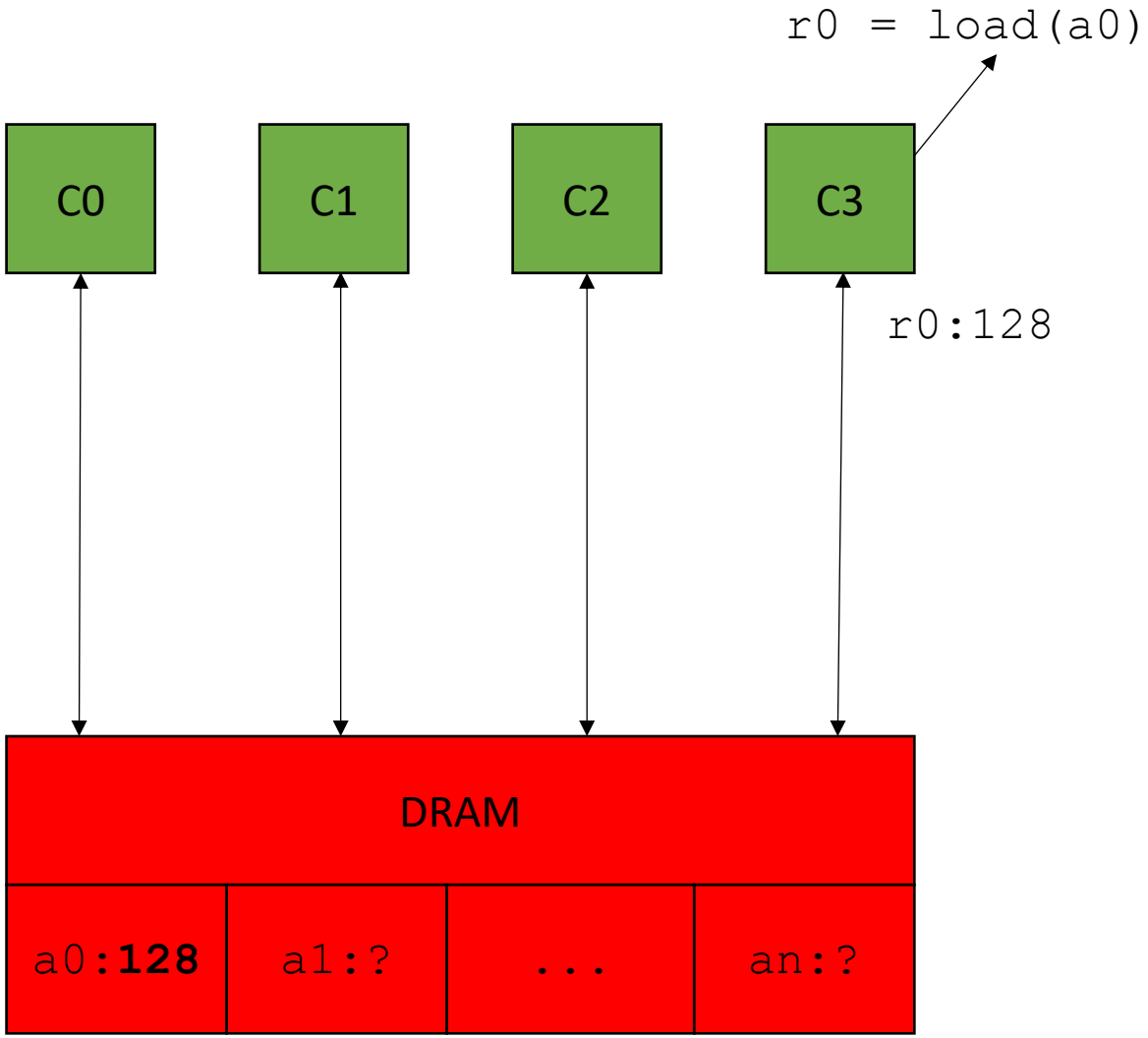


Main memory

Problem solved!
Threads can communicate!

reading a value takes ~200 cycles

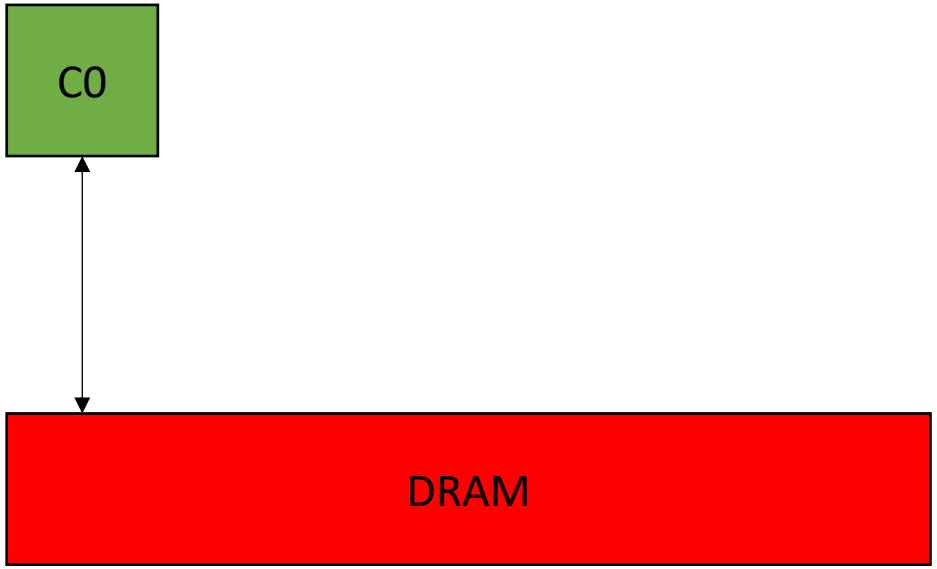
Bad for parallelism, but
also really bad for sequential
code (which we optimized for
decades!)



Main memory

```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

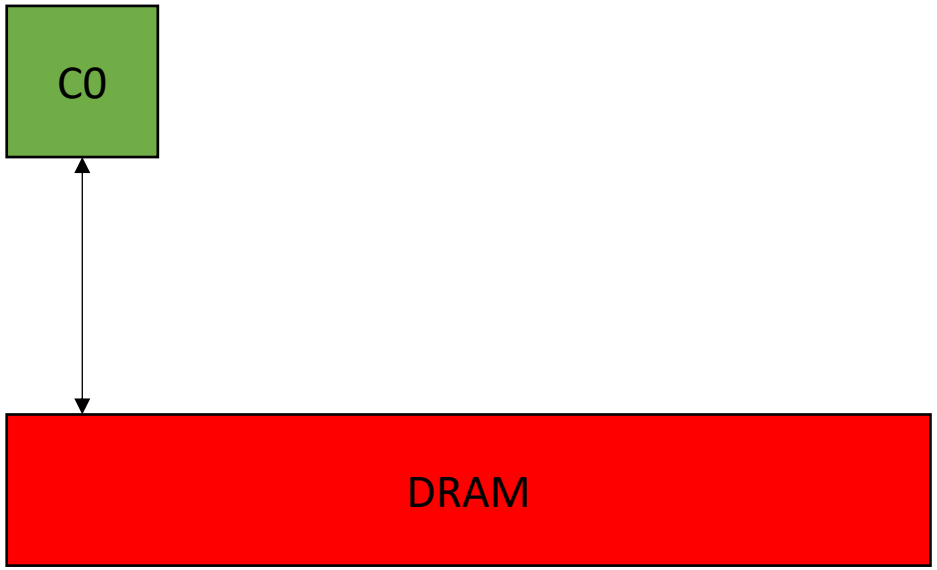


Main memory

```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

200 cycles



Main memory

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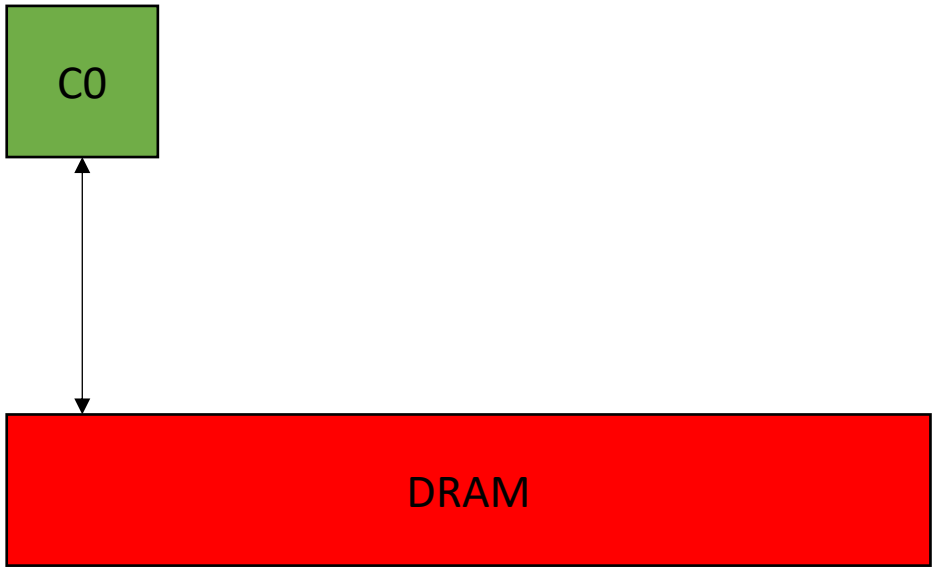
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

200 cycles

1 cycles



Main memory

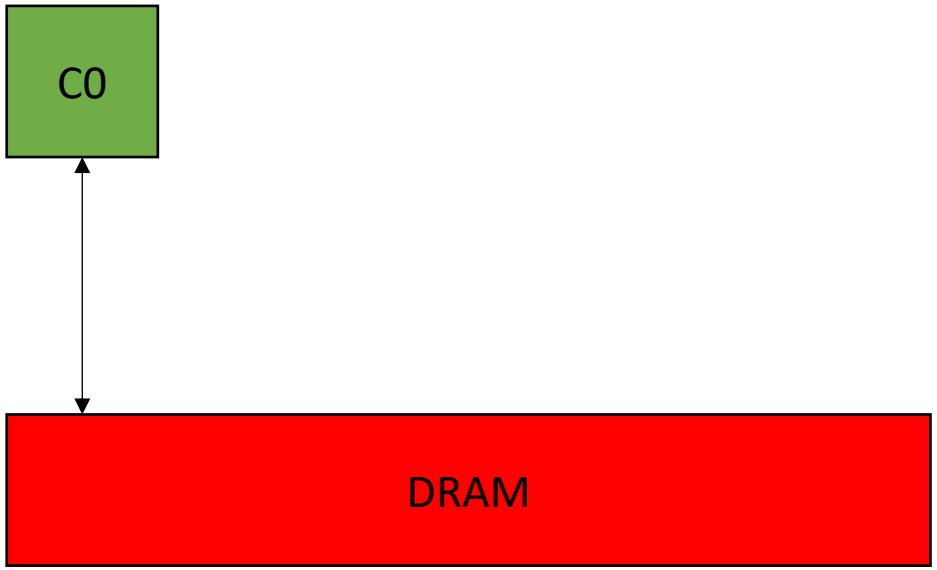
```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

200 cycles

1 cycles

200 cycles



Main memory

```
int increment(int *a) {
    a[0]++;
}
```

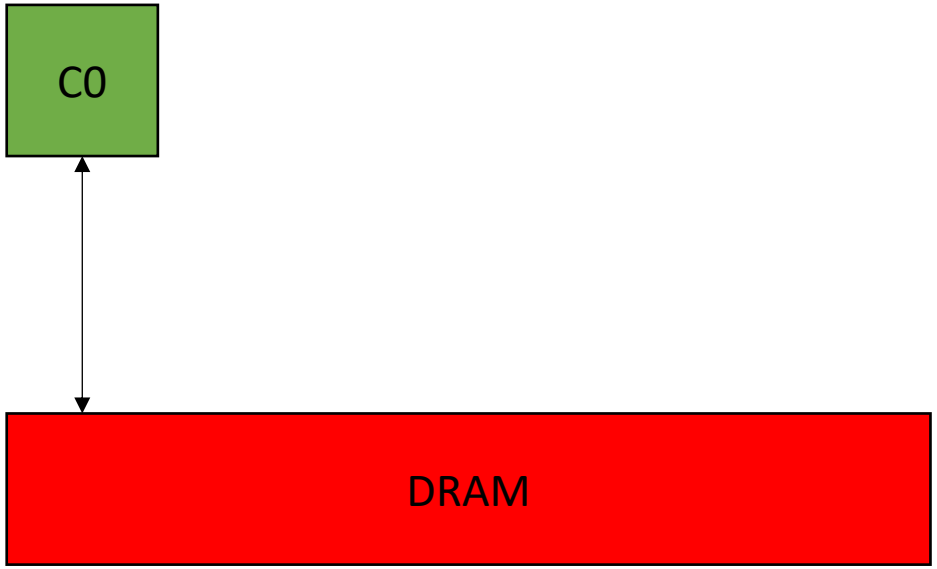
```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

200 cycles

1 cycles

200 cycles

401 cycles



Main memory

```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

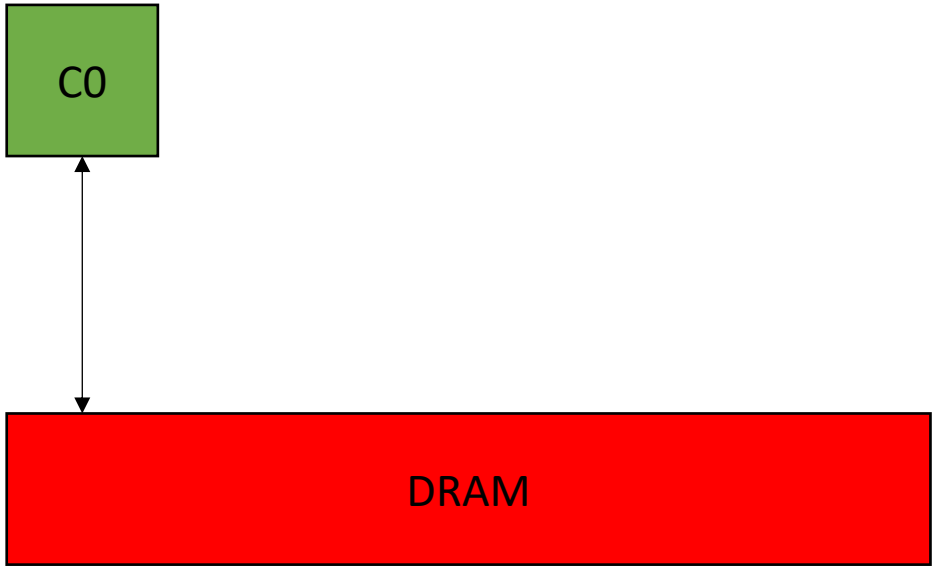
200 cycles

1 cycles

200 cycles

401 cycles

```
int x = 0;
for (int i = 0; i < 100; i++) {
    increment(&x);
}
```



Main memory

```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

200 cycles

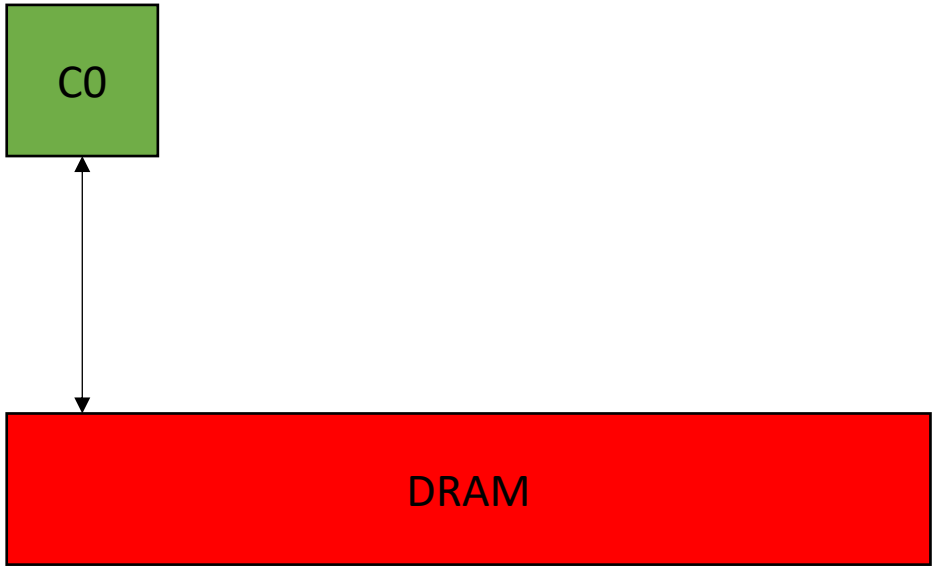
1 cycles

200 cycles

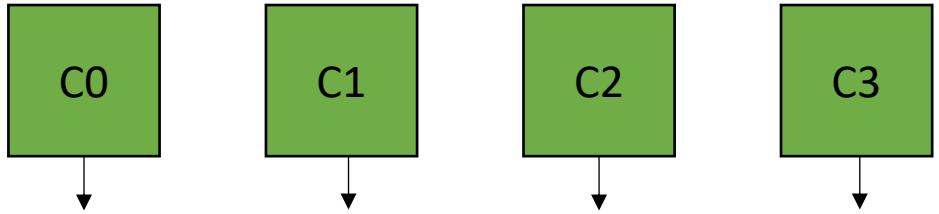
401 cycles

```
int x = 0;
for (int i = 0; i < 100; i++) {
    increment(&x);
}
```

40100 cycles!



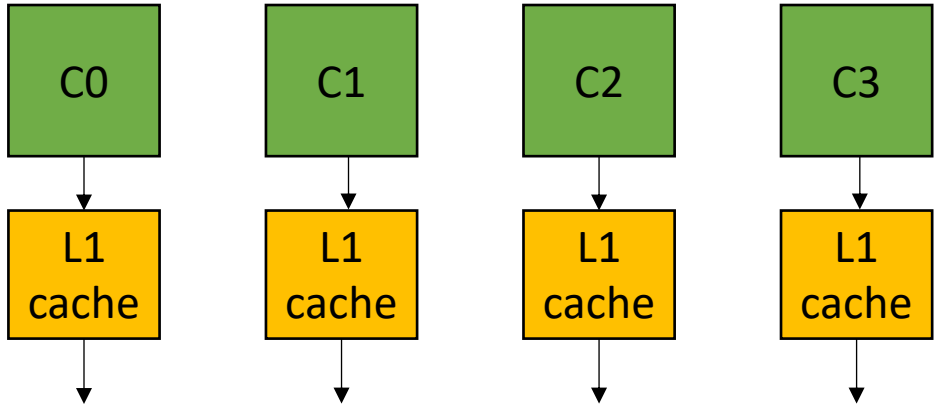
Caches



latency
~200 cycles

Many GBs
(or even TBs)

Caches



latency
~4 cycles

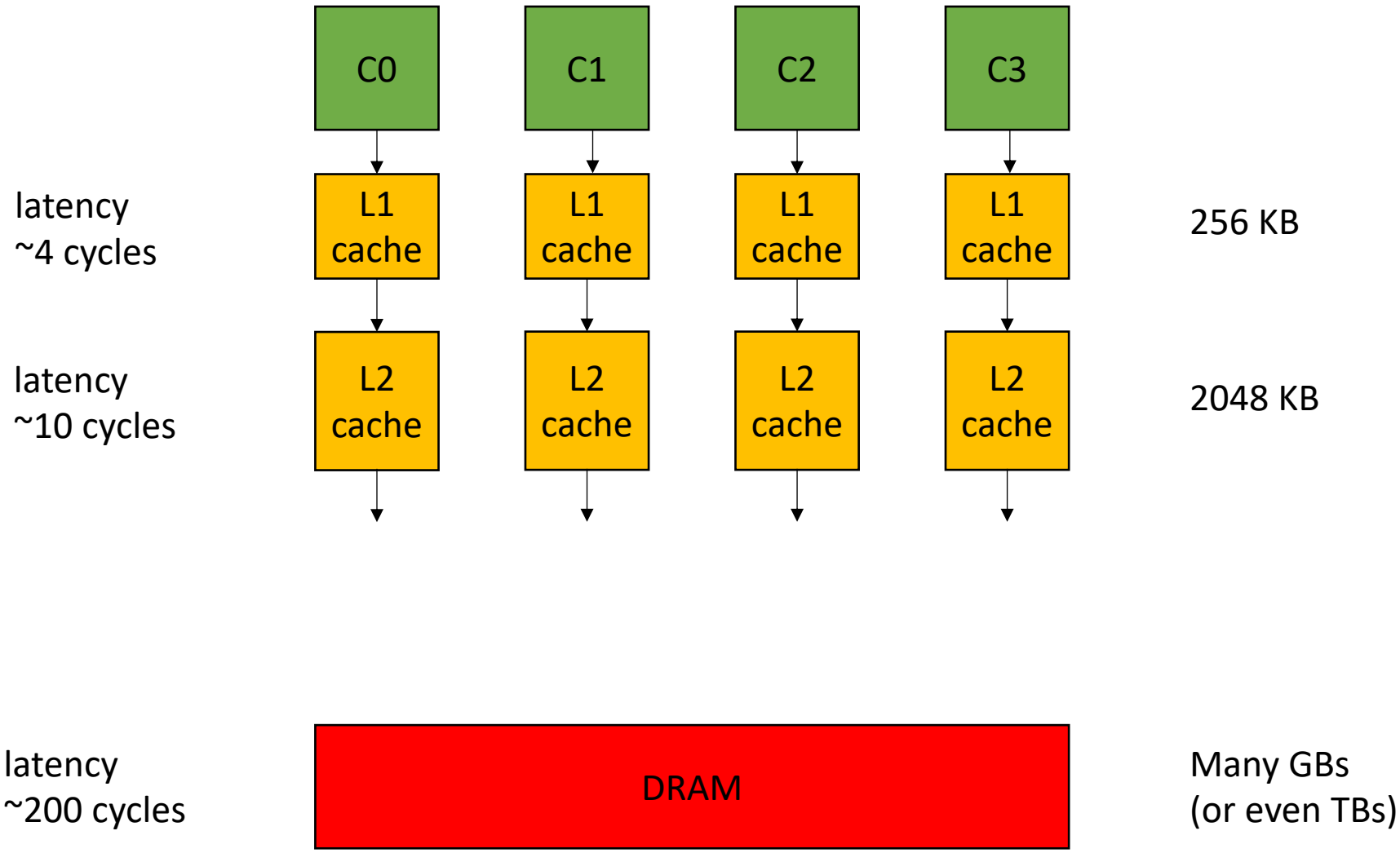
256 KB

latency
~200 cycles

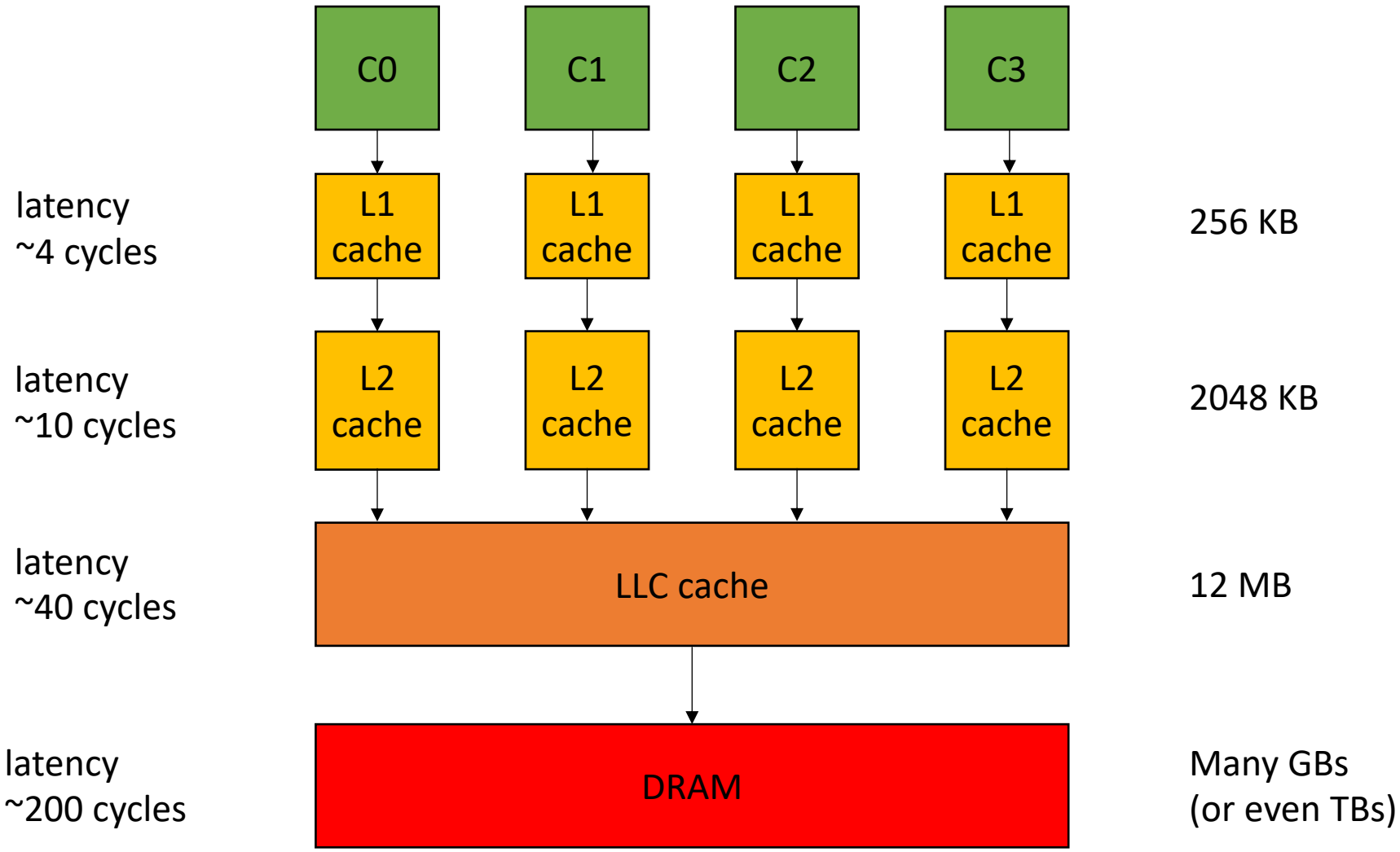
DRAM

Many GBs
(or even TBs)

Caches


C0
C1
C2
C3
L1 cache
L1 cache
L1 cache
L1 cache
L2 cache
L2 cache
L2 cache
L2 cache
DRAM
latency ~4 cycles
latency ~10 cycles
latency ~200 cycles
256 KB
2048 KB
Many GBs (or even TBs)

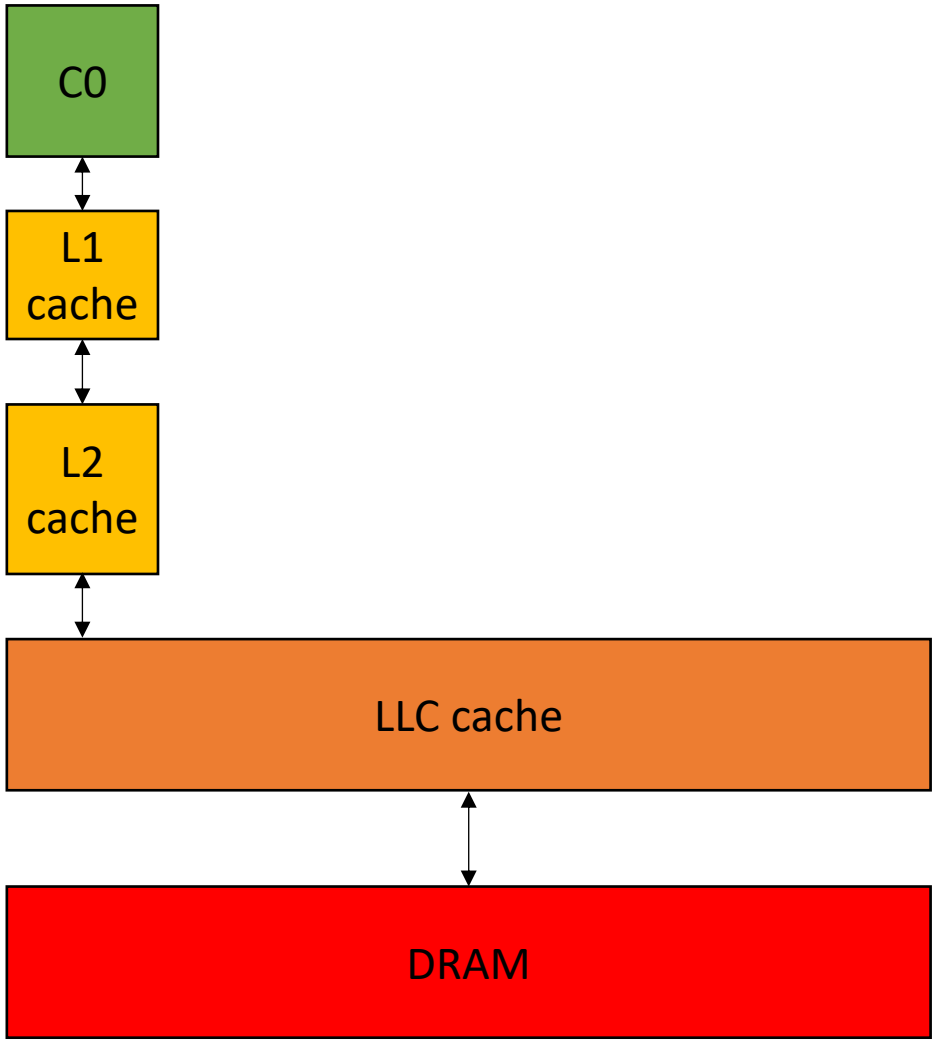
Caches


C0
C1
C2
C3
L1 cache
L1 cache
L1 cache
L1 cache
L2 cache
L2 cache
L2 cache
L2 cache
LLC cache
DRAM
latency ~4 cycles
latency ~10 cycles
latency ~40 cycles
latency ~200 cycles
256 KB
2048 KB
12 MB
Many GBs (or even TBs)

Caches

```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```



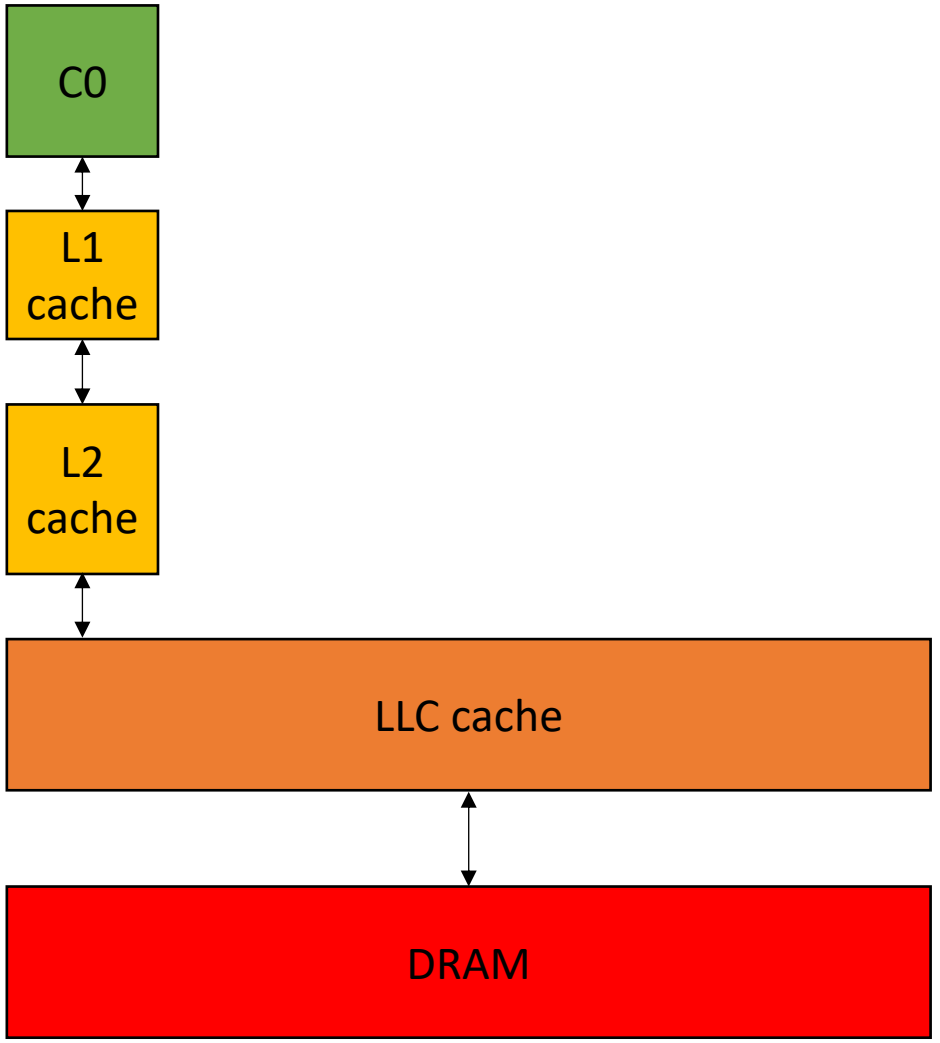
Caches

```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

4 cycles

Assuming the value is in the cache!



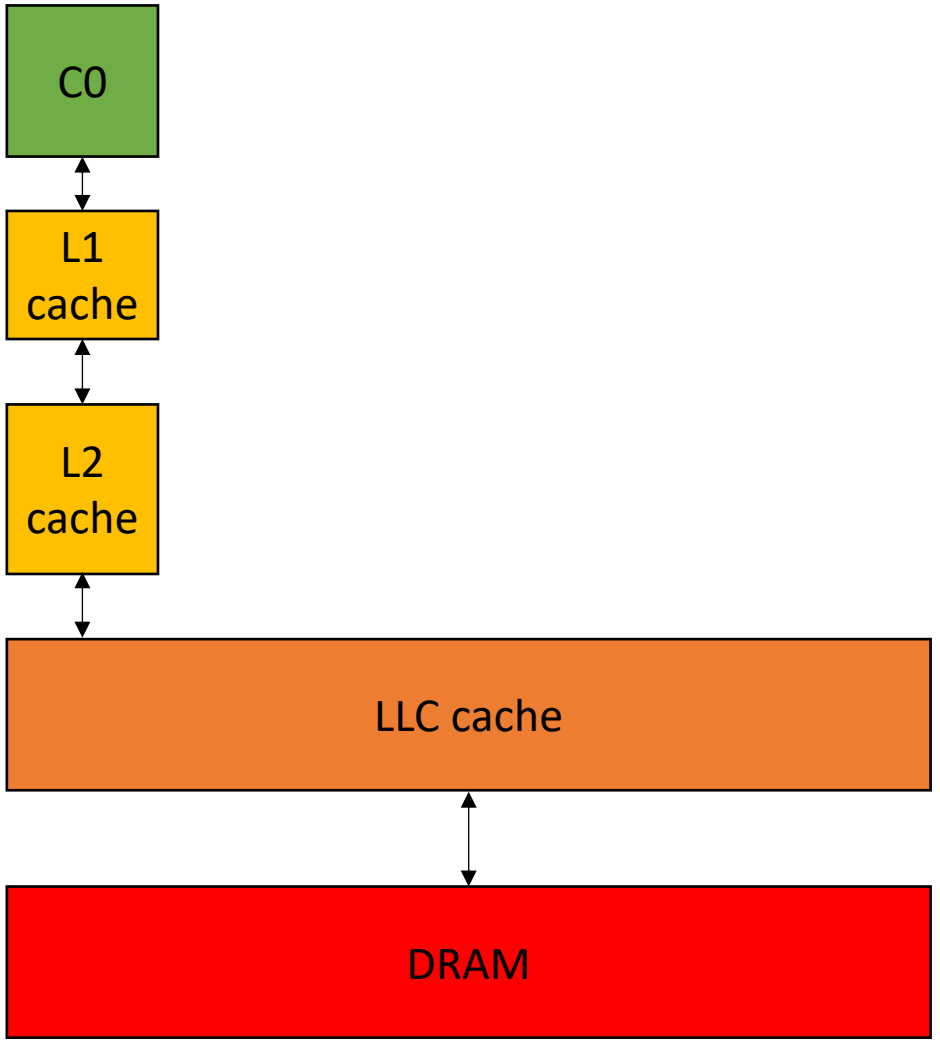
Caches

```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

4 cycles

1 cycles



Caches

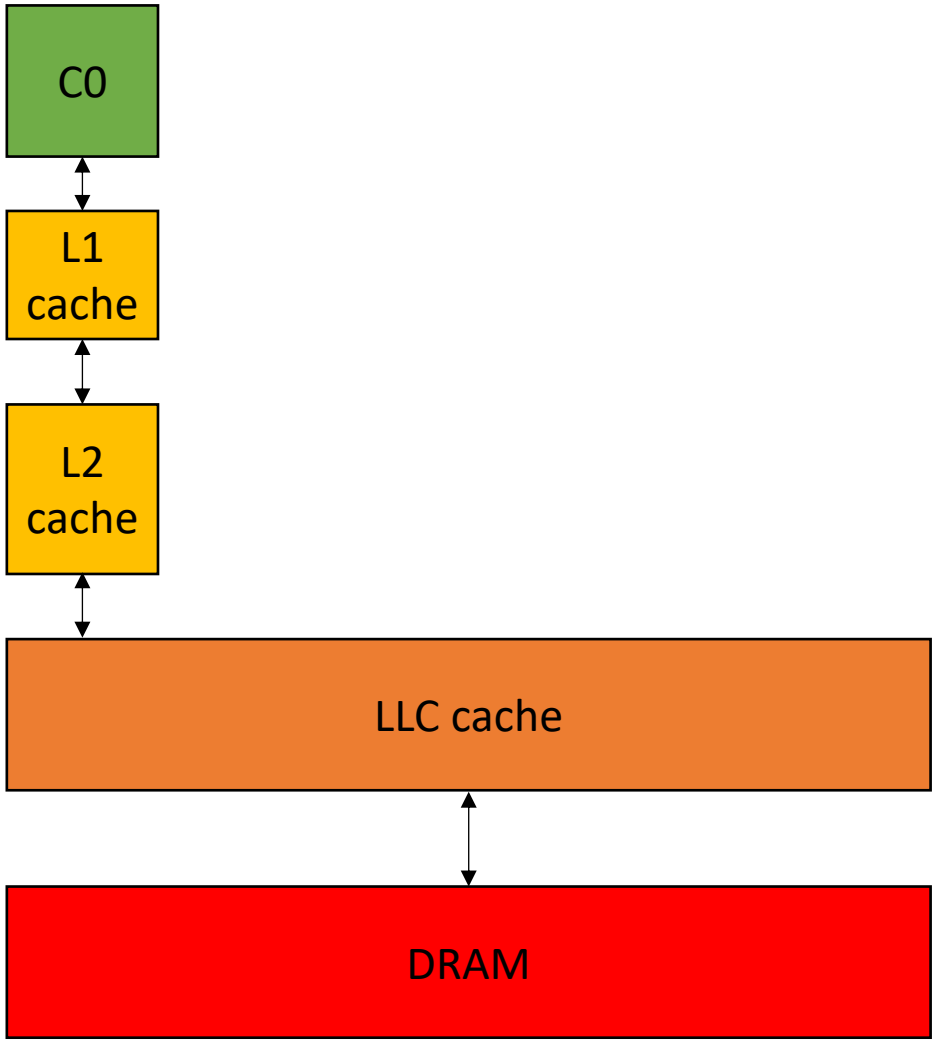
```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

4 cycles

1 cycles

4 cycles



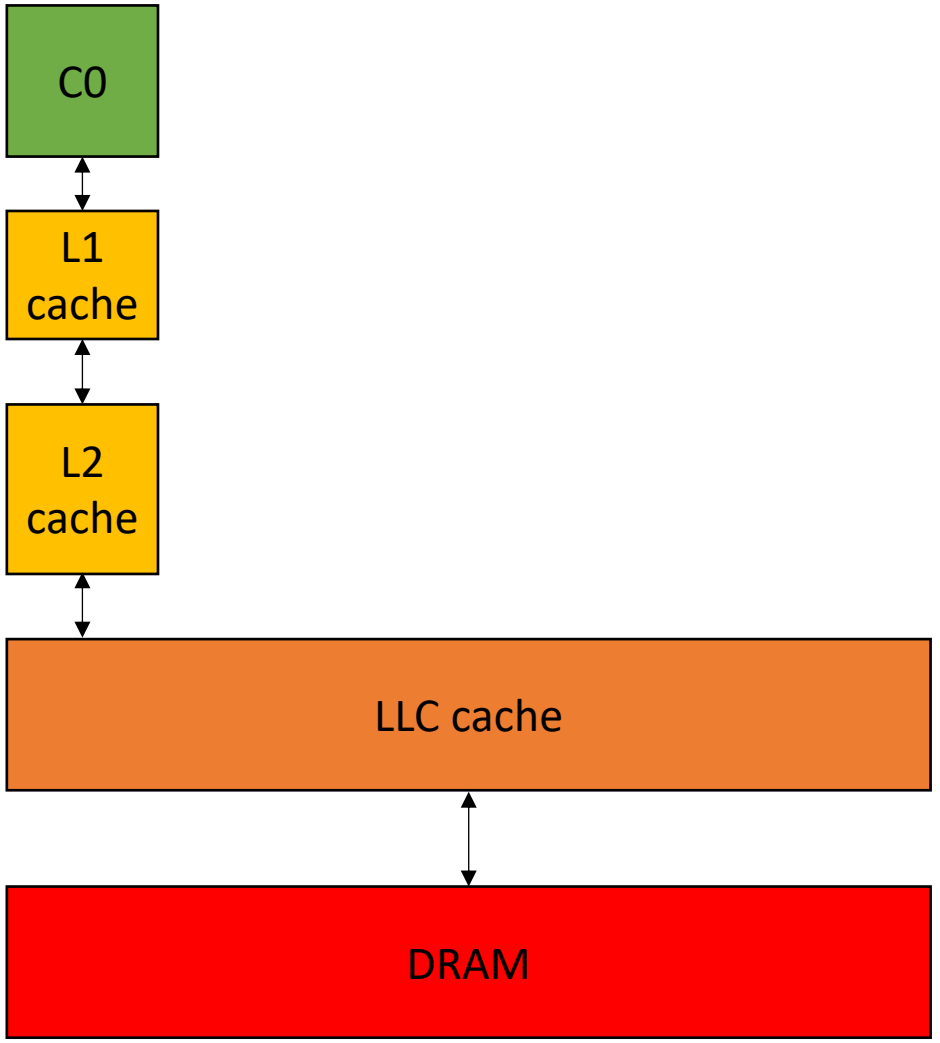
Caches

```
int increment(int *a) {
    a[0]++;
}
```

```
%5 = load i32, i32* %4
%6 = add nsw i32 %5, 1
store i32 %6, i32* %4
```

4 cycles
1 cycles
4 cycles

9 cycles!



Assume a[0] is not in the cache

Caches

```
int increment(int *a) {
    a[0]++;
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```

```
%5 = load i32, i32* %4
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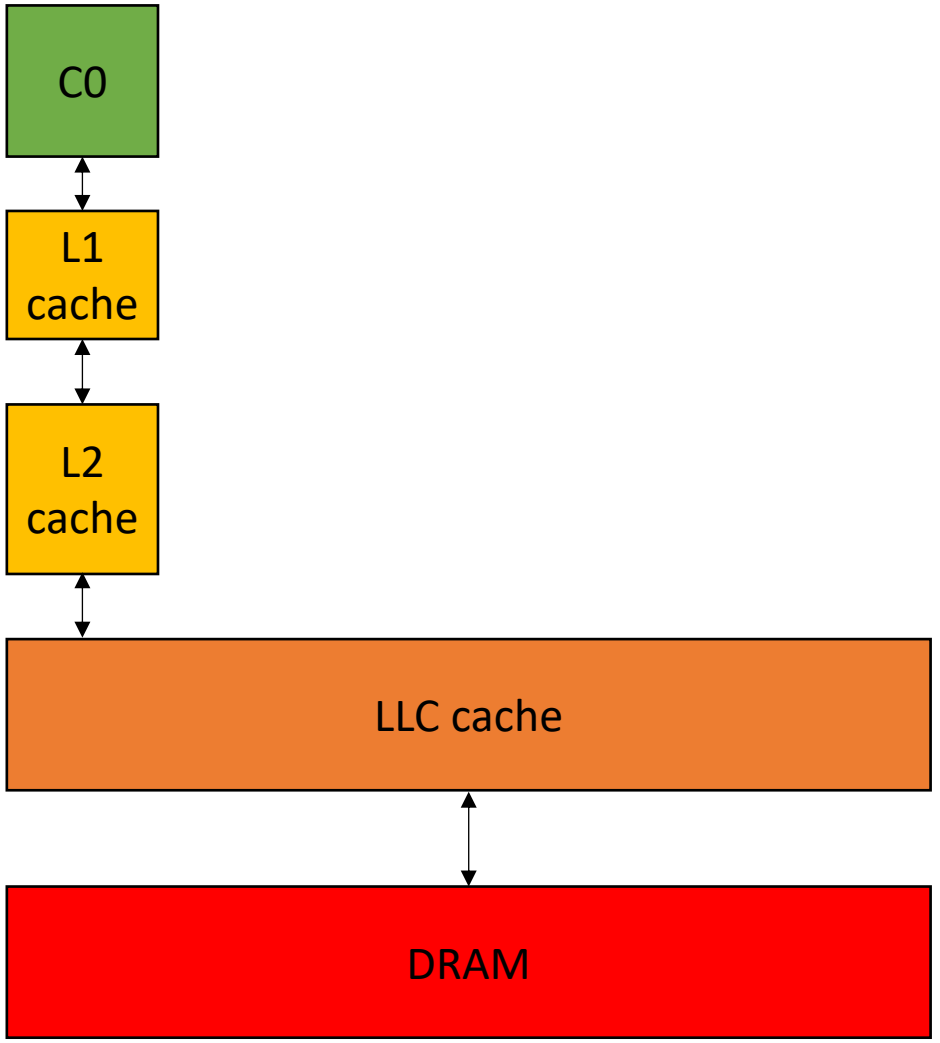

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Caches

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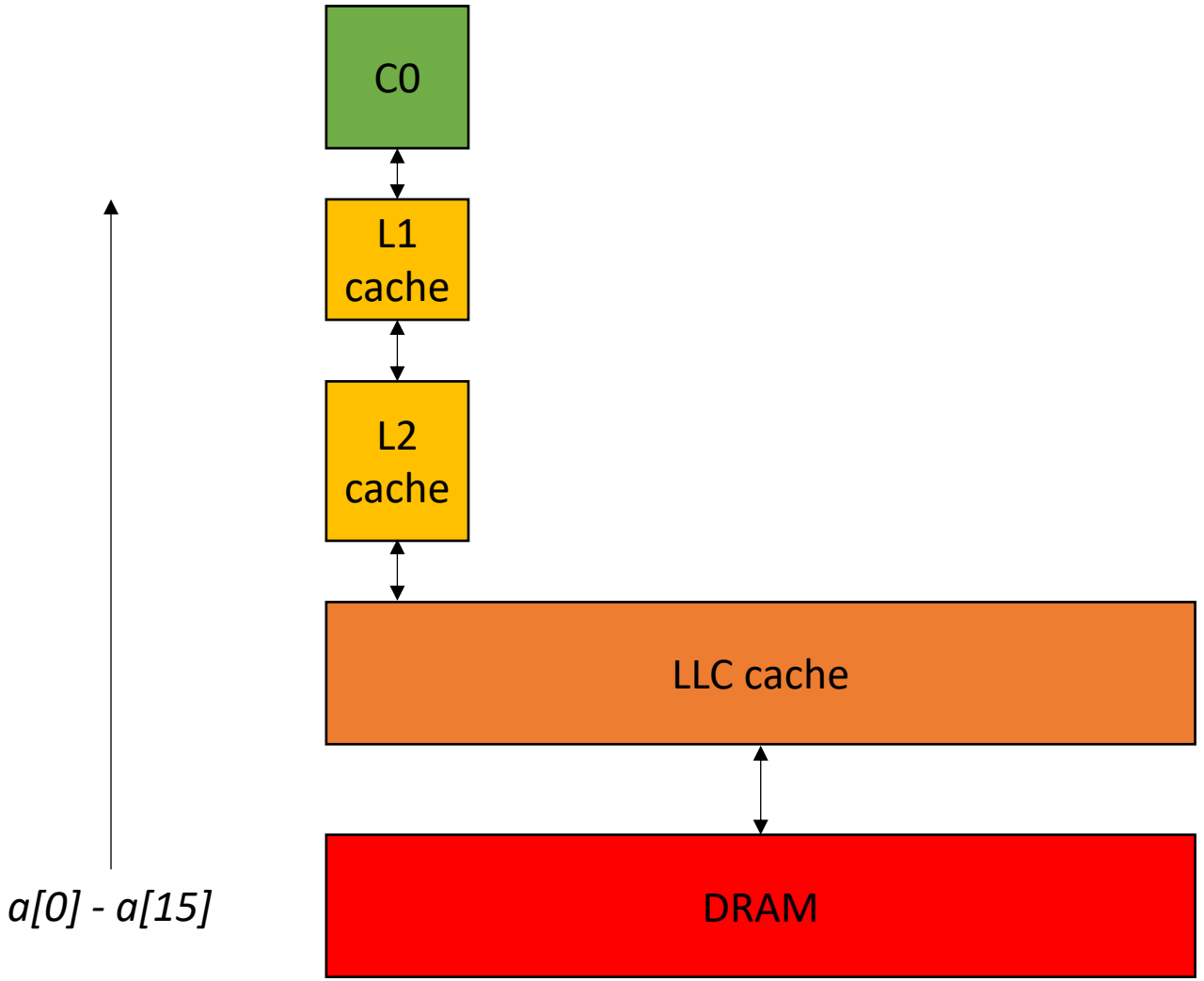
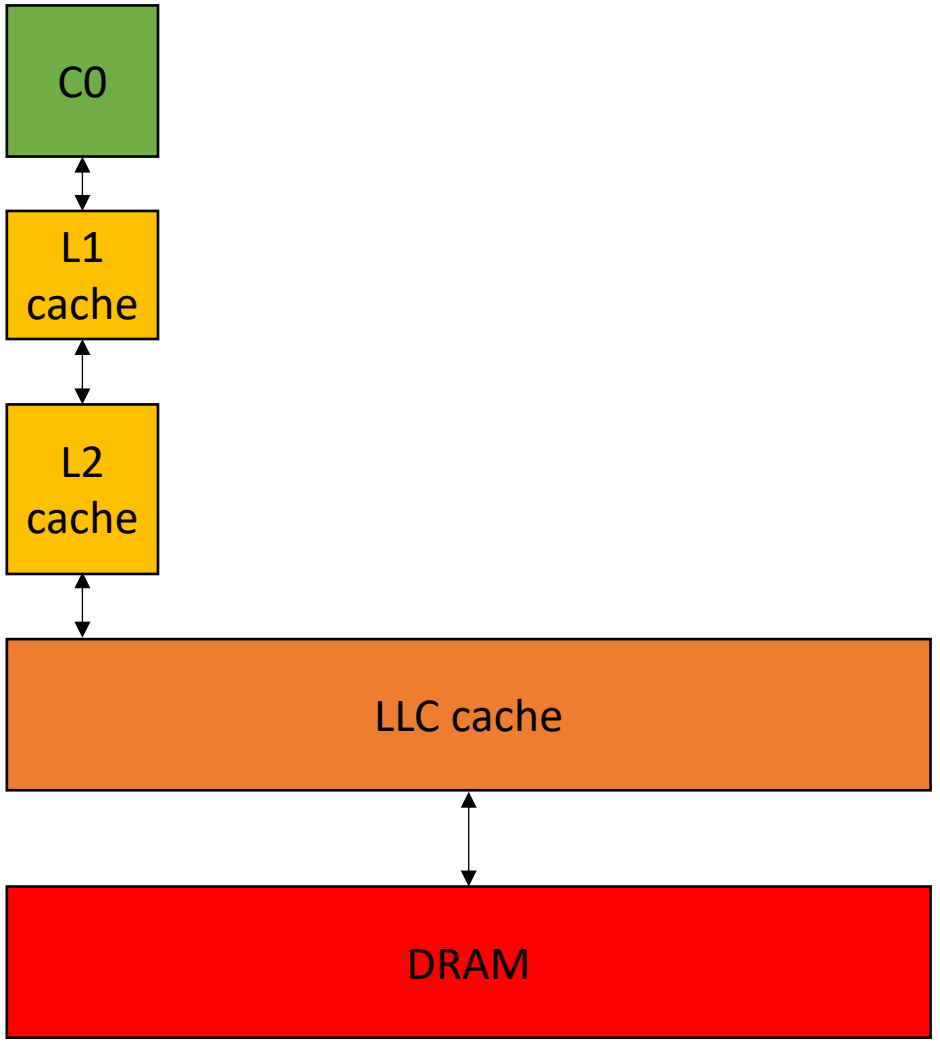


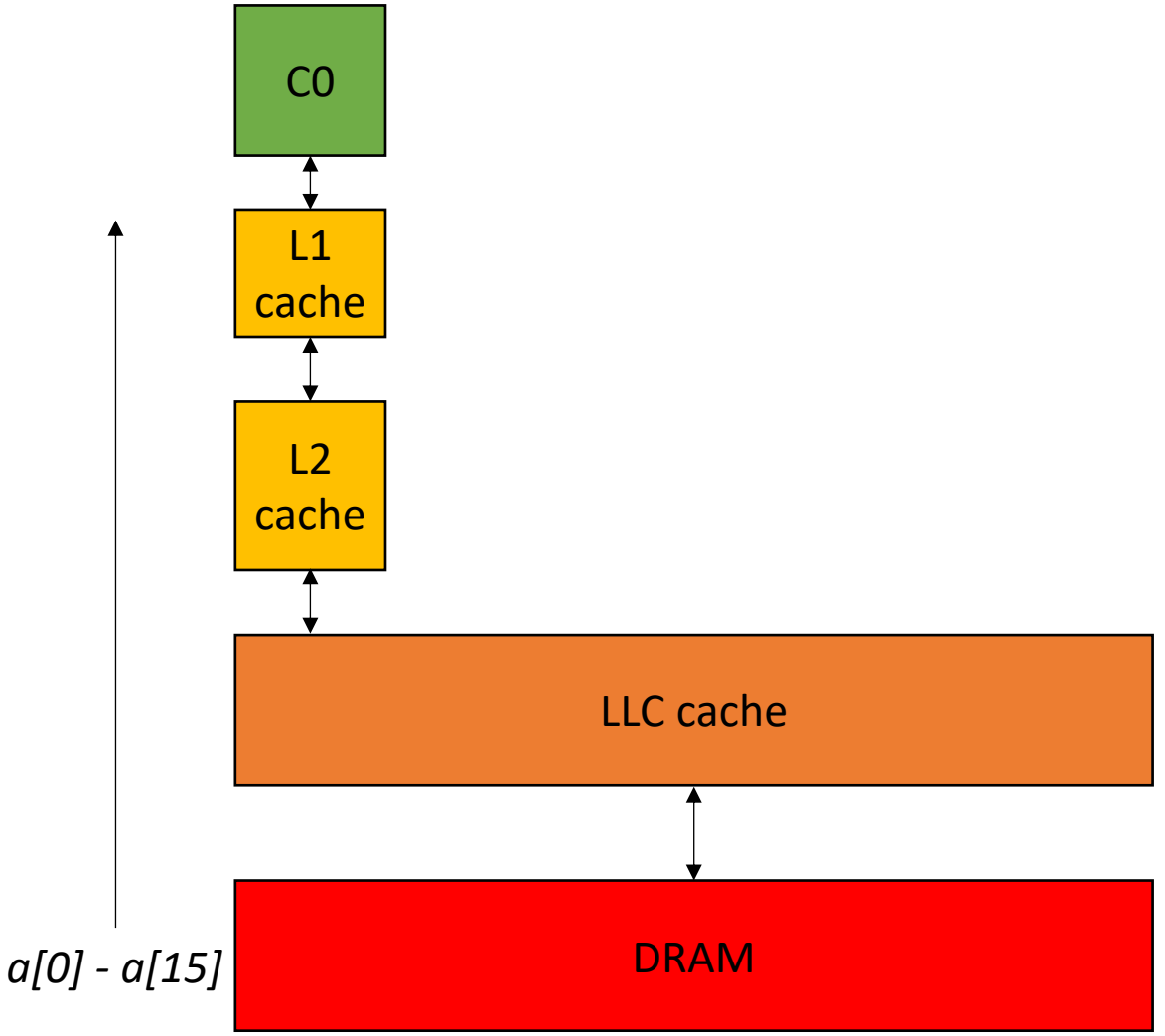
Caches

```
int increment_several(int *a) {
    a[0]++;
    a[15]++;
    a[16]++;
}
```



Caches

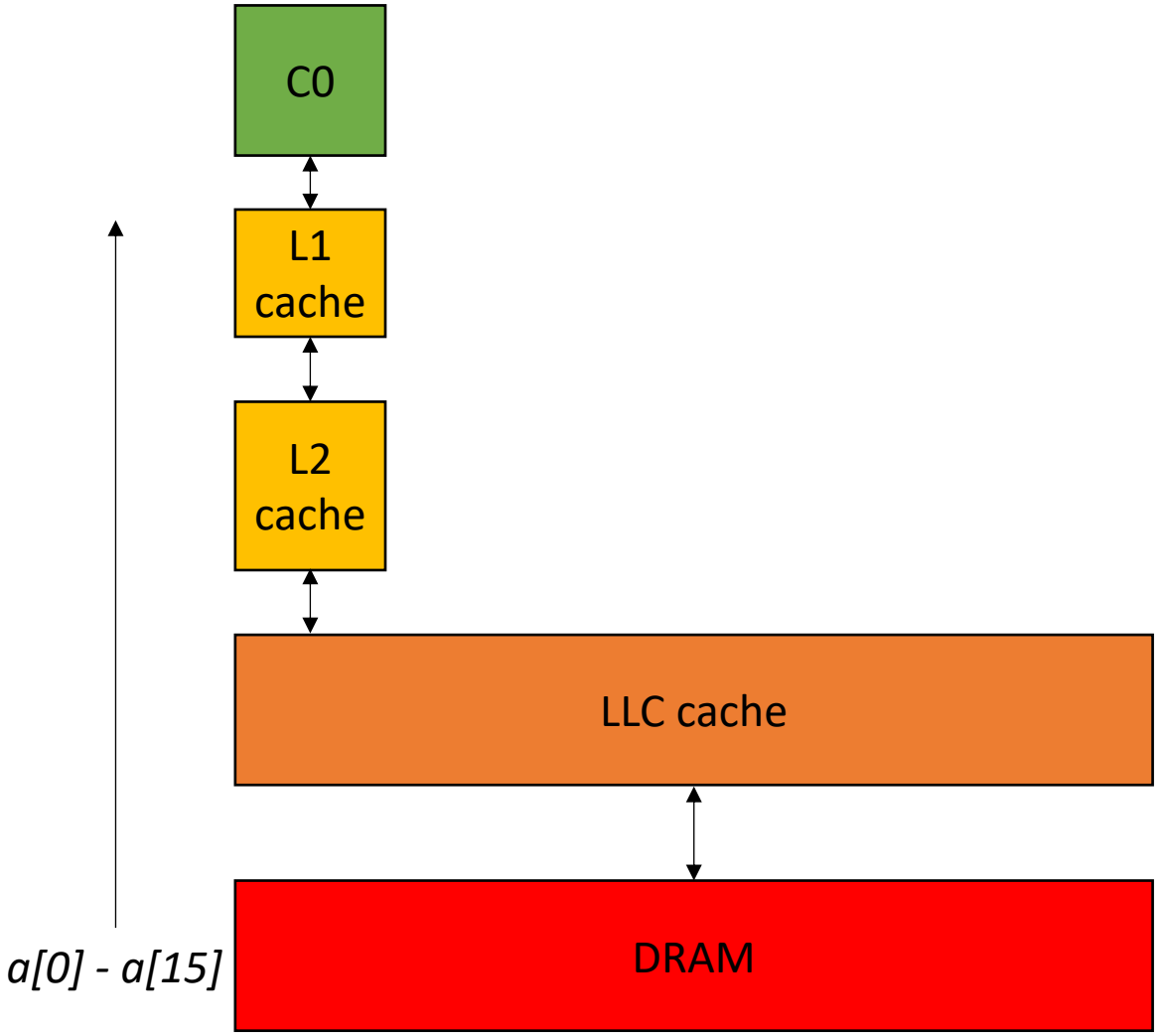
```
int increment_several(int *a) {
    a[0]++;
    a[15]++;
    a[16]++;
}
```



Caches

```
int increment_several(int *a) {
    a[0]++;
    a[15]++;
    a[16]++;
}
```

will be a hit because we've loaded a[0] cache line

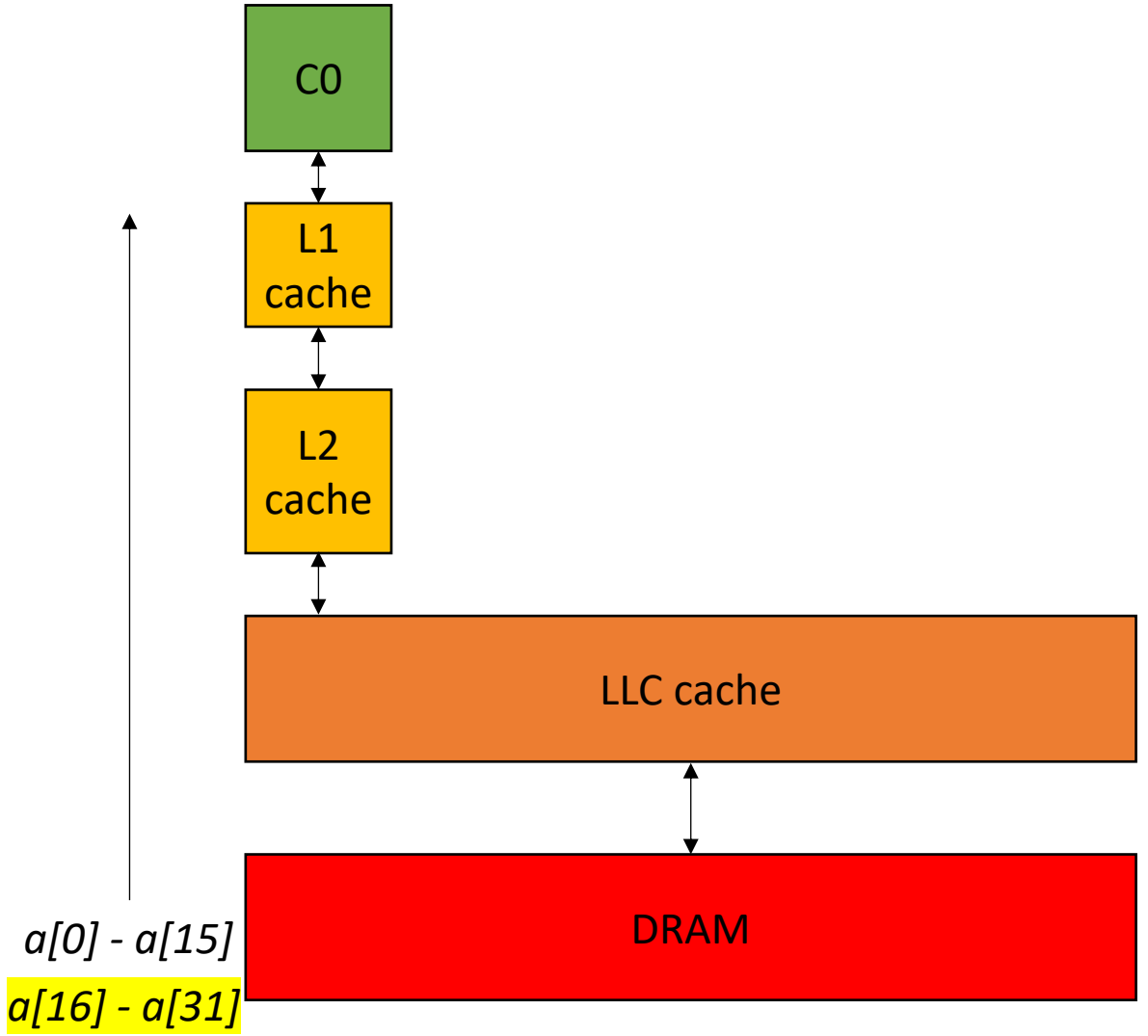


Assume a[0] is not in the cache

Caches

```
int increment_several(int *a) {
    a[0]++;
    a[15]++;
    a[16]++;
}
```

Miss

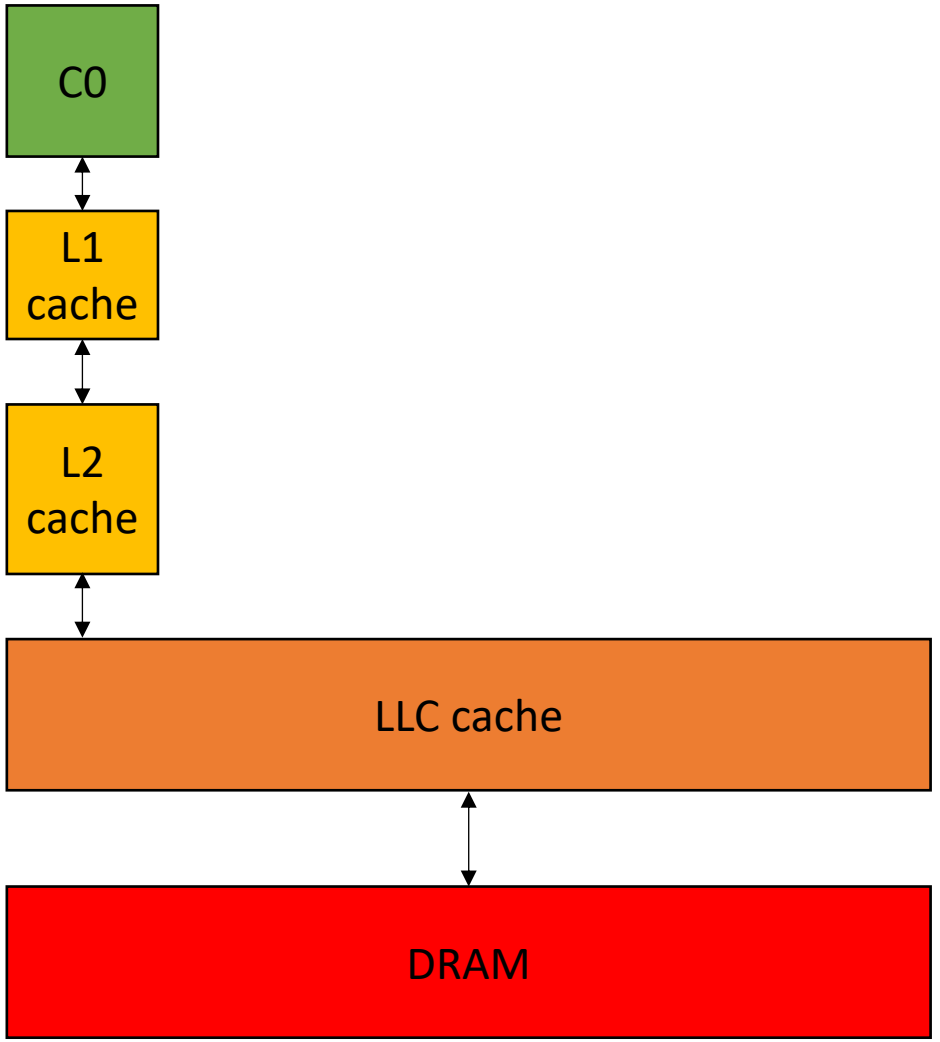


Assume a[0] is not in the cache

Cache alignment

```
int increment_several(int *b) {
    b[0]++;
    b[15]++;
}

int foo(int *a) {
    increment_several(&(a[8]))
}
```



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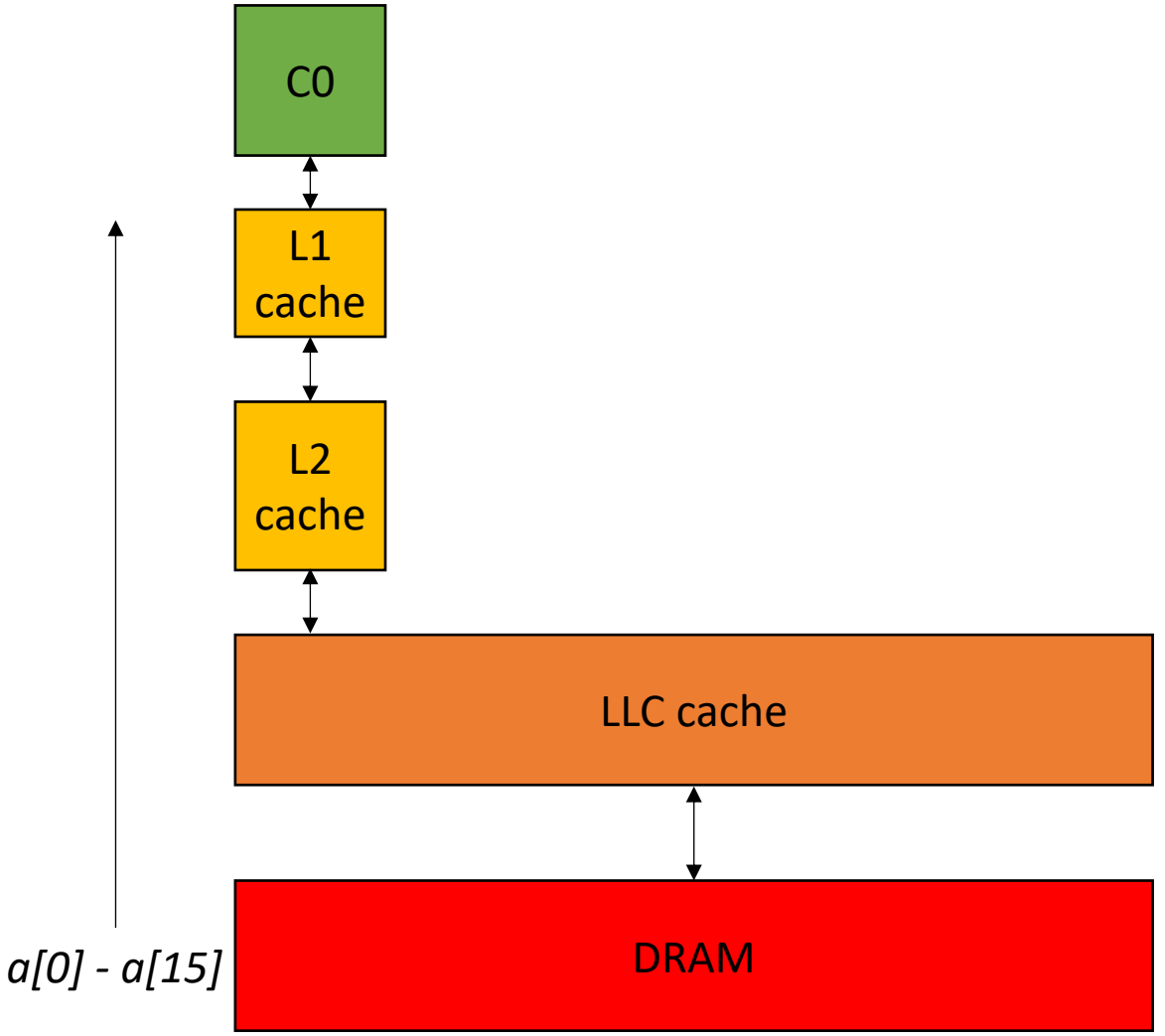


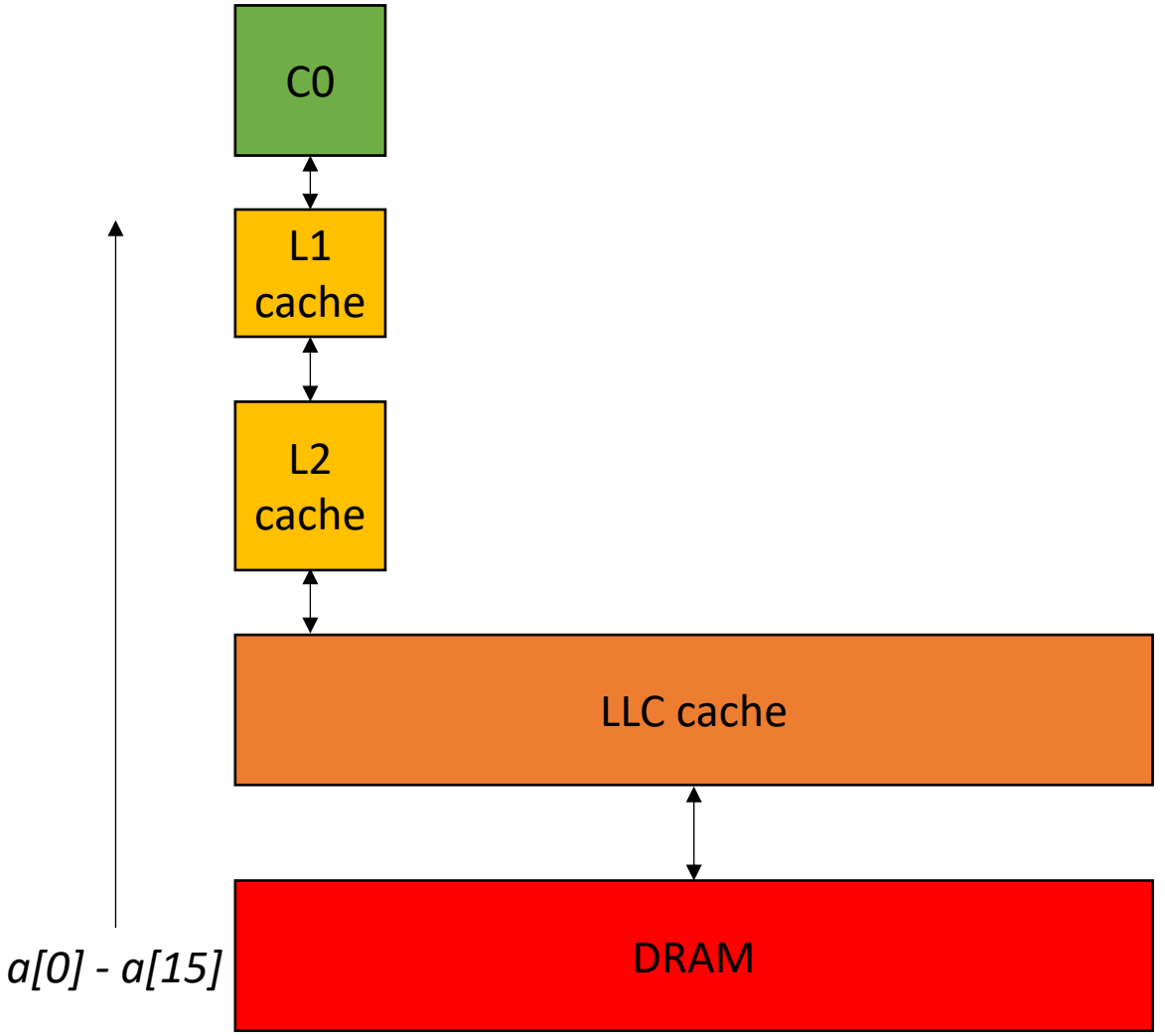
Assume a[0] is not in the cache

Cache alignment

```
int increment_several(int *b) {
    b[0]++;
    b[15]++;
}

int foo(int *a) {
    increment_several(&(a[8]))
}
```

This loads a[8]



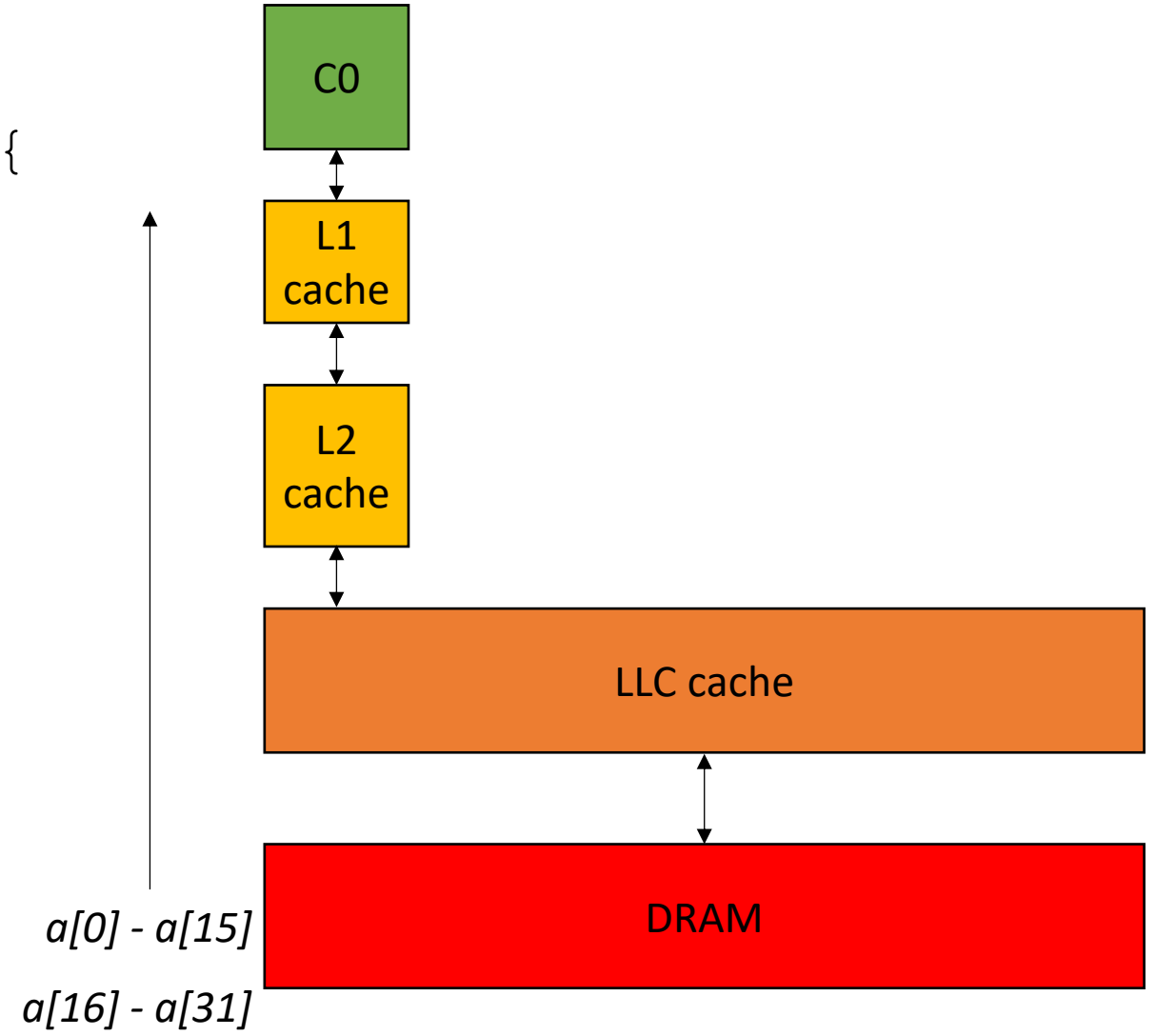
Assume a[0] is not in the cache

Cache alignment

```
int increment_several(int *b) {
    b[0]++;
    b[15]++;
}

int foo(int *a) {
    increment_several(&(a[8]))
}
```

This loads a[8]
This loads a[23], a miss!



Cache alignment

- Malloc typically returns a pointer with “good” alignment.
  - System specific, but will be aligned at least to a cache line, more likely a page
- For very low-level programming you can use special aligned malloc functions
- Prefetchers will also help for many applications (e.g. streaming)

Cache alignment

- Malloc typically returns a pointer with “good” alignment.
  - System specific, but will be aligned at least to a cache line, more likely a page
- For very low-level programming you can use special aligned malloc functions
- Prefetchers will also help for many applications (e.g. streaming)

```
for (int i = 0; i < 100; i++) {
  a[i] += b[i];
}
```

prefetcher will start collecting consecutive data in the cache if it detects patterns like this.