CS152: Computer Systems Architecture Pipelining



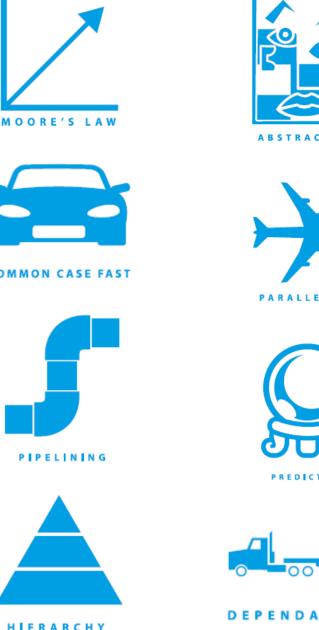
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Large amount of material adapted from MIT 6.004, "Computation Structures", Morgan Kaufmann "Computer Organization and Design: The Hardware/Software Interface: RISC-V Edition", and CS 152 Slides by Isaac Scherson

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





 $\circ \circ$

Performance Measures

□ Two metrics when designing a system

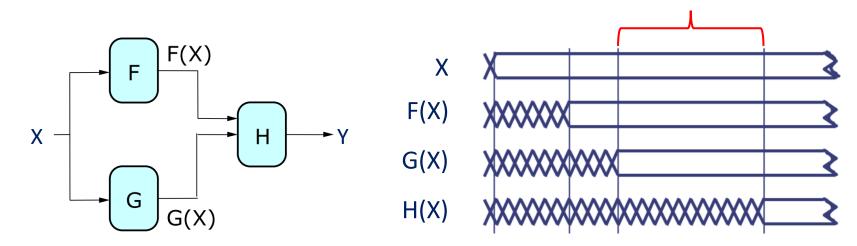
- 1. Latency: The delay from when an input enters the system until its associated output is produced
- 2. Throughput: The rate at which inputs or outputs are processed
- □ The metric to prioritize depends on the application
 - Embedded system for airbag deployment?
 - General-purpose processor? Throughput

Performance of Combinational Circuits

□ For combinational logic

- \circ latency = t_{PD}
- \circ throughput = 1/t_{PD}

F and G not doing work! Just holding output data

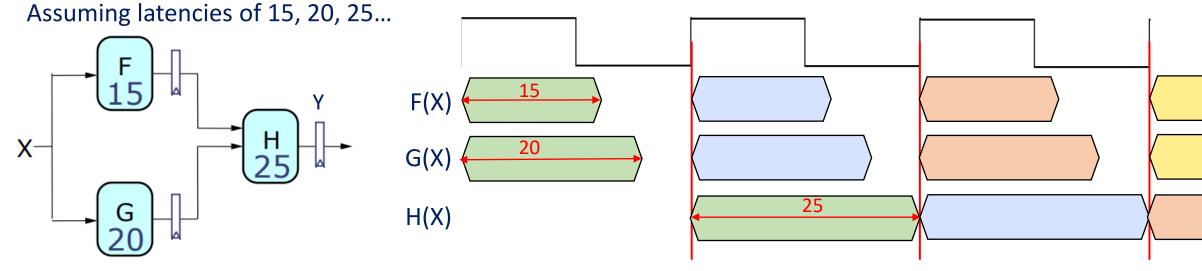


Is this an efficient way of using hardware?

Pipelined Circuits

Pipelining by adding registers to hold F and G's output

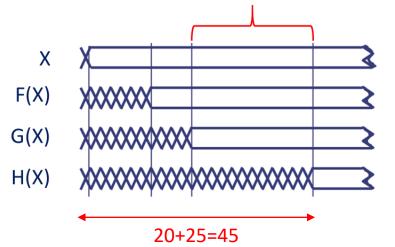
- \circ Now F & G can be working on input X_{i+1} while H is performing computation on X_i
- A 2-stage pipeline!
- For input X during clock cycle j, corresponding output is emitted during clock j+2.

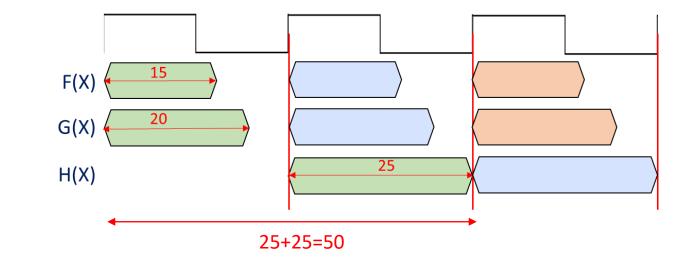


Assuming ideal registers

Pipelined Circuits

F and G not doing work! Just holding output data





	Latency	Throughput
Unpipelined	45	1/45
2-stage pipelined	50 (Worse!)	1/25 (Better!)

Pipeline conventions

Definition:

- A well-formed K-Stage Pipeline ("K-pipeline") is an acyclic circuit having exactly K registers on every path from an input to an output.
- $\circ~$ A combinational circuit is thus a 0-stage pipeline.
- **Composition convention:**
 - Every pipeline stage, hence every K-Stage pipeline, has a register on its output (not on its input).

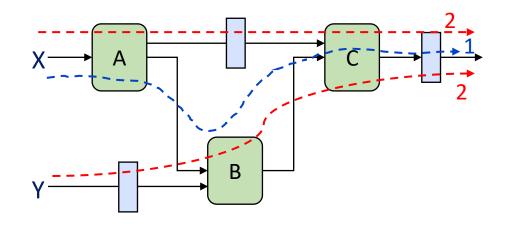
Clock period:

 $\,\circ\,\,$ The clock must have a period $t_{\rm CLK}$ sufficient to cover the longest register to register propagation delay plus setup time.

K-pipeline latency = K * t_{CLK} K-pipeline throughput = 1 / t_{CLK}

Ill-formed pipelines

□ Is the following circuit a K-stage pipeline? No



Problem:

- \circ $\,$ Some paths have different number of registers
- Values from different input sets get mixed! -> Incorrect results
 - B(Y_{t-1},A(X_t)) <- Mixing values from t and t-1

A pipelining methodology

□ Step 1:

 Draw a line that crosses every output in the circuit, and mark the endpoints as terminal points.

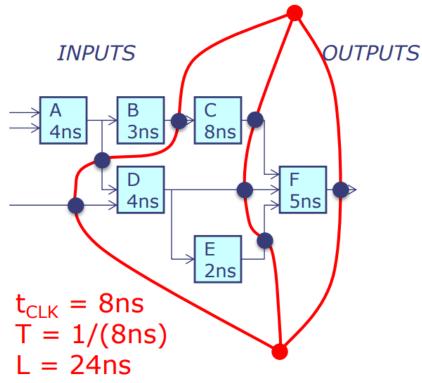
□ Step 2:

- Continue to draw new lines between the terminal T = 1/(points across various circuit connections, ensuring t L = 24r hat every connection crosses each line in the same direction.
- $\circ~$ These lines demarcate pipeline stages.

General Step 3:

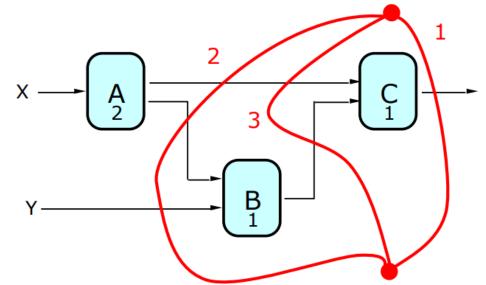
 $\circ~$ Add a pipeline register at every point where a separating line crosses a connection

Strategy: Try to break up high-latency elements, make each pipeline stage as low-latency as possible!



Pipelining example

- □ 1-pipeline improves neither L nor T
- T improved by breaking long combinational path, allowing faster clock
- Too many stages cost L, not improving T
- Back-to-back registers are sometimes needed for well-formed pipelines

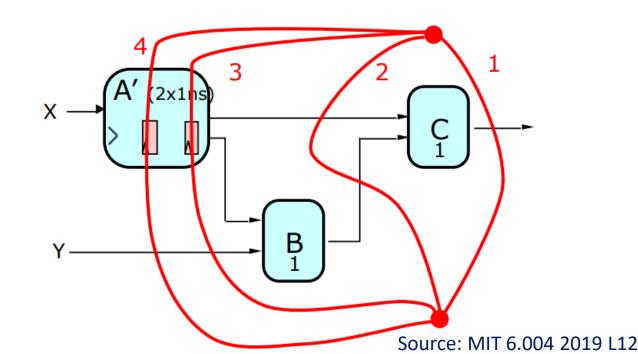


	LATENCY	THROUGHPUT
0-pipe:	4	1/4
1-pipe:	4	1/4
2-pipe:	4	1/2
3-pipe:	6	1/2

Hierarchical pipelining

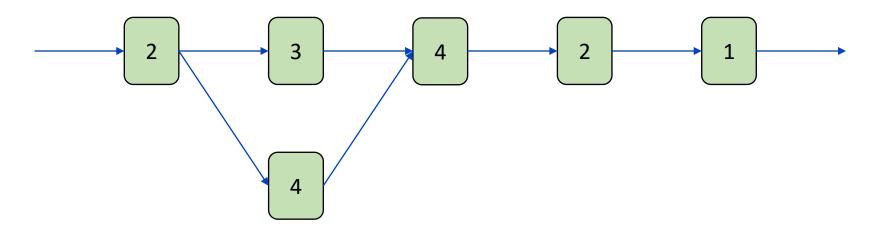
Pipelined systems can be hierarchical

- Replacing a slow combinational component with a k-pipe version may allow faster clock
- □ In the example:
 - 4-stage pipeline, T=1



Sample pipelining problem

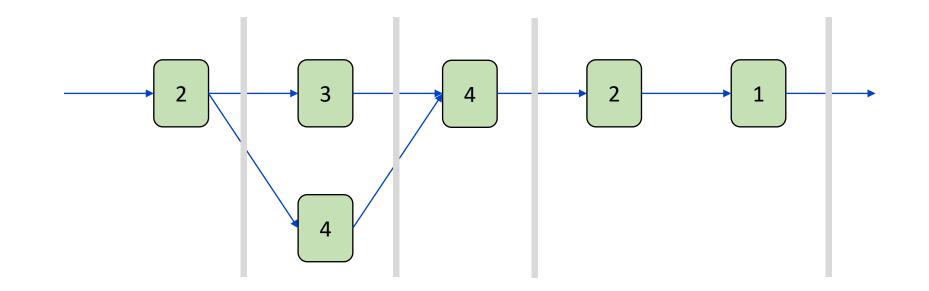
- Pipeline the following circuit for maximum throughput while minimizing latency.
 - $\circ~$ Each module is labeled with its latency



What is the best latency and throughput achievable?

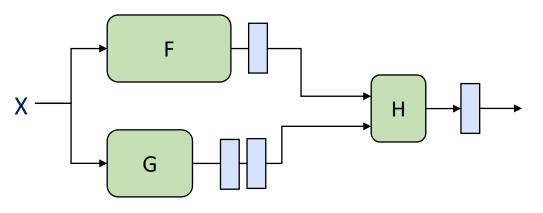
Sample pipelining problem

- \Box t_{CLK} = 4
- **T** = $\frac{1}{4}$
- **L** = 4*4 = 16



When pipelines are not deterministic

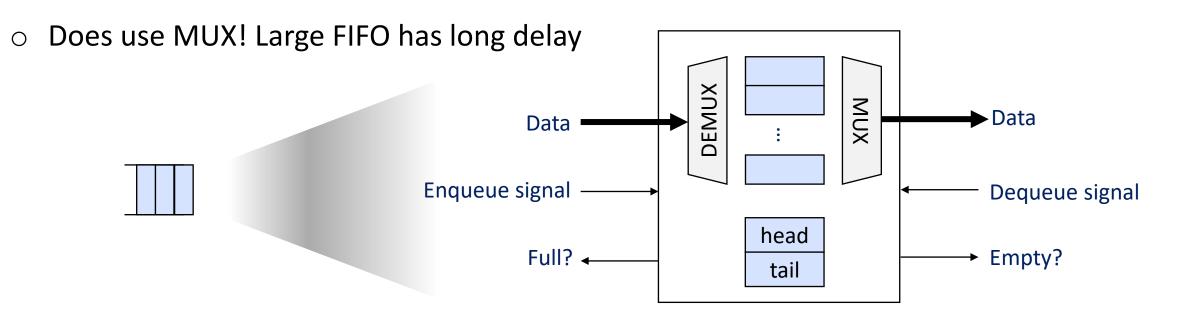
- Lock-step pipelines are great when modules are deterministic
 - $\circ~$ Good for carefully scheduled circuits like a well-optimized microprocessor
- □ What if the latency of F is non-deterministic?
 - At some cycles, F's pipeline register may hold invalid value
 - Pipeline register must be tagged with a valid flag
 - How many pipeline registers should we add to G? Max possible latency?
 - What if F and G are both non-deterministic? How many registers?



FIFOs (First-In First-Out)

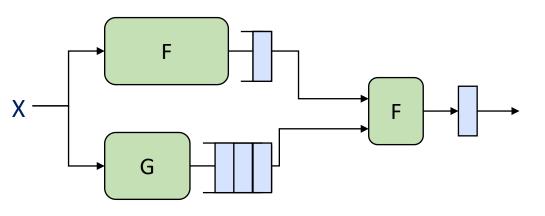
Queues in hardware

- Static size (because it's hardware)
- \circ User checks whether full or empty before enqueue or dequeue
- Enqueue/dequeue in single cycle regardless of size or occupancy



Counting cycles: Benefits of an elastic pipeline

- □ Assume F and G are multi-cycle, internally pipelined modules
 - If we don't know how many pipeline stages F or G has, how do we ensure correct results?
- ☐ Elastic pipeline allows correct results regardless of latency
 - If L(F) == L(G), enqueued data available at very next cycle (acts like single register)
 - If L(F) == L(G) + 1, FIFO acts like two pipelined registers
 - What if we made a 4-element FIFO, but L(F) == L(G) + 4?
 - G will block! Results will still be correct!
 - ... Just slower! How slow?

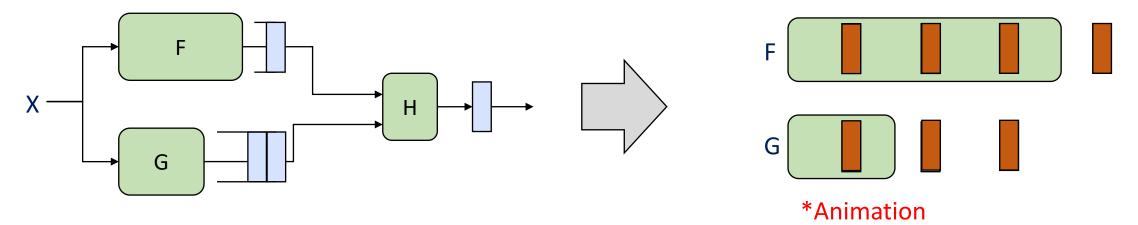


L <- Latency in cycles

Measuring pipeline performance

Latency of F is 3, Latency of G is 1, and we have a 2-element FIFO

 $\circ~$ What would be the performance of this pipeline?



One pipeline "bubble" every four cycles
 Duty cycle of ¾!

Aside: Little's law

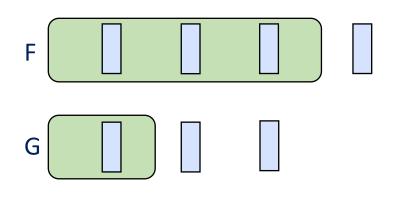
$\Box L = \lambda W$

- $\circ~$ L: Number of requests in the system
- \circ λ : Throughput
- W: Latency
- Imagine a DMV office! L: Number of booths. (Not number of chairs in the room)

□ In our pipeline example

- \circ L = 3 (limited by pipeline depth of G)
- \circ W = 4 (limited by pipeline depth of F)
- As a result: $\lambda = \frac{3}{4}!$

How do we improve performance? Larger FIFO, or Replicate G! (round-robin use of G1 and G2)



CS152: Computer Systems Architecture Processor Microarchitecture – Pipelining



Sang-Woo Jun Winter 2022



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Course outline

D Part 1: The Hardware-Software Interface

- What makes a 'good' processor?
- Assembly programming and conventions
- Part 2: Recap of digital design
 - Combinational and sequential circuits
 - How their restrictions influence processor design

Part 3: Computer Architecture

- \circ $\,$ Simple and pipelined processors $\,$
- o Computer Arithmetic
- \circ $\,$ Caches and the memory hierarchy
- Part 4: Computer Systems
 - Operating systems, Virtual memory

How to build a computing machine?

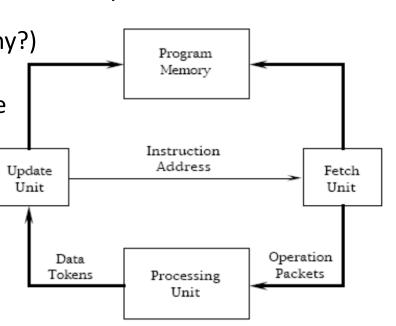
- □ Pretend the computers we know and love have never existed
- We want to build an automatic computing machine to solve mathematical problems
- Starting from (almost) scratch, where you have transistors and integrated circuits but no existing microarchitecture
 - \circ No PC, no register files, no ALU
- □ How would you do it? Would it look similar to what we have now?

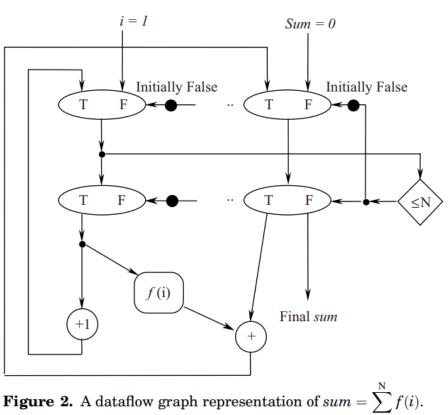
Aside: Dataflow architecture

Instead of traversing over instructions to execute, all instructions are independent, and are each executed whenever operands are ready

 Programs are represented as graphs (with dependency information)

Did not achieve market success, (why?) but the ideas are now everywhere e.g., Out-of-Order microarchitecture

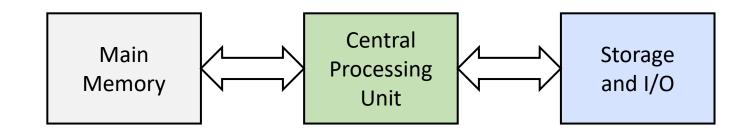




A "static" dataflow architecture

The von Neumann Model

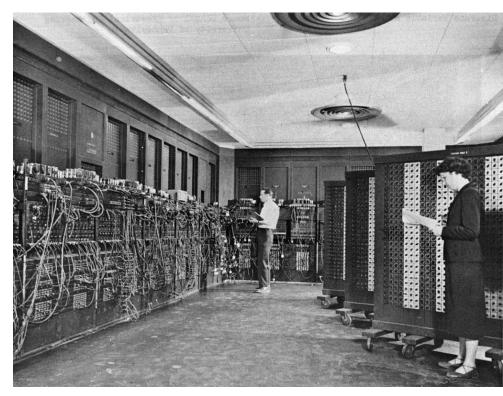
- □ Almost all modern computers are based on the von Neumann model
 - John von Neumann, 1945
 Key idea!
- Components
 - Main memory, where both <u>data</u> and <u>programs</u> are held
 - $\circ~$ Processing unit, which has a program counter and ALU
 - $\circ~$ Storage and I/O to communicate with the outside world



Key Idea: Stored-Program Computer

- Very early computers were programmed by manually adjusting switches and knobs of the individual programming elements
 - (e.g., ENIAC, 1945)
- von Neumann Machines instead had a general-purpose CPU, which loaded its instructions also from memory
 - Express a program as a sequence of coded instructions, which the CPU fetches, interprets, and executes
 - o "Treating programs as data"

Similar in concept to a universal Turing machine (1936)

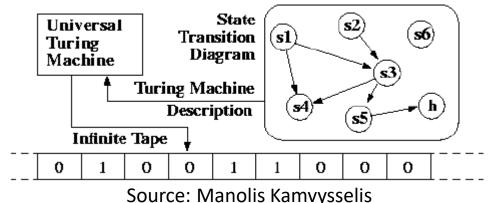


ENIAC, Source: US Army photo

von Neumann and Turing machine

Turing machine is a mathematical model of computing machines

- Proven to be able to compute any mechanically computable functions
- Anything an algorithm can compute, it can compute
- Components include
 - $\circ~$ An infinite tape (like memory) and a header which can read/write a location
 - A state transition diagram (like program) and a current location (like pc)
 - State transition done according to current value in tape
- Only natural that computer designs gravitate towards provably universal models



Stored program computer, now what?

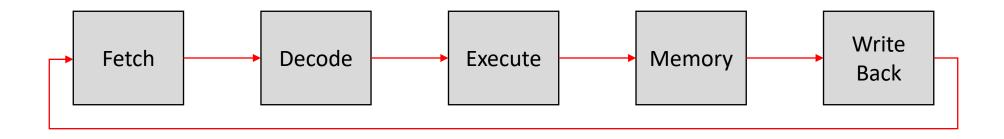
- □ Once we decide on the stored program computer paradigm
 - With program counter (PC) pointing to encoded programs in memory
- Then it becomes an issue of deciding the programming abstraction
 Instruction set architecture, which we talked about
- □ Then, it becomes an issue of executing it quickly and efficiently
 - Microarchitecture! Improving performance/efficiency/etc while maintaining ISA abstraction
 - \circ $\,$ Which is the core of this class, starting now

The classic RISC pipeline

Many early RISC processors had very similar structure

- MIPS, SPARC, etc...
- Major criticism of MIPS is that it is too optimized for this 5-stage pipeline

□ RISC-V is also typically taught using this structure as well

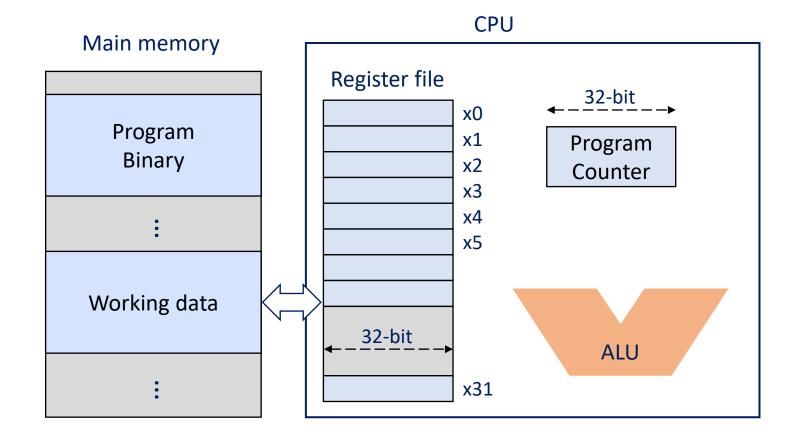


Why these 5 stages? Why not 4 or 6?

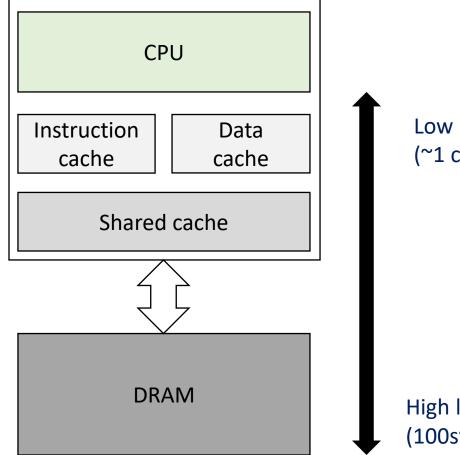
The classic RISC pipeline

- □ Fetch: Request instruction fetch from memory
- Decode: Instruction decode & register read
- □ Execute: Execute operation or calculate address
- □ Memory: Request memory read or write
- □ Writeback: Write result (either from execute or memory) back to register

Major components of a microprocessor



A high-level view of computer architecture



Low latency (~1 cycle)

High latency (100s~1000s of cycles)

Will deal with caches in detail later!

Designing a microprocessor

□ Many, many constraints processors are optimize for, but for now:

□ Constraint 1: Circuit timing

 Processors are complex! How do we organize the pipeline to process instructions as fast as possible?

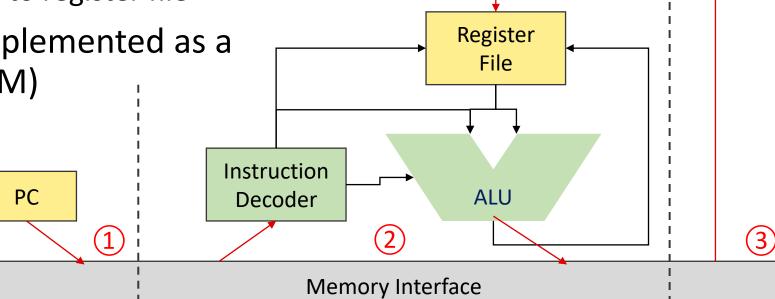
□ Constraint 2: Memory access latency

- Register files can be accessed as a combinational circuit, but it is small
- All other memory have high latency, and must be accessed in separate request/response
 - Memory can have high *throughput*, but also high *latency*

Memory will be covered in detail later!

The most basic microarchitecture

- Because memory is not combinational, our RISC ISA requires at least three disjoint stages to handle
 - \circ Instruction fetch
 - Instruction receive, decode, execute (ALU), register file access, memory request
 - $\circ~$ If mem read, write read to register file
- □ Three stages can be implemented as a Finite State Machine (FSM)

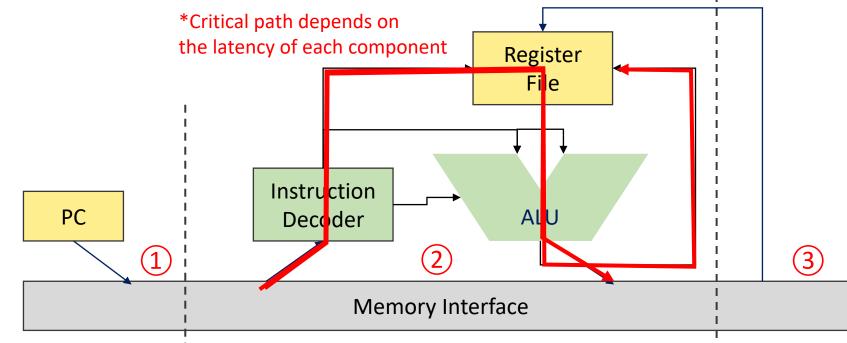


Will this processor be fast? Why or why not?

Limitations of our simple microarchitecture

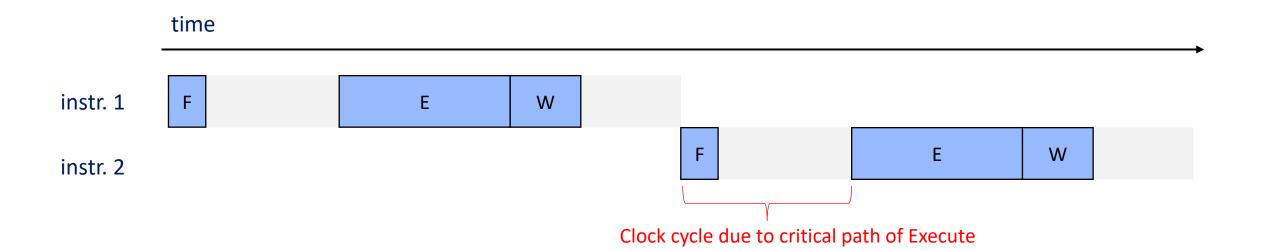
Stage two is disproportionately long

- Very long critical path, which limits the clock speed of the whole processor
- Stages are "not balanced"
- □ Note: we have not pipelined things yet!



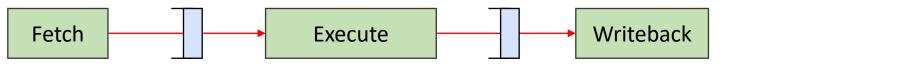
Limitations of our simple microarchitecture

- □ Let's call our stages Fetch("F"), Execute("E"), and Writeback ("W")
- □ Speed of our simple microarchitecture, assuming:
 - Clock-synchronous circuits, single-cycle memory
- Lots of time not spent doing useful work!
 - \circ Can pipelining help with performance?



Pipelined processor introduction

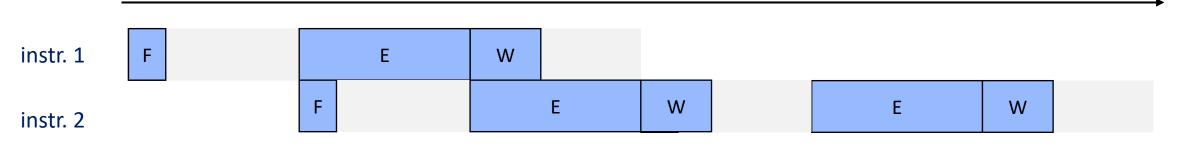
Attempt to pipeline our processor using pipeline registers/FIFOs



□ Much better latency and throughput!

* We will see soon why pipelining a processor isn't this simple

- $\circ~$ Average CPI reduced from 3 to 1!
- Still lots of time spent not doing work. Can we do better?
 time

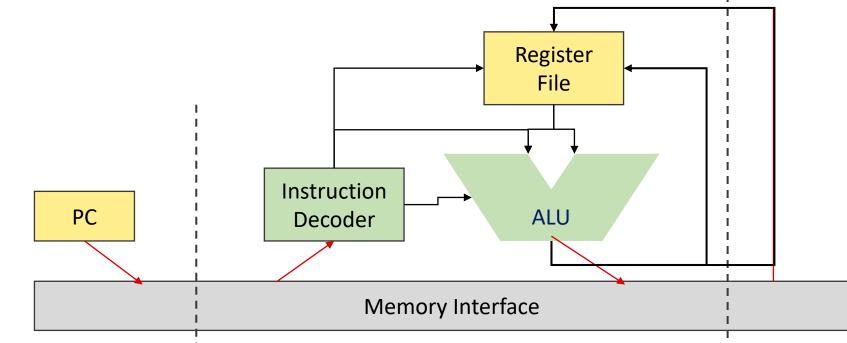


Note we need a memory interface with two concurrent interfaces now! (For fetch and execute) Remember instruction and data caches!

Building a balanced pipeline

- □ Must reduce the critical path of Execute
- Writing ALU results to register file can be moved to "Writeback"
 - $\circ~$ Most circuitry already exists in writeback stage
 - $\circ~$ No instruction uses memory load and ALU at the same time





Building a balanced pipeline

Divide execute into multiple stages

- o "Decode"
 - Extract bit-encoded values from instruction word
 - Read register file
- o "Execute"
 - Perform ALU operations
- o "Memory"
 - Request memory read/write

□ No single critical path which reads and writes to register file in one cycle

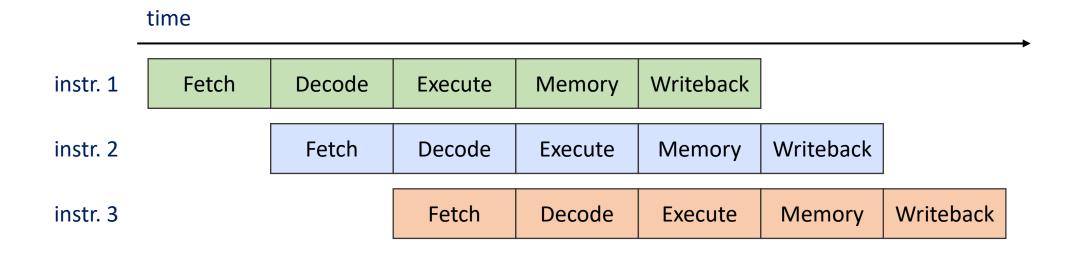


Results in a small number of stages with relatively good balance!

Ideally balanced pipeline performance

□ Clock cycle: 1/5 of total latency

□ Circuits in all stages are always busy with useful work

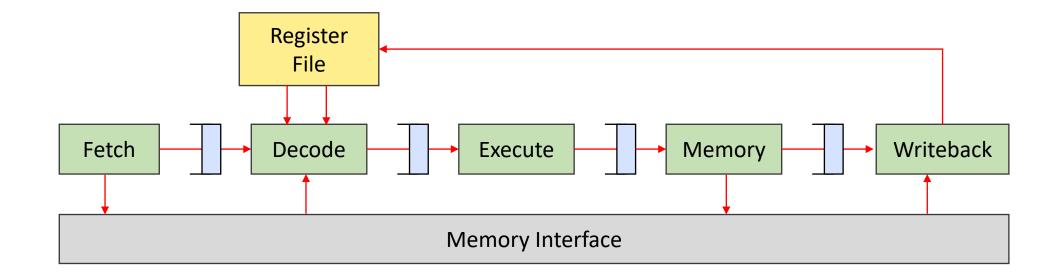


Aside: Real-world processors have wide range of pipeline stages

Name	Stages
AVR/PIC microcontrollers	2
ARM Cortex-M0	3
Apple A9 (Based on ARMv8)	16
Original Intel Pentium	5
Intel Pentium 4	30+
Intel Core (i3,i5,i7,)	14+
RISC-V Rocket	6

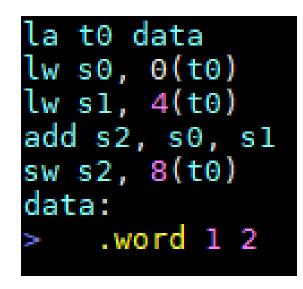
Designs change based on requirements!

Will our pipeline operate correctly?



A problematic example

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



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

CS152: Computer Systems Architecture Achieving Correct Pipelining



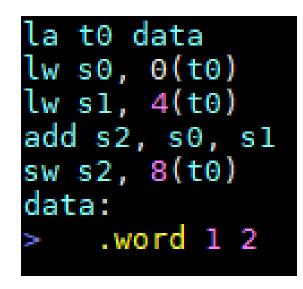
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A problematic example

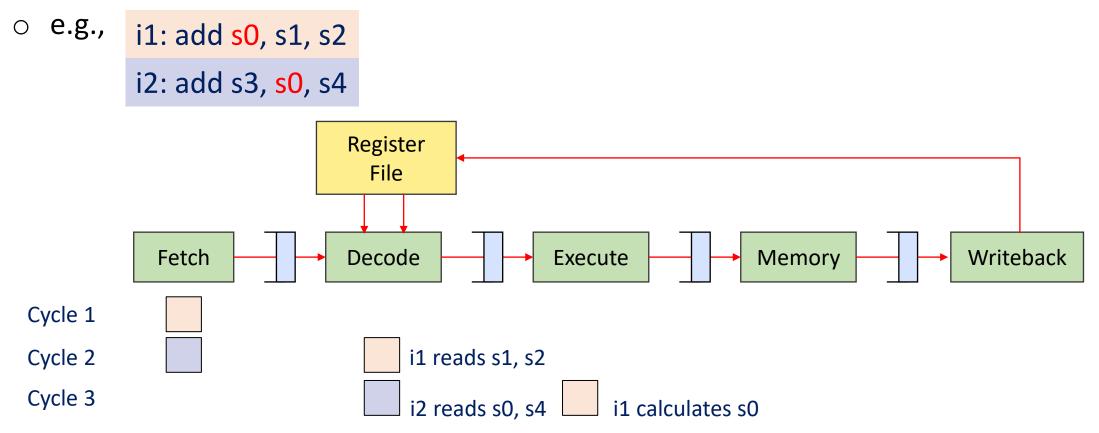
□ What should be stored in data+8? 3, right?



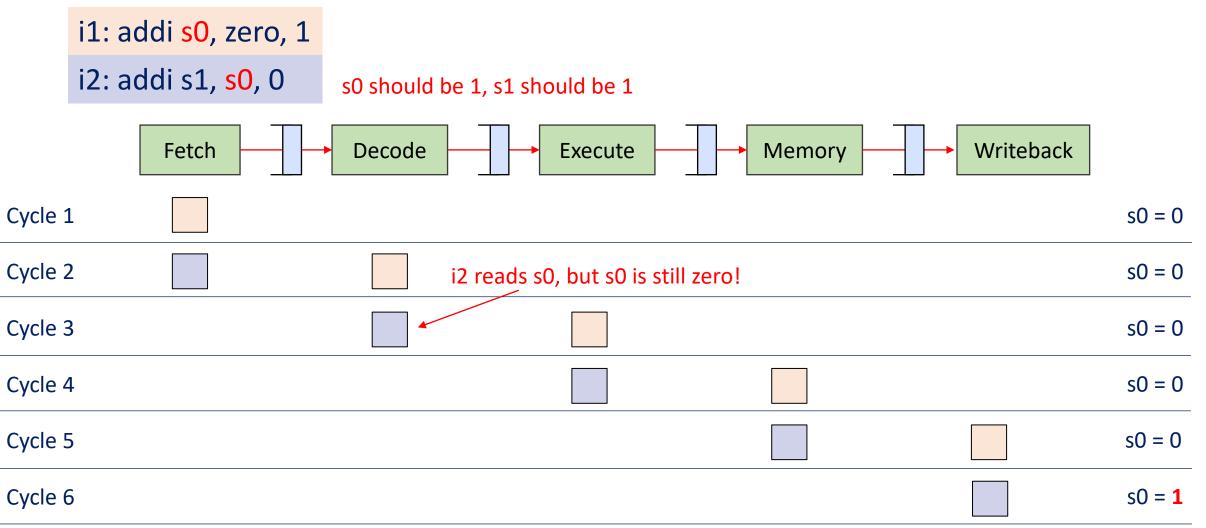
Assuming zero-initialized register file, our pipeline will write zero Why? "Hazards"

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

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

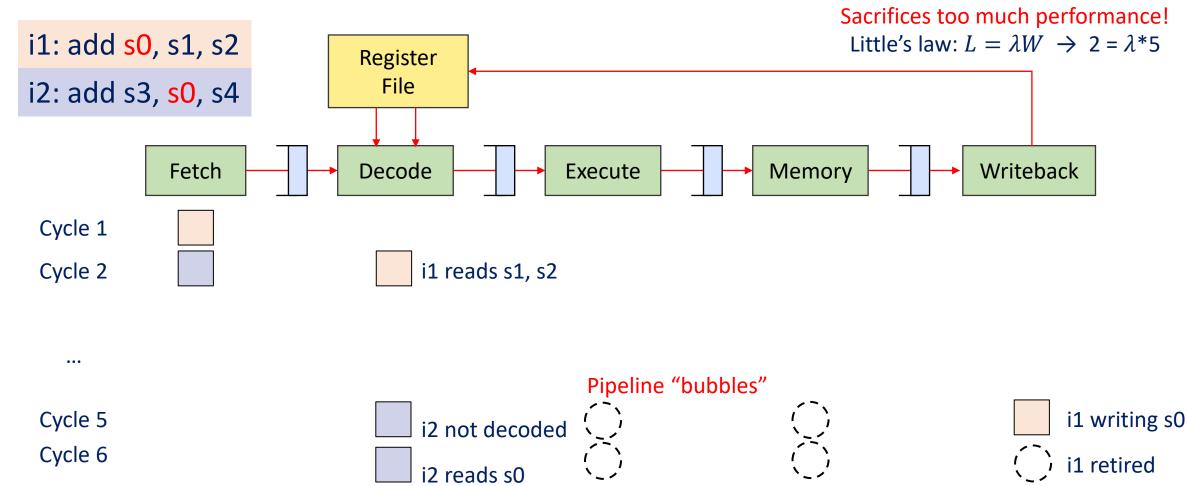


Hazard #1: Read-After Write (RAW) Hazard

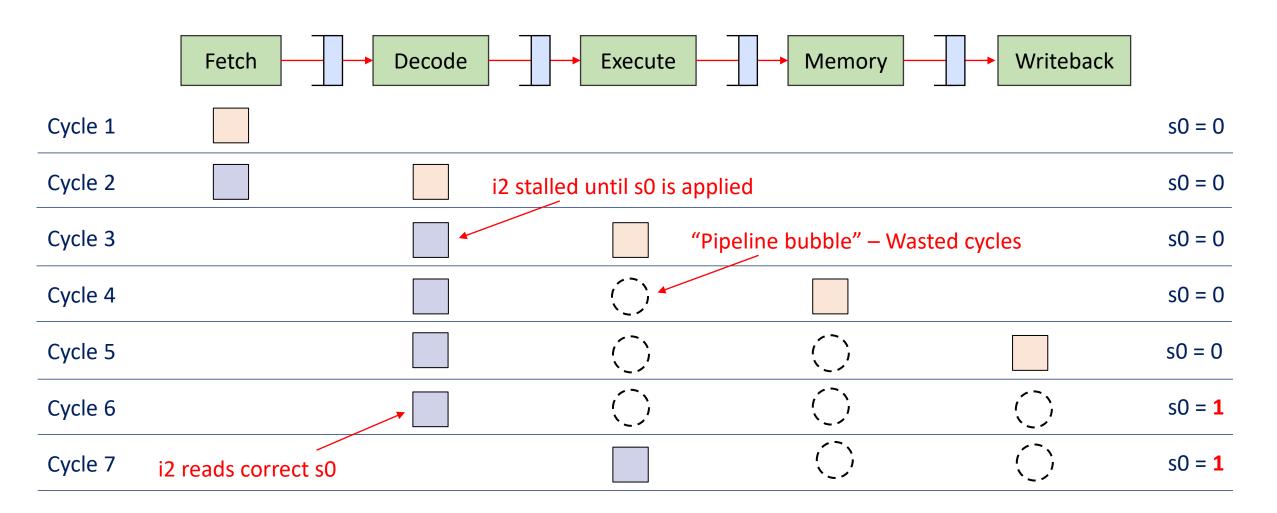


Solution #1: Stalling

The processor can choose to stall decoding when RAW hazard detected



Solution #1: Stalling

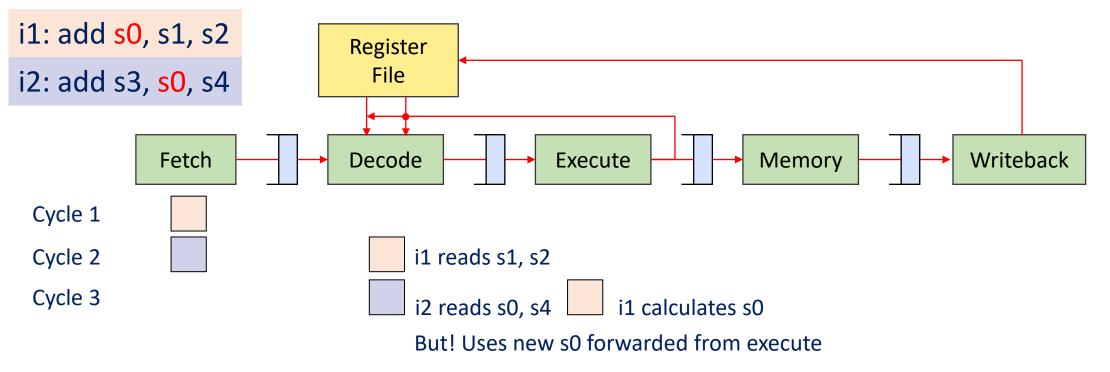


Sacrifices too much performance!

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

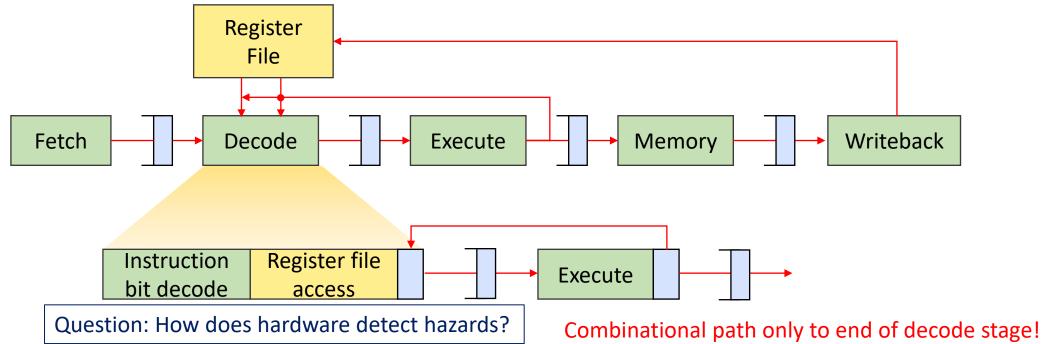


No pipeline stalls!

Solution #2: Forwarding details

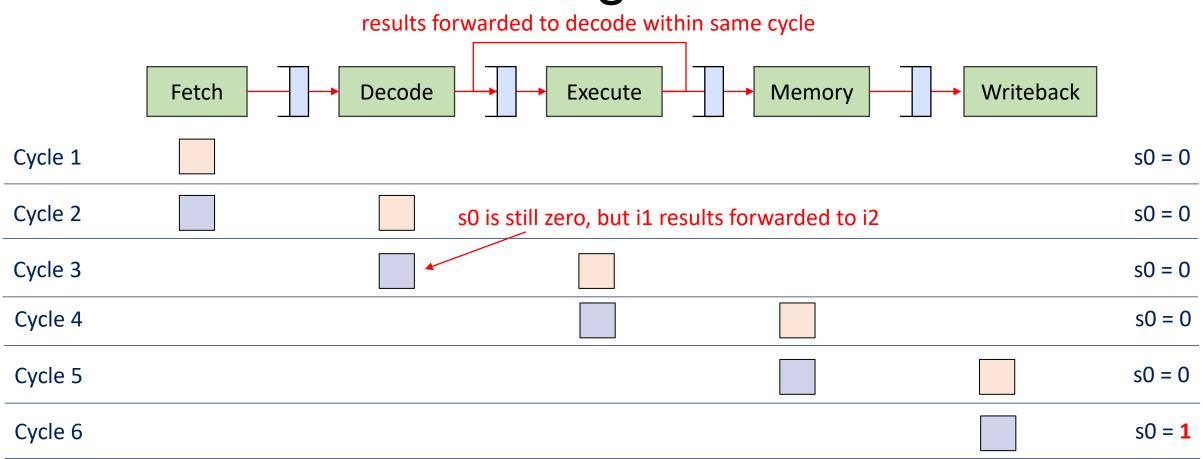
May still require stalls for a deeper pipeline microarchitecture
 If execute took many cycles?

- □ Adds combinational path from execute to decode
 - But does not imbalance pipeline very much!



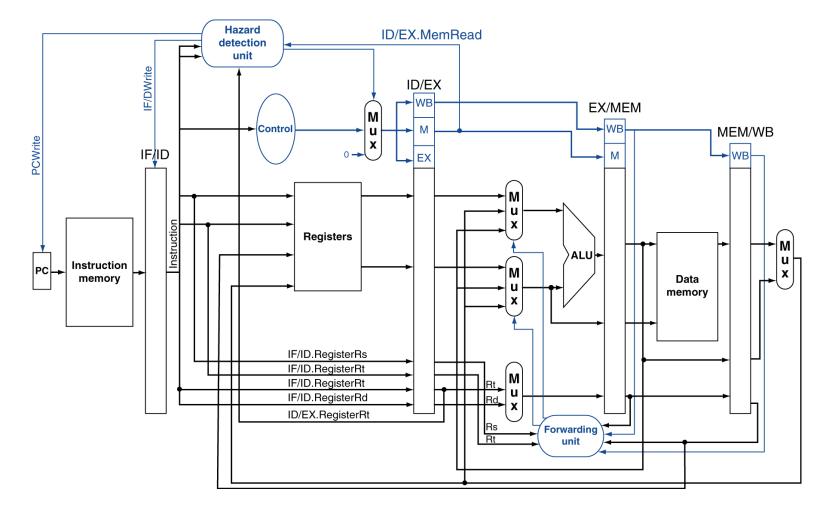
Solution #2:Forwarding

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!

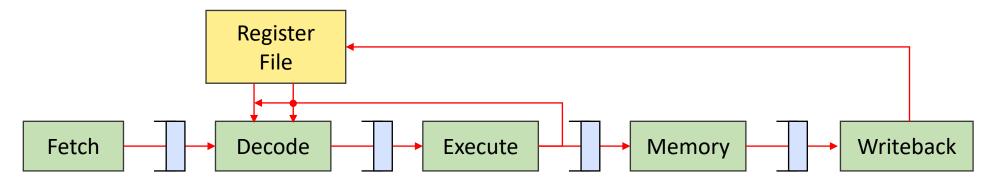
Datapath with Hazard Detection



Not very intuitive... We will revisit with code later

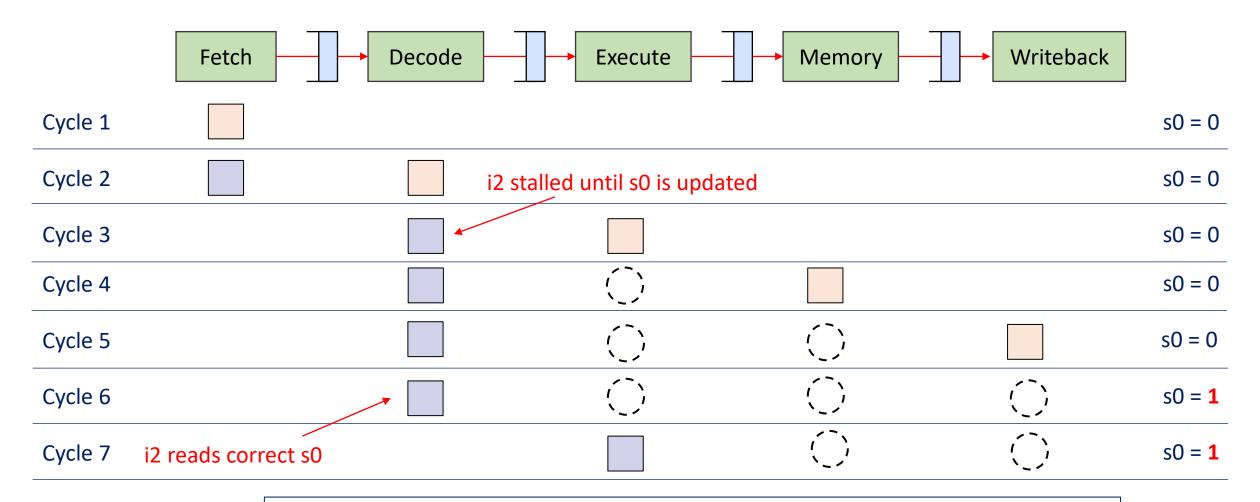
Hazard #2: Load-Use Data Hazard

- 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

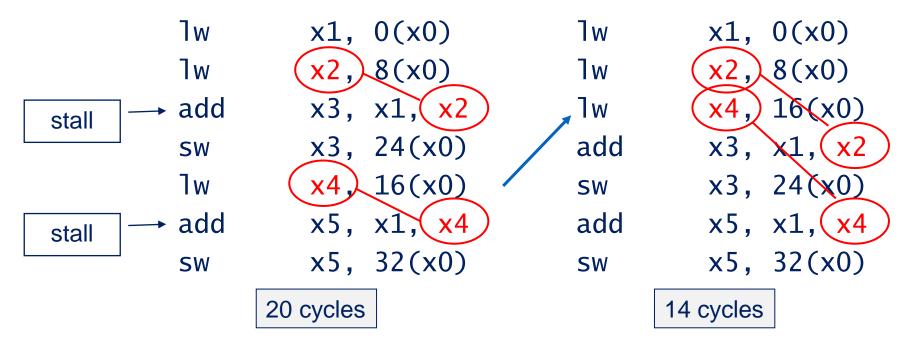


Forwarding is not useful because the answer (s0 = 1) exists outside the chip (memory)

A non-architectural solution: Code scheduling by compiler

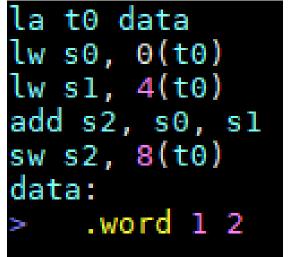
Reorder code to avoid use of load result in the next instruction

• 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

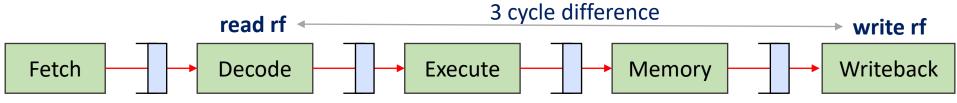
- $\circ~$ Pseudo-instruction expanded to one or more instructions by assembler
- o e.g., auipc x5,0x1
 addi x5,x5,-4 # ← RAW hazard!

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

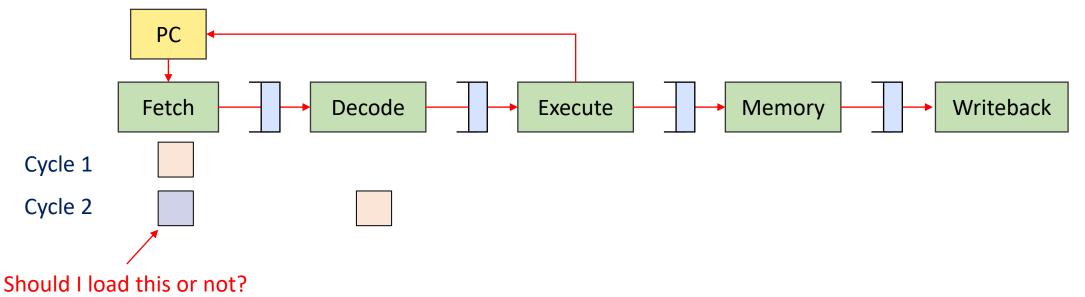
- Obviously dangerous! -- Writeback stage comes after decode stage
- (Later instructions' reads *can* happen before earlier instructions' write)
- Write-After-Write (WAW) Hazard
 - $\circ~$ No hazard for in-order processors
- □ Write-After-Read (WAR) Hazard
 - No hazard for in-order processors -- Writeback 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

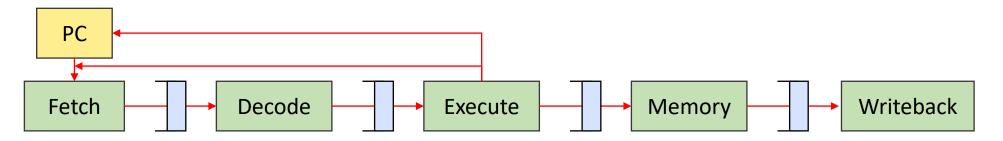
i1: beq s0, zero, elsewhere i2: addi s1, s0, 1



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)

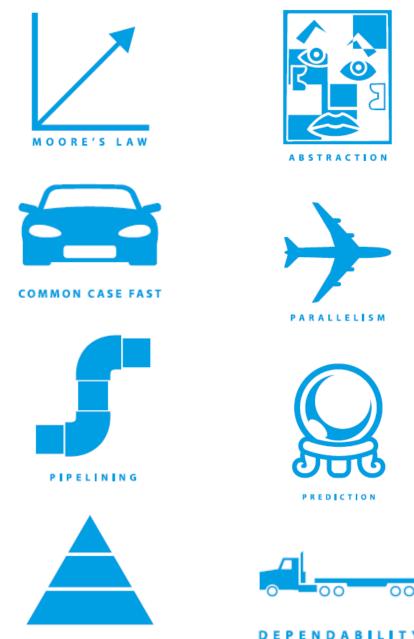
Aside: An awkward solution: Branch delay slot

- 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

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



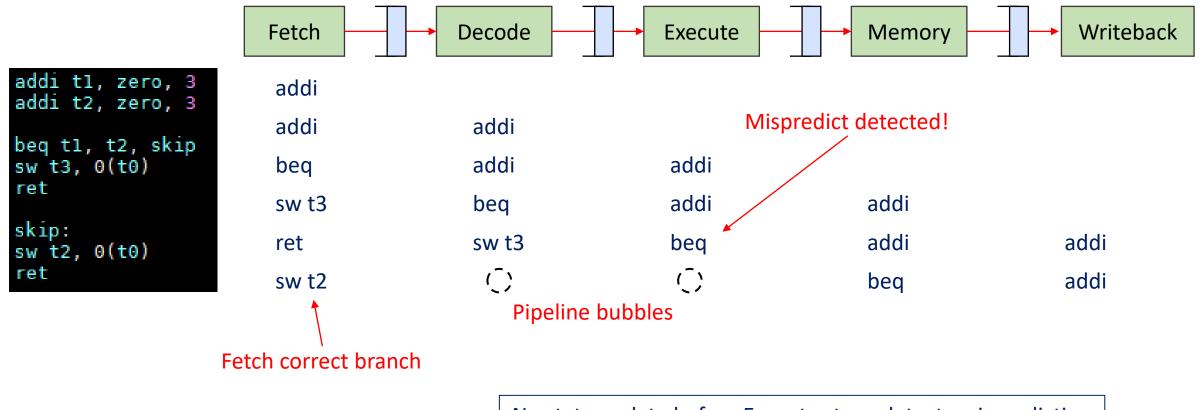
Cycle 1 Fetch PC = 0

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

Control hazard (partial) solution Branch prediction

- □ We will try to predict whether branch is taken or not
 - 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



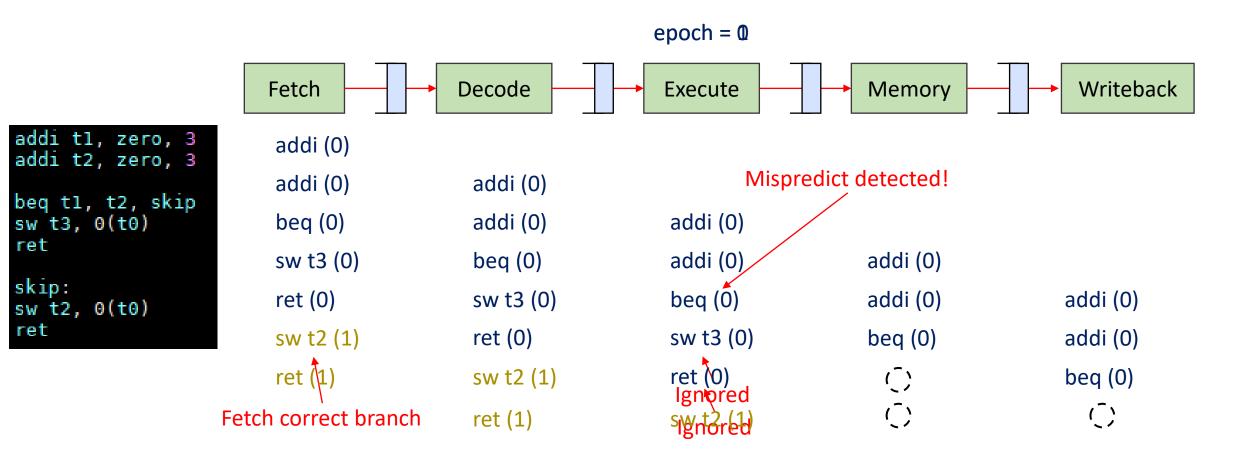
No state update before Execute stage detects misprediction (Fetch and Decode stages don't write to register)

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

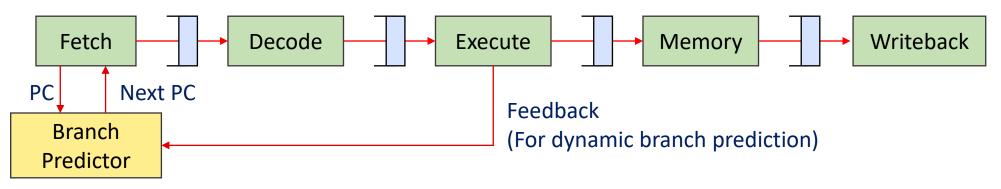
- Based on typical branch behavior
- Example: loop and if-statement branches
 - Predict backward branches taken
 - Predict forward branches not taken

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



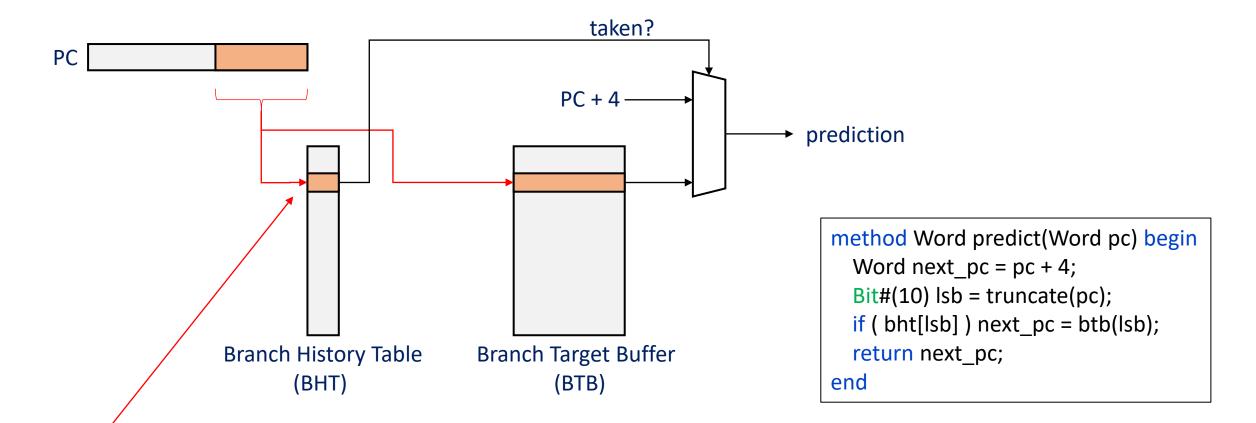
- Branch predictor predicts what should be the next PC
 - \circ $\,$ Typically based on the current PC as input $\,$
- Dynamic branch predictors adapt to program using feedback
- If prediction is correct, great! If not, make sure mispredicted instructions don't effect state
 - We looked at the epoch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

Dynamic branch prediction

□ Two questions about a PC address being fetched

- Will this instruction cause a branch?
- $\circ~$ 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 just 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... 😕

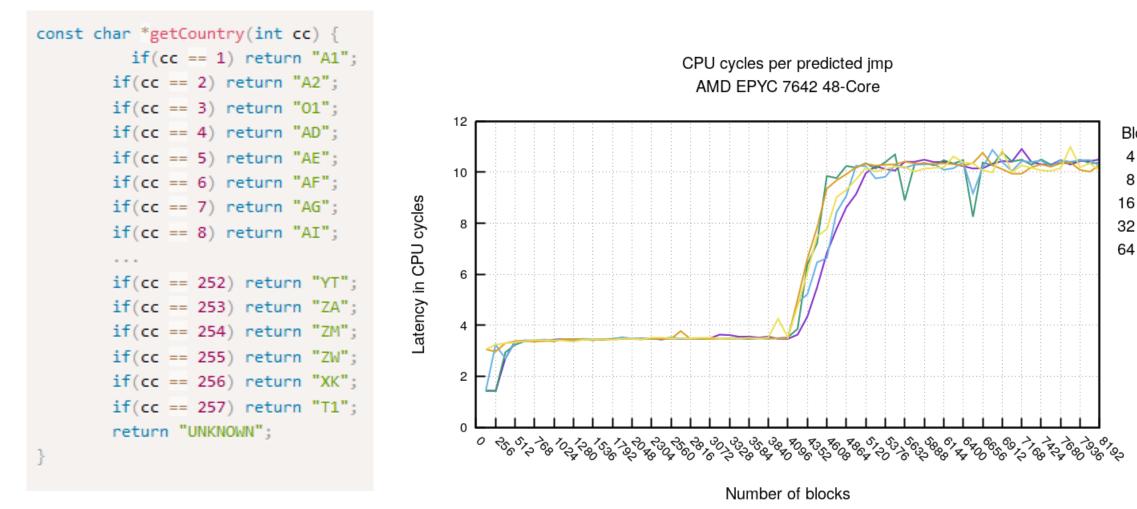
Back to the three questions

- □ 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

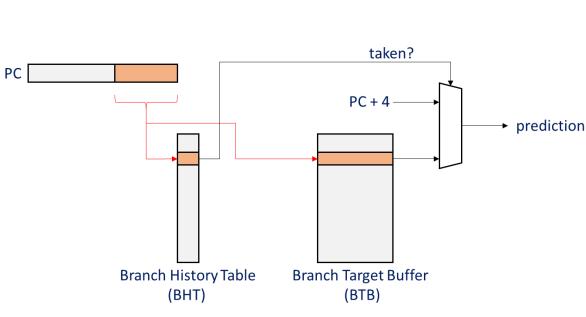
Block size



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

Simple example: 1-bit predictor

- BHT has one-bit entries
 - Most recently taken/not taken
 - o ("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)

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."