CS250P: Computer Systems Architecture Achieving Correct Pipelining



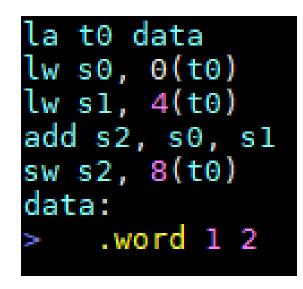
Sang-Woo Jun Fall 2022



Large amount of material adapted from MIT 6.004, "Computation Structures", Morgan Kaufmann "Computer Organization and Design: The Hardware/Software Interface: RISC-V Edition", and CS 152 Slides by Isaac Scherson

A problematic example

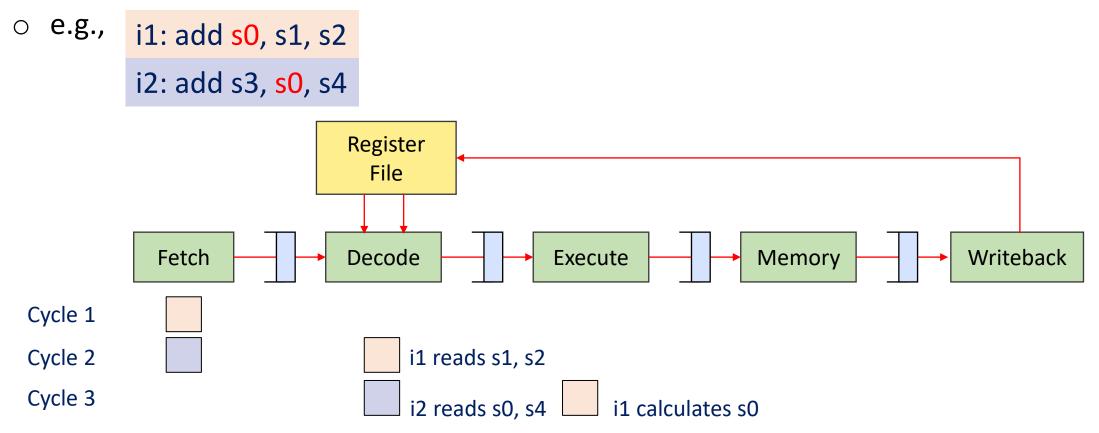
□ What should be stored in data+8? 3, right?



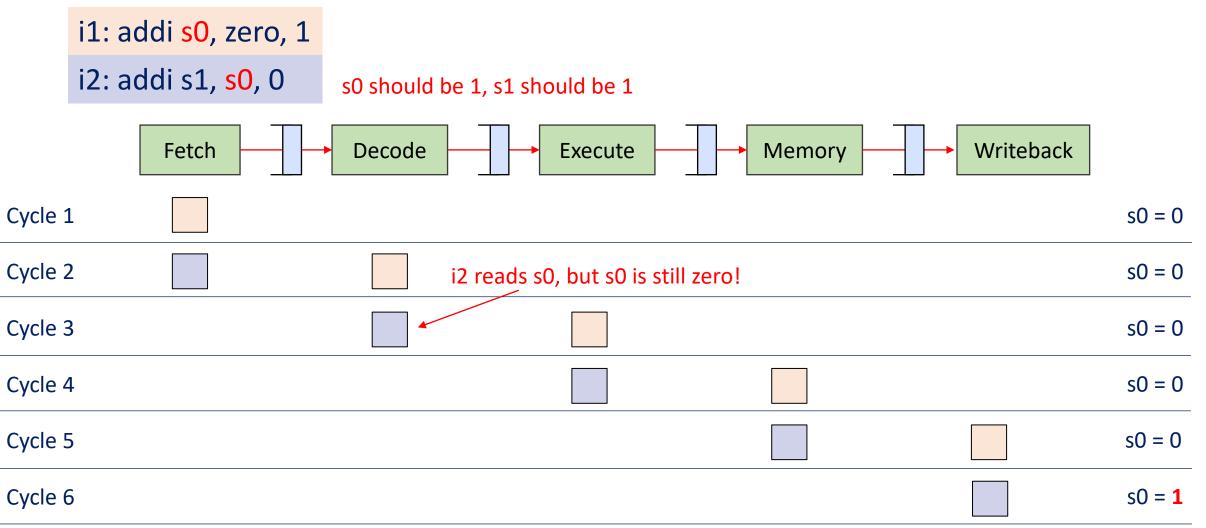
Assuming zero-initialized register file, our pipeline will write zero Why? "Hazards"

Hazard #1: Read-After-Write (RAW) Data hazard

When an instruction depends on a register updated by a previous instruction's execution results

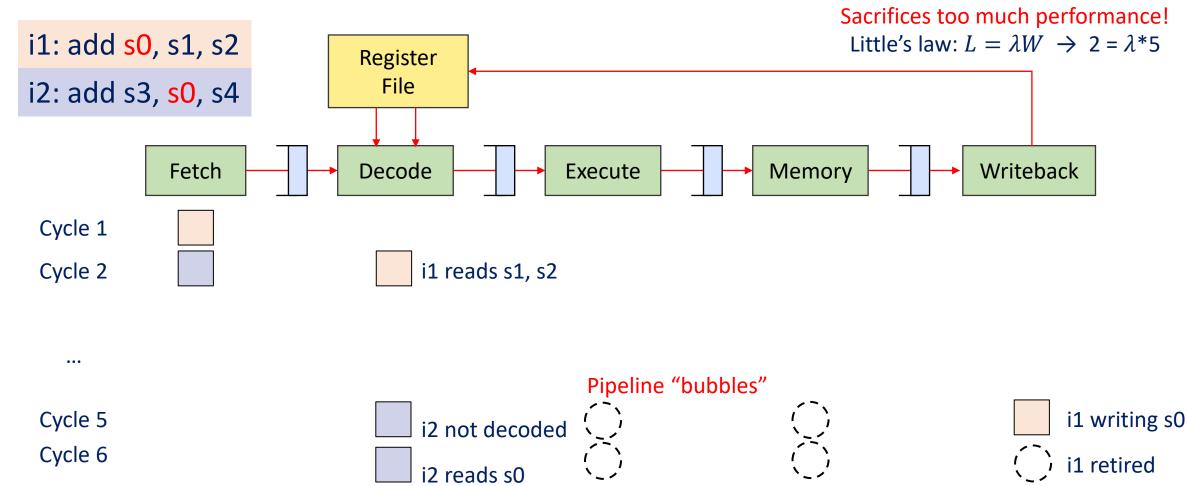


Hazard #1: Read-After Write (RAW) Hazard

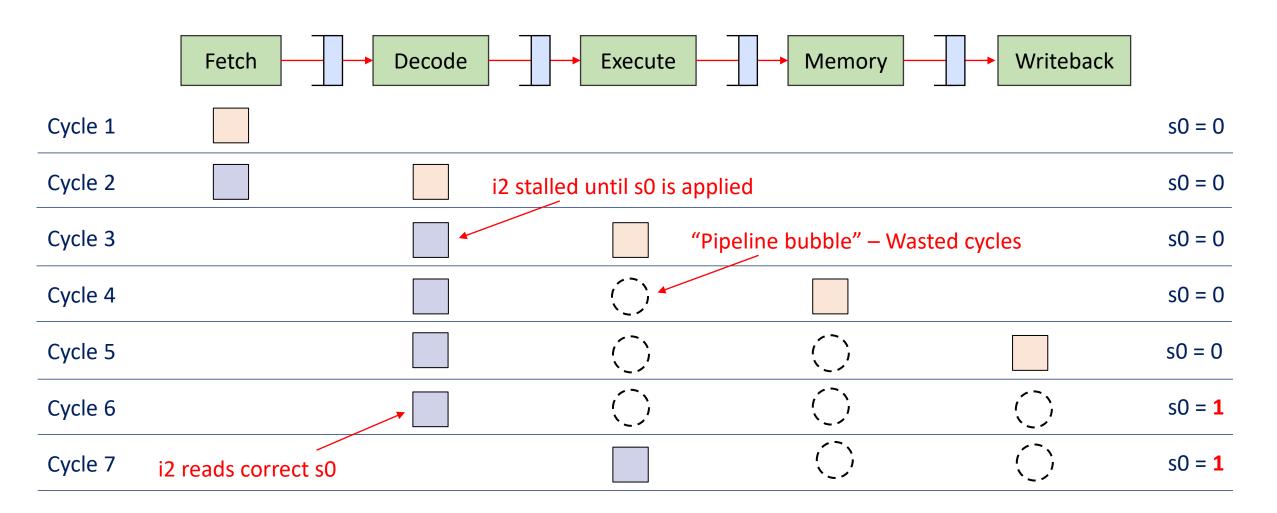


Solution #1: Stalling

The processor can choose to stall decoding when RAW hazard detected



Solution #1: Stalling

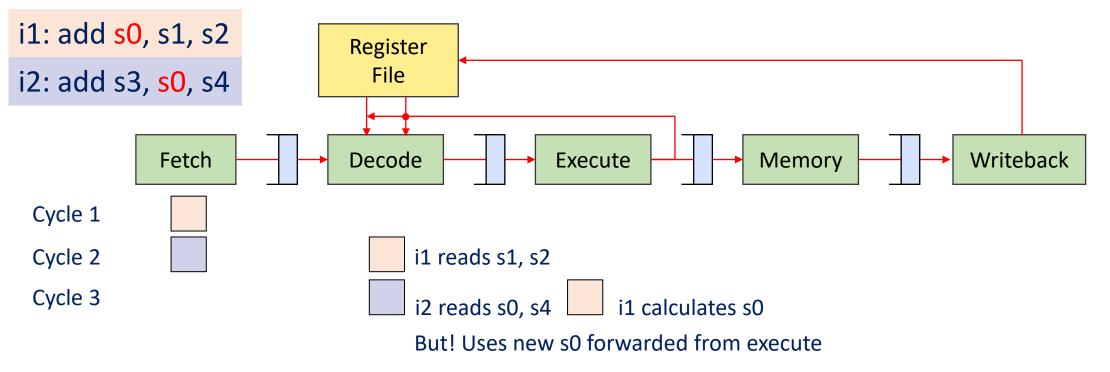


Sacrifices too much performance!

Solution #2: Forwarding (aka Bypassing)

□ Forward execution results to input of decode stage

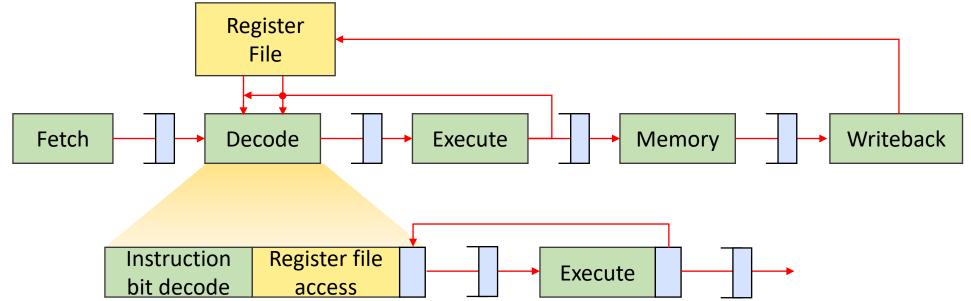
 \circ $\,$ New values are used if write index and a read index is the same



No pipeline stalls!

Solution #2: Forwarding details

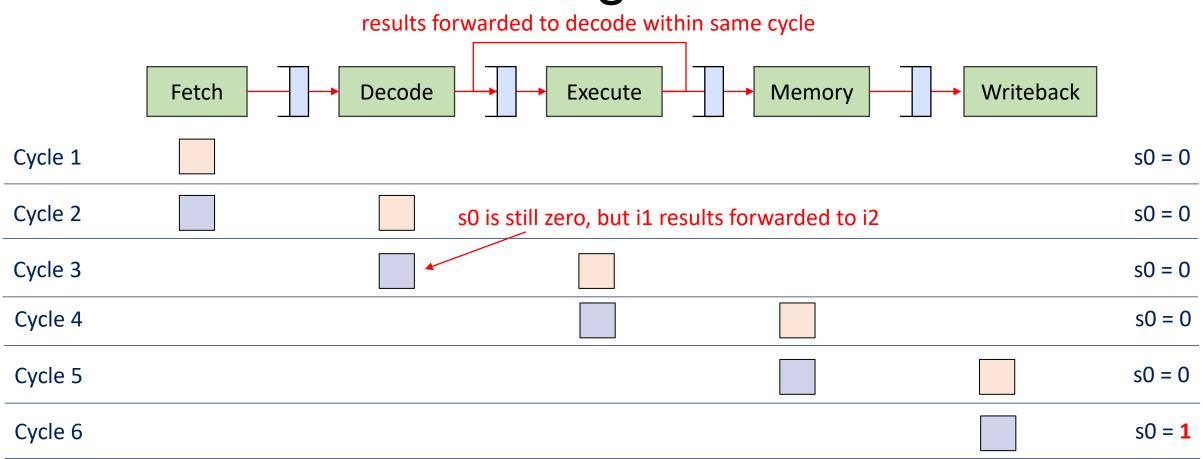
- May still require stalls for a deeper pipeline microarchitecture
 If execute took many cycles?
- Adds combinational path from execute to decode
 - But does not imbalance pipeline very much! (But it does a little bit)



Combinational path only to end of decode stage! (decode/regfile access does not depend on forwarded data)

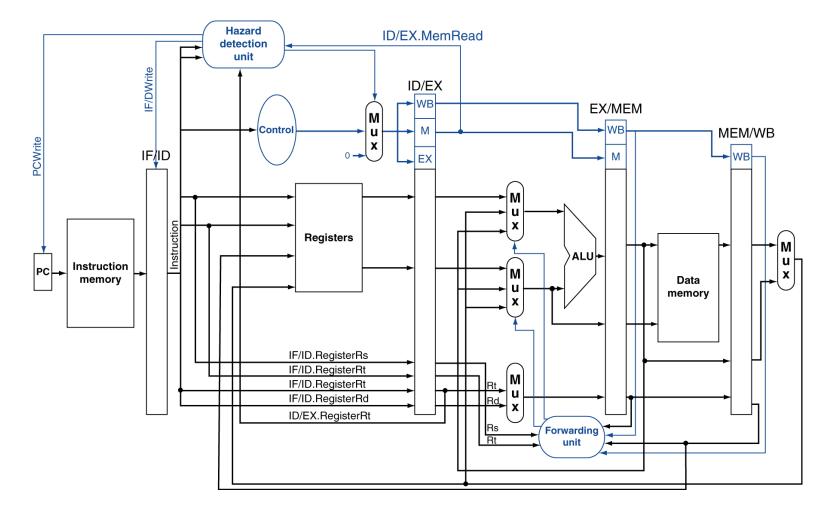
Solution #2:Forwarding

i1: addi s0, zero, 1 i2: addi s1, s0, 0



Forwarding is possible in this situation because the answer (s0 = 1) exists somewhere in the processor!

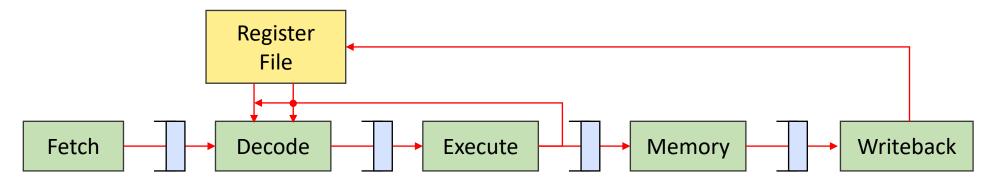
Datapath with Hazard Detection



Not very intuitive... We'll visit it with code at a discussion section

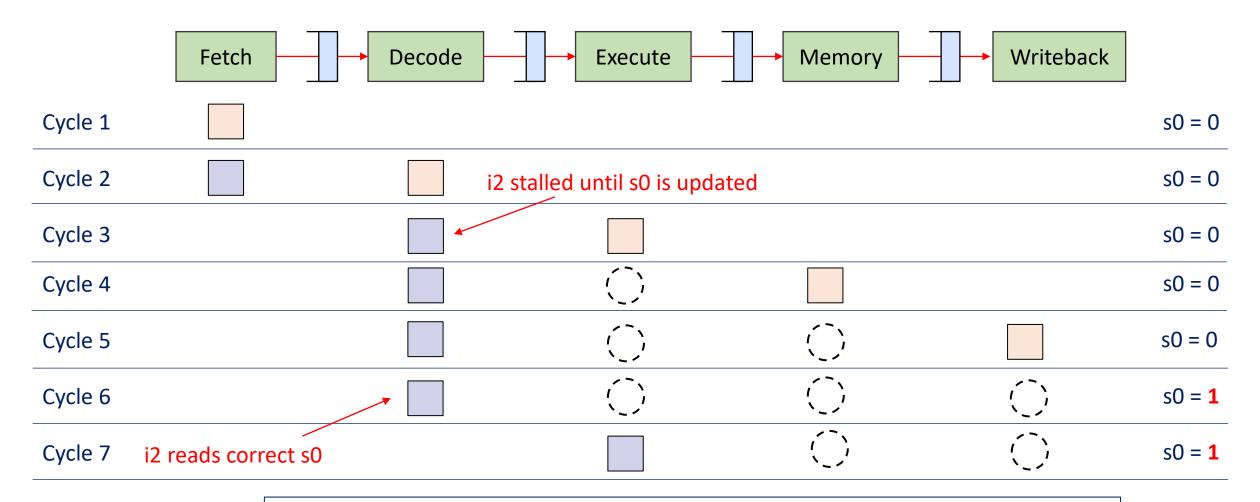
Hazard #2: Load-Use Data Hazard

- When an instruction depends on a register updated by a previous instruction
 - e.g., i1: lw s0, 0(s2)
 i2: addi s1, s0, 1
- □ Forwarding doesn't work here, as loads only materialize at writeback
 - $\circ~$ Only architectural choice is to stall



Hazard #2: Load-Use Data Hazard

i1: lw s0, 0(s2) i2: addi s1, s0, 1

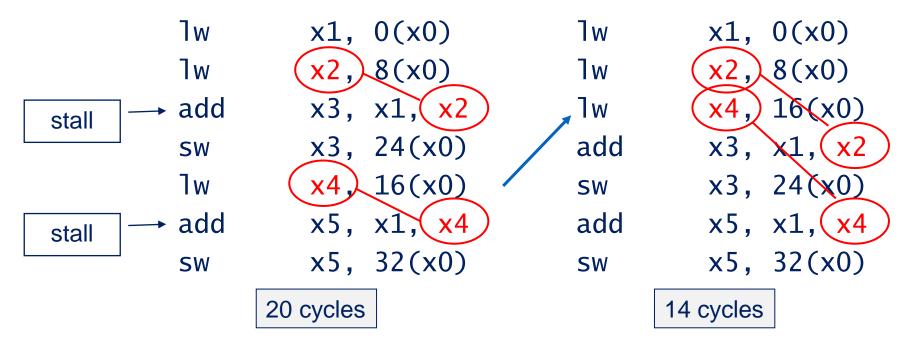


Forwarding is not useful because the answer (s0 = 1) exists outside the chip (memory)

A non-architectural solution: Code scheduling by compiler

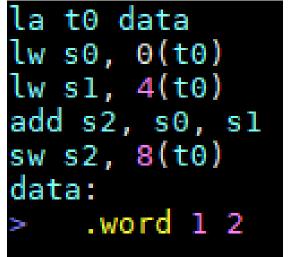
Reorder code to avoid use of load result in the next instruction

• e.g., a = b + e; c = b + f;



Compiler does best, but not always possible!

Review: A problematic example



← RAW hazard
← RAW hazard
← RAW hazard
← Load-Use hazard
← RAW hazard

□ Note: "la" is not an actual RISC-V instruction

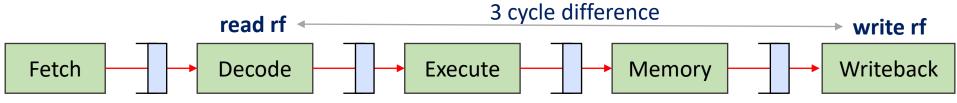
- $\circ~$ Pseudo-instruction expanded to one or more instructions by assembler
- o e.g., auipc x5,0x1
 addi x5,x5,-4 # ← RAW hazard!

Other potential data hazards

Dangerous if a later instruction's state access can happen before an earlier instruction's access

□ Read-After-Write (RAW) Hazard

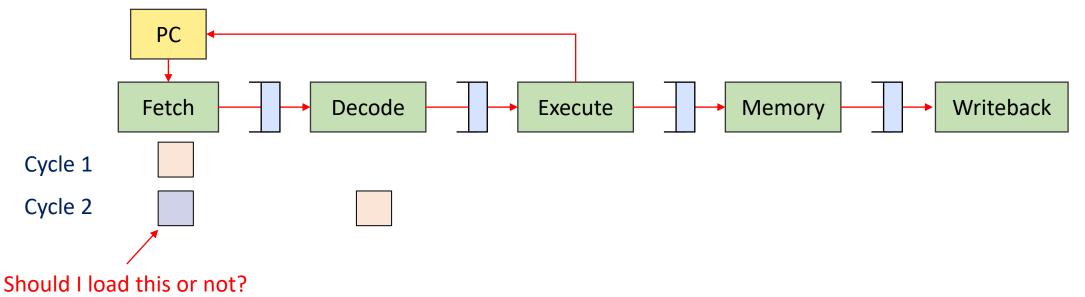
- Obviously dangerous! -- Writeback stage comes after decode stage
- (Later instructions' reads *can* happen before earlier instructions' write)
- Write-After-Write (WAW) Hazard
 - $\circ~$ No hazard for in-order processors
- □ Write-After-Read (WAR) Hazard
 - No hazard for in-order processors -- Writeback stage comes after decode stage
 - o (Later instructions' reads *cannot* happen before earlier instructions' write)
- □ Read-After-Read (RAR) Hazard?
 - \circ No hazard within processor



Hazard #3: Control hazard

- Branch determines flow of control
 - $\circ~$ Fetching next instruction depends on branch outcome
 - Pipeline can't always fetch correct instruction
 - e.g., Still working on decode stage of branch

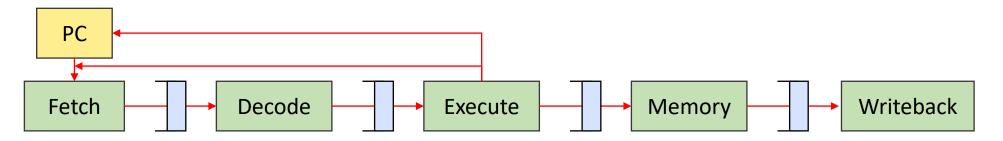
i1: beq s0, zero, elsewhere i2: addi s1, s0, 1



Control hazard (partial) solutions

Branch target address can be forwarded to the fetch stage

- $\circ~$ Without first being written to PC
- Still may introduce (one less, but still) bubbles



Decode stage can be augmented with logic to calculate branch target

- May imbalance pipeline, reducing performance
- Doesn't help if instruction memory takes long (cache miss, for example)

Aside: An awkward solution: Branch delay slot

- In a 5-stage pipeline with forwarding, one branch hazard bubble is injected in best scenario
- □ Original MIPS and SPARC processors included "branch delay slots"
 - One instruction after branch instruction was executed regardless of branch results
 - Compiler will do its best to find something to put there (if not, "nop")
- Goal: Always fill pipeline with useful work
- □ Reality:
 - $\circ~$ Difficult to always fill slot
 - Deeper pipelines meant one measly slot didn't add much (Modern MIPS has 5+ cycles branch penalty!)

But once it's added, it's forever in the ISA... One of the biggest criticisms of MIPS

CS250P: Computer Systems Architecture Achieving Correct Pipelining -- Branch Prediction



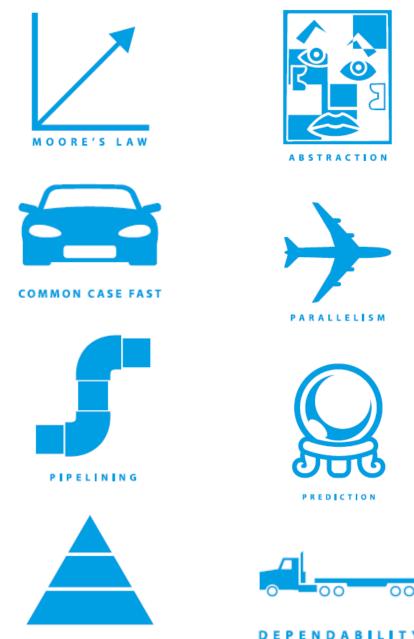
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Eight great ideas

- Design for Moore's Law
- Use abstraction to simplify design
- Make the common case fast
- Performance via parallelism
- Performance via pipelining
 - Performance via prediction
- □ Hierarchy of memories
- Dependability via redundancy



HIERARCHY

Control hazard and pipelining

□ Solving control hazards is a fundamental requirement for pipelining

- \circ Fetch stage needs to keep fetching instructions without feedback from later stages
- Must keep pipeline full somehow!
- $\circ \$... Can't know what to fetch



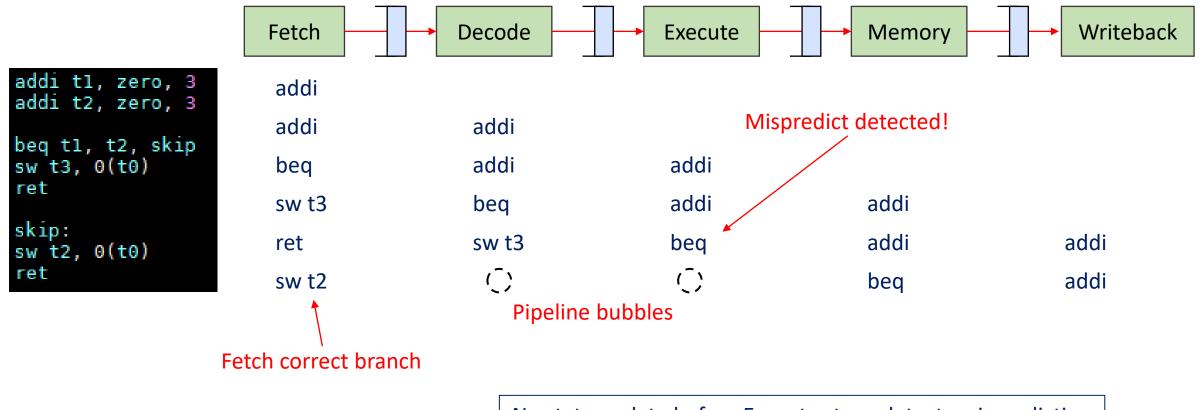
Cycle 1 Fetch PC = 0

Cycle 2 Fetch PC = ...? Decode PC = 0

Control hazard (partial) solution Branch prediction

- □ We will try to predict whether branch is taken or not
 - \circ If prediction is correct, great!
 - $\circ~$ If not, we somehow do not apply the effects of mis-predicted instructions
 - (Effectively same performance penalty as stalling in this case)
 - Very important to have mispredict detection before any state change!
 - Difficult to revert things like register writes, memory I/O
- □ Simplest branch predictor: Predict not taken
 - Fetch stage will keep fetching pc <= pc + 4 until someone tells it not to

Predict not taken example



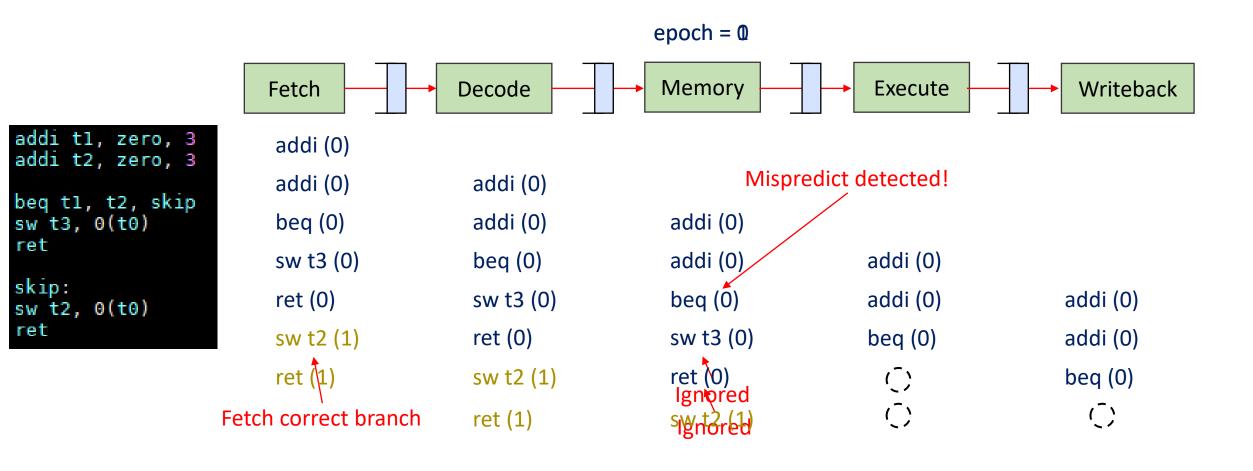
No state update before Execute stage detects misprediction (Fetch and Decode stages don't write to register)

How to handle mis-predictions?

□ Implementations vary, each with pros and cons

- Sometimes, execute sends a combinational signal to all previous stages, turning all instructions into a "nop"
- □ A simple method is "epoch-based"
 - All fetched instructions belong to an "epoch", represented with a number
 - Instructions are tagged with their epoch as they move through the pipeline
 - In the case of mis-predict detection, global epoch is increased, and future instructions from previous epochs are ignored

Predict not taken example with epochs



Some classes of branch predictors

□ Static branch prediction

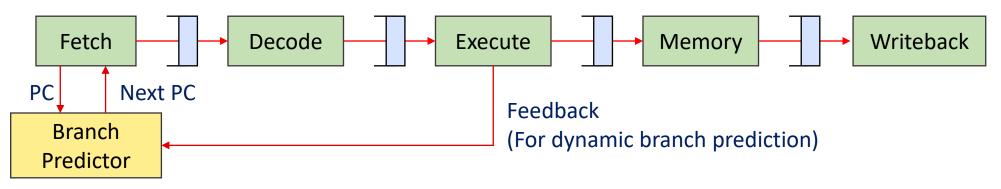
- Based on typical branch behavior
- Example: loop and if-statement branches
 - Predict backward branches taken
 - Predict forward branches not taken

Dynamic branch prediction

- $\circ~$ Hardware measures actual branch behavior
 - e.g., record recent history (1-bit "taken" or "not taken") of each branch in a fixed size "branch history table"
- Assume future behavior will continue the trend
 - When wrong, stall while re-fetching, and update history

Many many different methods, Lots of research, some even using neural networks!

Pipeline with branch prediction



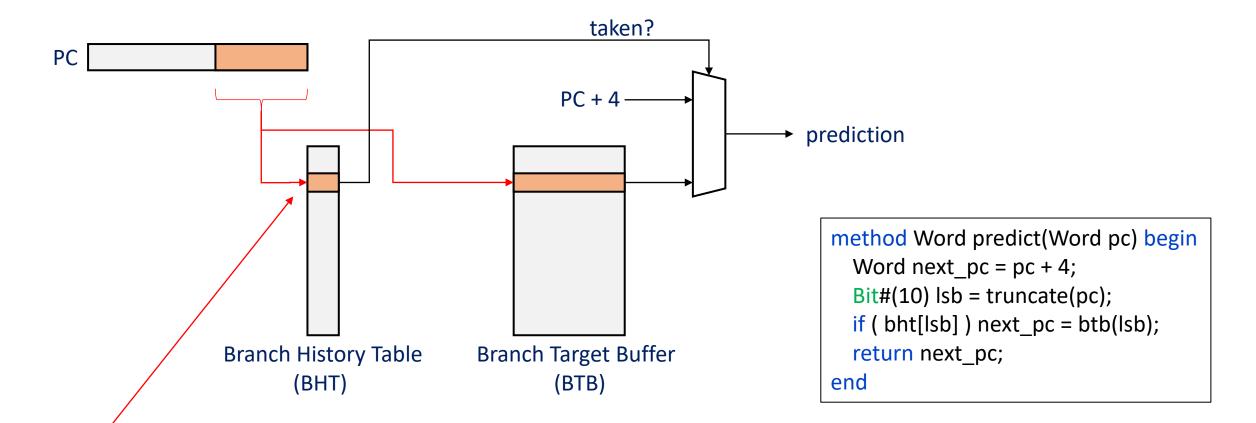
- Branch predictor predicts what should be the next PC
 - \circ $\,$ Typically based on the current PC as input $\,$
- Dynamic branch predictors adapt to program using feedback
- If prediction is correct, great! If not, make sure mispredicted instructions don't effect state
 - We looked at the epoch method of doing this (2 bubbles!)

Dynamic branch prediction

□ Two questions about a PC address being fetched

- Will this instruction cause a branch?
- If so, where will it branch to?
- $\circ~$ Both information are needed to predict-fetch a branch
- □ Two architectural entities for predicting the answer to these questions
 - Branch History Table (BHT)
 - Whether this instruction is an instruction, and if it causes a branch
 - Branch Target Buffer (BTB)
 - Which address this instruction will jump to
 - (There are many variations This is a common example)

Dynamic branch prediction



Execute stage updates BHT and BTB with actual behavior (if it is a branch instruction)

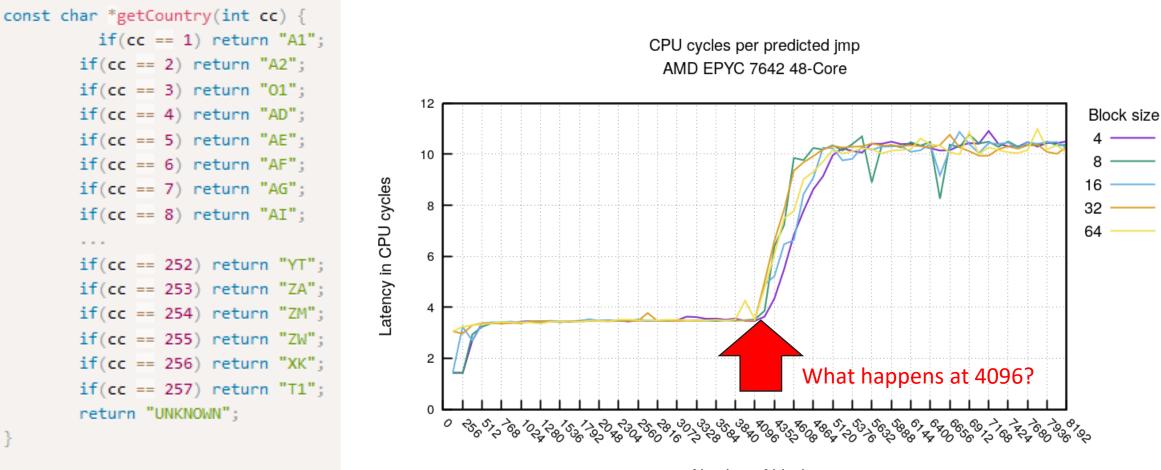
Why truncate PC? BHT/BTB is typically small! (2048 elements or so) Different branches may map to same buffer element... 😕

Back to the three questions

- □ Is it a branch instruction?
 - $\circ~$ Execute updates BHT if it is a branch instruction
- □ Is the branch taken?
 - $\circ~$ BHT stores if the branch was taken last time
- □ Where does the branch go?
 - $\circ~$ BTB stores where it went to last time

□ Of course, all three are merely predictions!

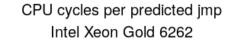
Impact of branch predictors on performance

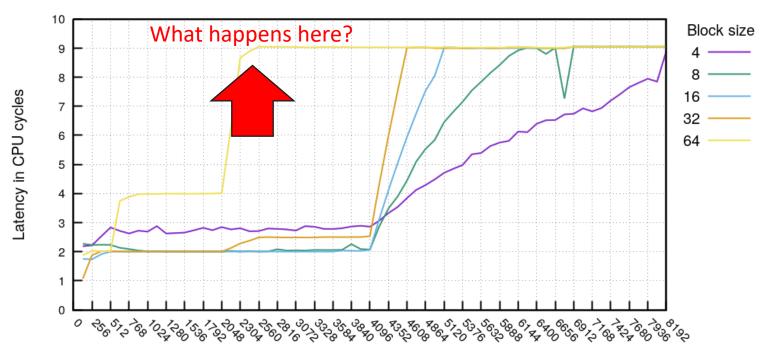


Number of blocks

Marek Majkowski, "Branch predictor: How many "if"s are too many? Including x86 and M1 benchmarks!" The Cloudflare Blog, 2021

Impact of branch predictors on performance





Number of blocks

Answer:

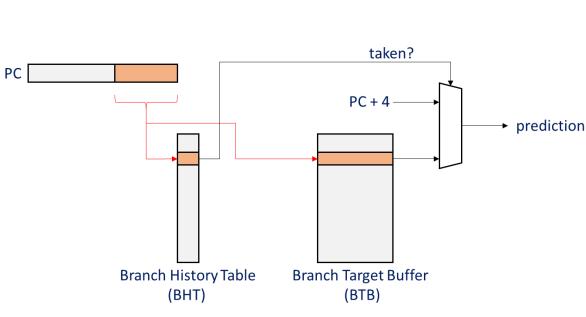
"Xeon BTB is 8-way set-associative"

-- will re-visit after talking about caches

jmp instructions placed evenly 64 bytes apart will harm performance...

Simple example: 1-bit predictor

- BHT has one-bit entries
 - Most recently taken/not taken
 - ("Last time predictor")
 - Does this work well?



How many mispredicts with these taken (T), not taken (N) sequences?

TNTNTNTNTN

- O TTTTTNNNNN <u>T</u>TTTT<mark>N</mark>NNNN
- TNTNTNTNTN

```
o for (i = 0 ... 2) {
    for (j = 0 ... 2) {
        for (j = 0 ... 2) {
        }
        Mispredict at j = 0 (<u>T</u>), j = 2 (<u>N</u>)
```

Simple example: 2-bit predictor

□ BHT has two bits – Single outlier does not change future predictions

- 00: Strongly not taken, 01: Not taken, 10: Taken, 11: Strongly taken
- Taken branch increases number, not taken branch decreases number
- Counter saturates! Taken after 11 -> 11, Not taken after 00 -> 00

□ How many mispredicts with these taken (T), not taken (N) sequences?

• TTTTTNNNNN <u>T</u>TTTT<u>NN</u>NNN

for (j = 0 ... 2) {

}

- TNTNTNTNTN Initialized to 01: TNTNTNTNTN

```
Mispredict once at i = 0 \&\& j = 0 (T), j = 2 (N),
```

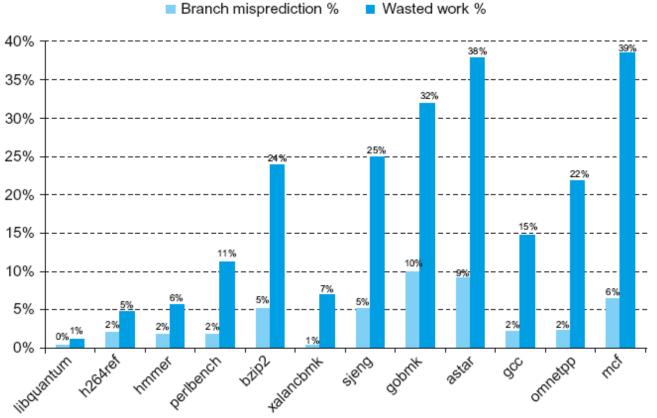
Branch prediction and performance

- □ Effectiveness of branch predictors is crucial for performance
 - Spoilers: On SPEC benchmarks, modern predictors routinely have 98+% accuracy
 - Of course, less-optimized code may have much worse behavior
- Branch-heavy software performance depends on good match between software pattern and branch prediction
 - Some high-performance software optimized for branch predictors in target hardware
 - Or, avoid branches altogether! (Branchless code)

In the real-world: Core i7 performance

□ Branch predictors work pretty well!

 But deep/wide pipelines result in high mispredict overhead



Aside: Impact of branches

16 "[This code] takes ~12 seconds to run. But 17 on commenting line 15, not touching the 18 rest, the same code takes ~33 seconds to 19 run." 20

22 "(running time may wary on different 23 machines, but the proportion will stay the 24 same)." 25

```
for (int c = 0; c < arraySize; ++c)</pre>
 data[c] = rnd.nextInt() % 256;
```

11

12

13

14

15

27

```
// With this, the next loop runs faster
Arrays.sort(data);
```

```
// Test
long start = System.nanoTime();
long sum = 0;
```

```
for (int i = 0; i < 100000; ++i) {
21
        // Primary loop
        for (int c = 0; c < arraySize; ++c) {</pre>
         if (data[c] \ge 128)
          sum += data[c];
26
       }
28
       System.out.println((System.nanoTime() - start) / 100000000.0);
29
       System.out.println("sum: " + sum);
30
```

Source: Harshal Parekh, "Branch Prediction — Everything you need to know."

Aside: Impact of branches

```
for (int i = 0 ; i < len ; i++) {</pre>
    if (nums[0][i] * nums[1][i] != 0) {
        arbitrary++;
    }
    /* Slower because it involves two branches
    if (nums[0][i] != 0 && nums[1][i] != 0) {
        arbitrary++;
    }
    */
}
```

Source: Harshal Parekh, "Branch Prediction — Everything you need to know."

Aside: Branchless programming

```
// Branch - Random
seconds = 10.93293813
// Branch - Sorted
seconds = 5.643797077
// Branchless - Random
seconds = 3.113581453
// Branchless - Sorted
seconds = 3.186068823
```

```
for (int c = 0; c < arraySize; ++c)
data[c] = rnd.nextInt() % 256;</pre>
```

```
// With this, the next loop runs faster
Arrays.sort(data);
```

```
// Test
```

```
long start = System.nanoTime();
```

```
long sum = 0;
```

```
for (int i = 0; i < 100000; ++i) {
    // Primary loop
    for (int c = 0; c < arraySize; ++c) {
        if (data[c] >= 128)
        sum += data[c];
        sum += ~t & data[c];
    }
}
System.out.println((System.nanoTime() - start) / 100000000.0);
```

```
System.out.println("sum: " + sum);
```

Source: Harshal Parekh, "Branch Prediction — Everything you need to know."

CS250P: Computer Systems Architecture

Performance Profiling with PerfTools





How To Evaluate Our Approaches?

- □ Say, we made a performance engineering change in our program
 - $\circ~$...And performance decreased by 10%
 - Why? Can we know?
- Many tools provide profiling capabilities
 - o gprof, OProfile, Valgrind, VTune, PIN, ...
- □ We will talk about perf, part of perf tools
 - Native support in the Linux kernel
 - Straightforward PMC (Performance Monitoring Counter) support

Aside: Performance Monitoring Counters (PMC)

- □ Problem: How can we measure architectural events?
 - L1 cache miss rates, branch mis-predicts, total cycle count, instruction count, ...
 - \circ $\,$ No way for software to know
 - $\circ~$ Events happen too often for software to be counting them
- □ Solution: PMCs (Sometimes called Hardware Performance Counters)
 - Dozens of special registers that can each be programmed to count an event
 - Privileged registers, only accessible by kernel
 - Supported PMCs differ across models and designs
- Usage
 - Program PMC, read PMC, run piece of code, read PMC, compare read values

Linux Perf

Performance analysis tool in Linux

- \circ $\,$ Natively supported by kernel
- Supports profiling a VERY wide range of events: PMC to kernel events
- $\circ~$ Note: needs sudo to do most things

□ Many operation modes: top, stat, record, report, ...

 $\circ~$ Supported events found in "sudo perf list"

List of pre-defined events (to be used in -e):			
branch-instructions OR branches	[Hardware event]	page-faults OR faults	[Software event]
branch-misses	[Hardware event]	task-clock	[Software event]
bus-cycles	[Hardware event]	Ll-dcache-load-misses	[Hardware cache event]
cache-misses	[Hardware event]	Ll-dcache-loads	[Hardware cache event]
cache-references	[Hardware event]	Ll-dcache-stores	[Hardware cache event]
cpu-cycles OR cycles	[Hardware event]	Ll-icache-load-misses	[Hardware cache event]
instructions	[Hardware event]	LLC-load-misses	[Hardware cache event]
ref-cycles	[Hardware event]	LLC-loads	[Hardware cache event]

Linux Perf: Stat

Default command prints some useful information

• "sudo perf stat ls"

\Box /More events can be traced using -e

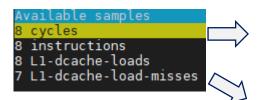
 sudo perf stat -e task-clock,page-faults,cycles,instructions,branches,branchmisses,LLC-loads,LLC-load-misses ls

Performance counter	stats for 'ls':		Performance counter	stats for 'ls':		
0.652008 0 104 2,797,861 2,245,082 444,095 16,749	task-clock (msec) context-switches cpu-migrations page-faults cycles instructions branches branch-misses	<pre># 0.805 CPUs utilized # 0.000 K/sec # 0.000 K/sec # 0.160 M/sec # 4.291 GHz # 0.80 insn per cycle # 681.119 M/sec # 3.77% of all branches</pre>		task-clock (msec) page-faults cycles instructions branches branch-misses LLC-loads LLC-loads LLC-load-misses	## ## ##	0.150 M/sec 4.286 GHz 0.76 insn per cycle 645.046 M/sec 3.78% of all branches

Linux Perf: Record, Report

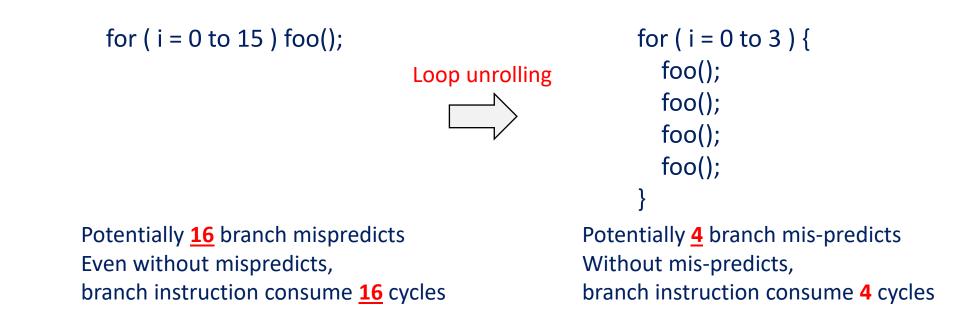
□ Log events with "record", interactively analyze it with "report"

- o sudo perf record -e cycles, instructions, L1-dcache-loads, L1-dcache-load-misses [...]
- Creates "perf.data"
- "sudo perf report" reads "perf.data"



Samples: Overhead 96.20% 3.80% 0.00% 0.00%	Command tail perf perf	Shared Object [kernel.kallsyms] [kernel.kallsyms] [kernel.kallsyms]	<pre>count (approx.): 2476964 Symbol [k] memcpy_erms [k] perf_event_addr_filters_exec [k] native_write_msr [k] native_write_msr</pre>	This is where most cycles are spent!
	Command tail perf perf perf	Shared Object [kernel.kallsyms] [kernel.kallsyms] [kernel.kallsyms] [kernel.kallsyms]	<pre>misses', Event count (approx.): 36818 Symbol [k] copy_page [k] perf_iterate_ctx [k] perf_event_addr_filters_exec [k] native_write_msr [k] native_write_msr</pre>	This is where most L1 cache misses are!

Loop unrolling: A compiler solution to branch hazards



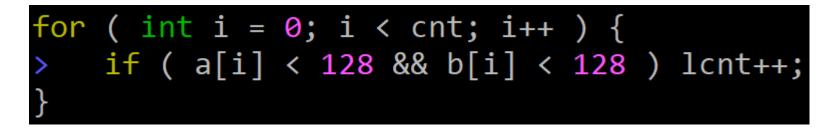
We can do this manually, or tell the compiler to do its best

- GCC flags -funroll-loops, -funroll-all-loops
- How much to unroll depends on heuristics within compiler

Code example: Counting numbers

□ How fast is the following code?

- \circ a and b are initialized to rand()%256
- o cnt is 100,000,000
- \circ Compiled with GCC –O3



□ This code takes 0.44s on my desktop (i5 @ 3 GHz)

- Each loop takes 13.2 cycles (3 GHz * 0.44 / 100,000,000)
- Can we do better? My x86 is 4-way superscalar!

Optimization attempt #1: Loop unrolling

There are three potential branch instruction locations

- \circ "i < cnt", "a[i] < 128", and b[i] < 128"
- □ Is the bottleneck the "for" loop?

 $\circ~$ Let's try giving -funroll-all-loops

for (int i = 0; i < cnt; i++) {
> if (a[i] < 128 && b[i] < 128) lcnt++;
}</pre>

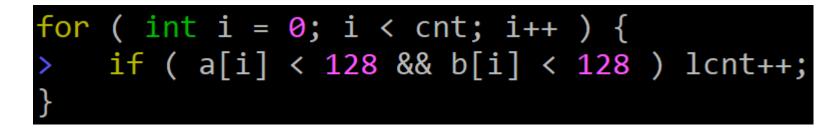
□ Performance increased from 0.44s to ~0.43s.

 \circ Better, but not by much

Identifying the bottleneck

□ We predict the "if" statements are the bottlenecks

- $\circ~$ Each of the two branch instructions has a 50% chance of being taken
- Branch prediction very inefficient!



Performance improves when comparison becomes skewed

- 0.44s when comparing against 128 (50%)
- \circ 0.27s when comparing against 64 (25%), 0.17s with 32

Optimization attempt #2: Branchless code

- Let's try getting rid of the "if" statement. How?
- □ Some knowledge of architectural treatment of numbers is required
 - x86 represents negative numbers via two's complement
 - "1" == 0x1, "-1" == 0xfffffff
 - "1>>31" == 0x0, "-1>>31" == 0xfffffff
- □ "(v-128)>>31"
 - if v >= 128: 0x0
 - v < 128: 0xfffffff

So many more instructions! Will this be faster?

for (int i = 0; i < cnt; i++) {
> lcnt += ((((a[i] - 128)>>31)&1) * (((b[i] - 128)>>31)&1));

Comparing Performance Numbers

Name	Elapsed (s)
Vanilla	0.44 s
Branchless	0.06 s



Vanilla: Total misses: 57 M out of 3,623 M

Overhead	Command	Shared Object	Symbol
87.38%	a.out	a.out	[.] main
9.80%	a.out	libc-2.27.so	[.]random
1.48%	a.out	libc-2.27.so	[.]random_r
0.36%	a.out	[kernel.kallsyms]	<pre>[k]pagevec_lru_add_fn</pre>
0.29%	a.out	[kernel.kallsyms]	<pre>[k] get_page_from_freelist</pre>

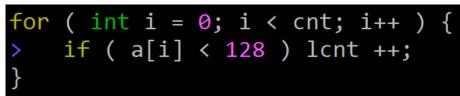
~2 cycles per loop! 8 Operations with 4 way superscalar...

Branchless: Total misses: 7 M out of 3,514 M

Over 7x performance!

Overhead	Command	Shared Object	Symbol
77.47%	a.out	libc-2.27.so	[.]random
10.13%	a.out	libc-2.27.so	[.]random_r
3.12%	a.out	[kernel.kallsyms]	<pre>[k] get_page_from_freelist</pre>
2.86%	a.out	[kernel.kallsyms]	<pre>[k]pagevec_lru_add_fn</pre>
1.78%	a.out	[kernel.kallsyms]	<pre>[k]handle_mm_fault</pre>
0.74%	a.out	a.out	[.] main
0.70%	a.out	libc-2.27.so	[.] rand

Interestingly, loop with only one comparator is automatically optimized by compiler



Shows same performance as the branchless one

CS250P: Computer Systems Architecture Achieving Correct Pipelining -- Superscalar



Sang-Woo Jun Fall 2022



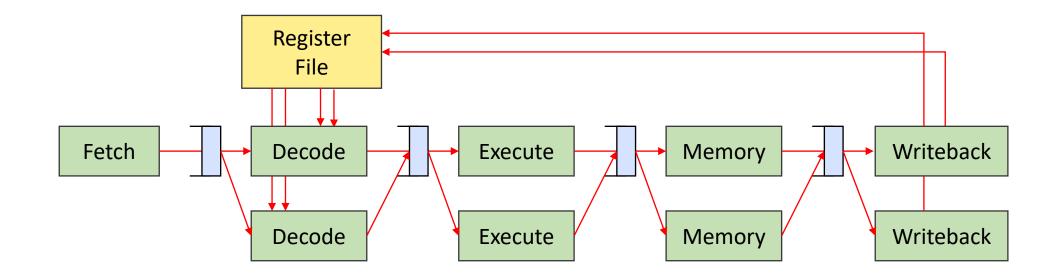
Large amount of material adapted from MIT 6.004, "Computation Structures", Morgan Kaufmann "Computer Organization and Design: The Hardware/Software Interface: RISC-V Edition", and CS 152 Slides by Isaac Scherson

Superscalar Processing

- An ideally pipelined processor can handle up to one instructions per cycle
 - Instructions Per Cycle (IPC) = 1, Cycles Per Instruction (CPI) = 1
- Superscalar wants to process multiple instruction per cycle
 - \circ IPC > 1, CPI <1
 - An N-way superscalar processor handles N instructions per cycle
 - Requires multiple pipeline hardware instances/resources
 - Hardware performs dependency checking on-the-fly between concurrentlyfetched instructions

Pipeline for superscalar processing

- Multiple copies of the datapath supports multiple instructions/cycle
- **Register file needs many more ports**
- □ Actually requires a complex scheduler in the decode stage!

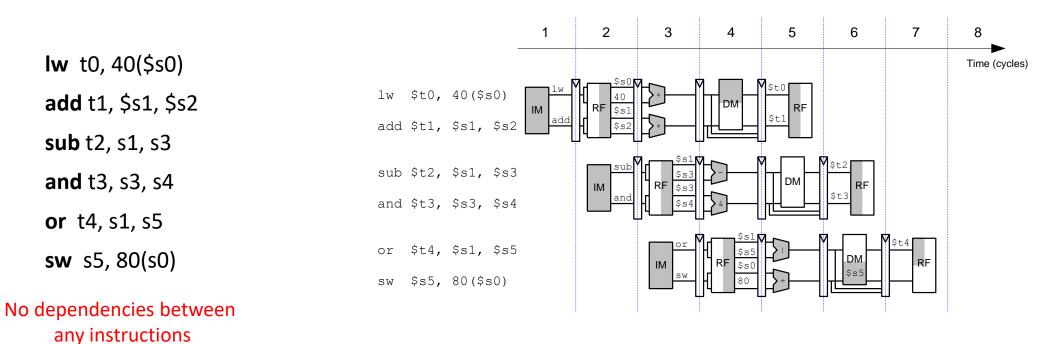


Superscalar has concurrent hazards

- □ What if two concurrently issued instructions have dependencies?
 - $\circ~$ No choice but to stall the dependent instruction...
 - ... in an in-order pipeline! ← Topic for another day
- Data hazards
 - e.g., "addi <u>s1</u>, s0, 1" and "addi s2, <u>s1</u>, 1" issued at the same time?
 - Forwarding won't work here! Both instructions in decode stage at the same time
 - Scheduler must stagger "addi s2, s1, 1", sacrificing performance
- Control hazards
 - \circ e.g., How to handle a beq, followed by another instruction?
 - Branch prediction, as usual

In-order superscalar example

Ideal IPC = 2 (2-Way superscalar)

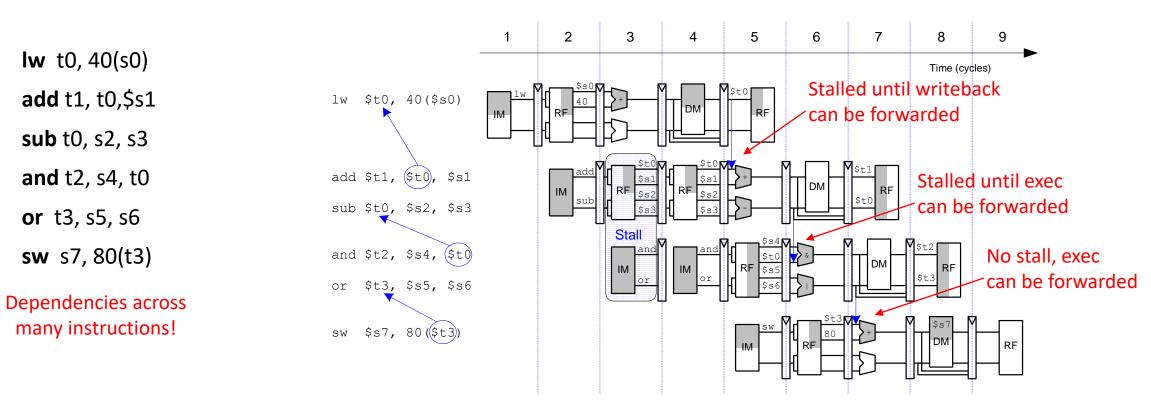


Actual IPC = 2 (6 instructions issued in 3 cycles)

Source: Onur Mutlu, "Design of Digital Circuits," Lecture 16, 2019

In-order superscalar with dependencies

Ideal IPC = 2 (2-Way superscalar)

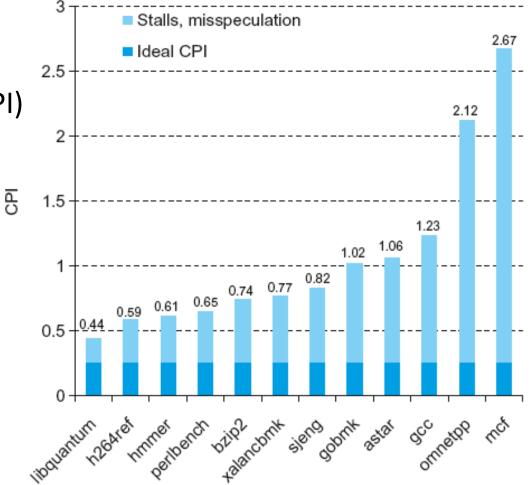


Actual IPC = 1.2 (6 instructions issued in 5 cycles)

In the real-world: Core i7 performance

- Core i7 has a 4-way *Out-of-Order* Superscalar pipeline
 - Ideally, 0.25 Cycles Per Instruction (CPI)
 - Dependencies and misprediction typically results in much lower performance

Is it worth it? Or do we want just more, simpler cores? Depends on your target area (servers? phones?) and profiling results...



Aside: Macro-op Fusion

Multiple (typically 2) instructions can be "fused" into a one

- $\circ~$ Decoder hardware emits one decoded instructions from two
- This does not affect ISA! Totally transparent to programmer/compiler

□ Why?

- $\circ~$ Smaller number of instructions to process
- While still maintaining RISC ISA (Also used in CISC / x86 with smaller instructions)
- Typical criticism of RISC is a larger number of generated instructions for same program
 - (More cycles to execute same program)

rd is immediately "clobbered" by ld Only one register write persists Can be fused into one instruction

Without more functionality in the execute stage

// rd = array[offset] addrd rs1, rs2 Id rd, 0(rd)

Aside: Macro-op Fusion

□ RISC-V benchmarks (RV64GC)

- SPECINT 2006 benchmarks
- Handful of fusion rules
- $\circ~$ About 5% decrease in executed instruction count

□ Compared against x86-64

- Without MOP Fusion: 1.16x instructions
- With MOP Fusion: 1.09x instructions!
- □ RISC paradigm but with less instruction overhead!

Programmer: I was not consulted about this!

Programmer: "If the processor told me it had parallel processing units, I would have written code optimized for it!"

Modern Processor Topics - Performance

□ Transparent Performance Improvements

- Pipelining, Caches
- Superscalar, Out-of-Order, Branch Prediction, Speculation, ...
- $\circ~$ Covered in CS250A and others
- □ Explicit Performance Improvements
 - SIMD extensions, AES extensions, ...

0 ...

