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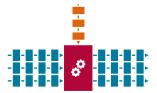
Parallel Programming and Heterogeneous Computing

Shared-Memory Hardware

Max Plauth, Sven Köhler, Felix Eberhardt, <u>Lukas Wenzel</u> and Andreas Polze Operating Systems and Middleware Group

Recap: Types of Parallelism





Data Level Parallelism

The same operation is applied in parallel to multiple units of data.

Task Level Parallelism

Multiple operations are executed in parallel.

- Instruction Level Parallelism (ILP)
 - ... between operations in a task
- Thread Level Parallelism (TLP)
 - ... between multiple tasks within a workload
- Request Level Parallelism
 - ... between multiple workloads

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- ILP arises naturally within a workload
 - Programmers think in terms of a single instruction sequence
- TLP is explicitly encoded within a workload
 - Programmers designate parallel operations using multiple tasks



Why consider ILP in a parallel programming lecture? *Knowledge of common ILP mechanisms and assumptions enables performance optimization on single-thread granularity!* ParProg 2020 B3 Shared-Memory Hardware

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Chart 3

Pipelining

- Instruction execution phases (e.g. Instruction Fetch, Decode, Execute, Memory Access, Writeback) employ distinct hardware units
 - Without pipelining only one unit would operate each clock cycle
- Pipelining increases throughput by utilizing all units in every cycle
- Latency per instruction remains the same





Hardware Lukas Wenzel

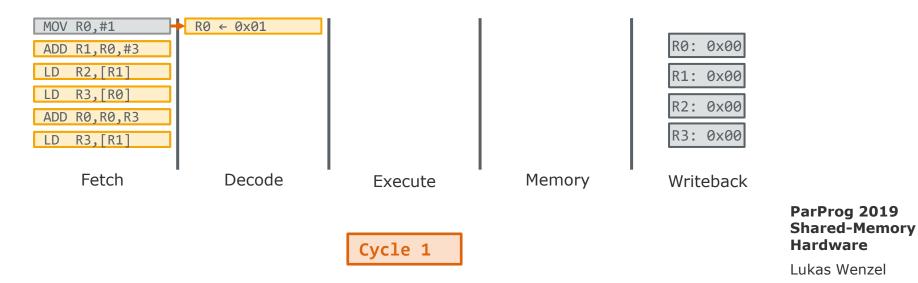
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Approaching 100% Utilization Chart 4



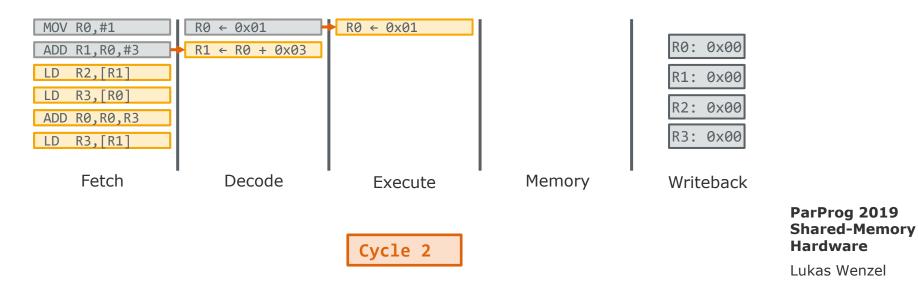


Pipelining Example (Data Hazards)

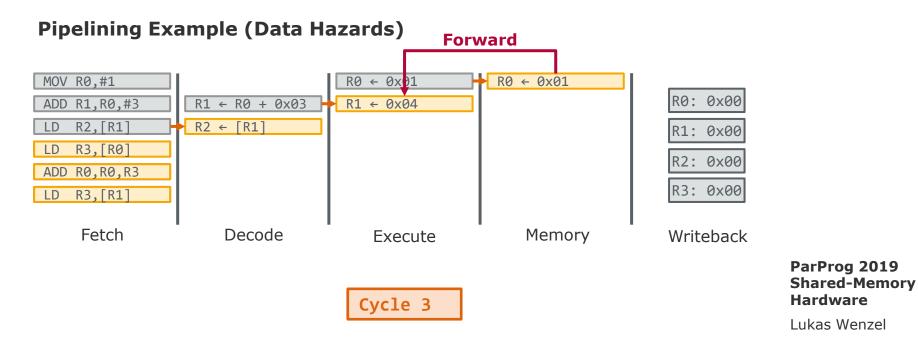




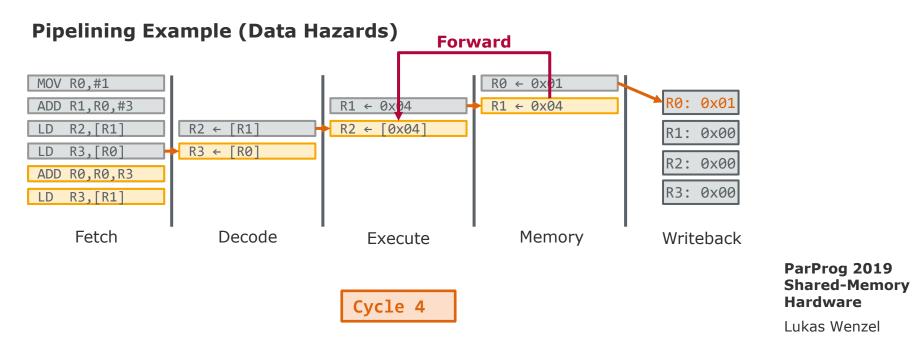
Pipelining Example (Data Hazards)











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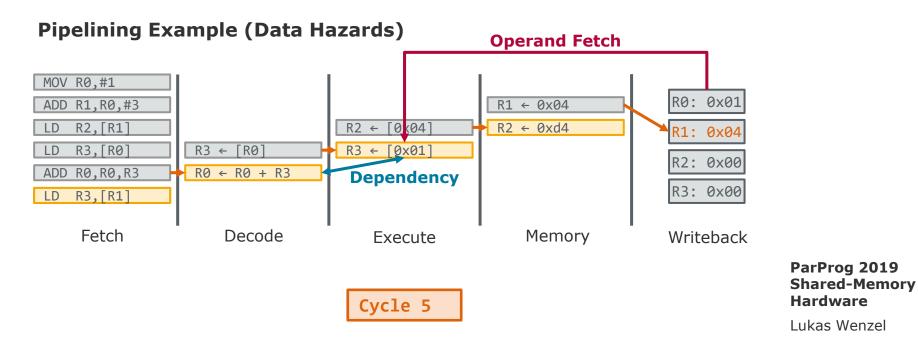
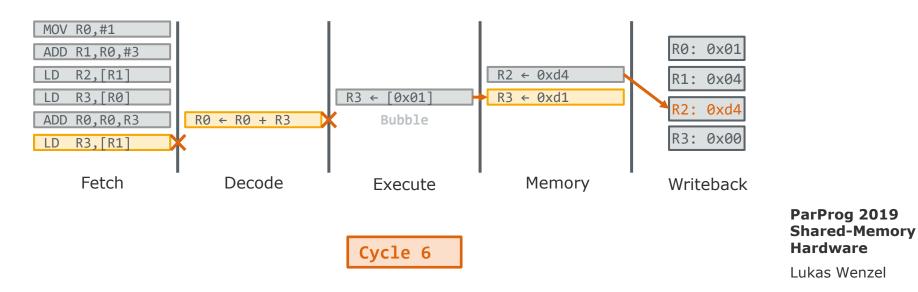


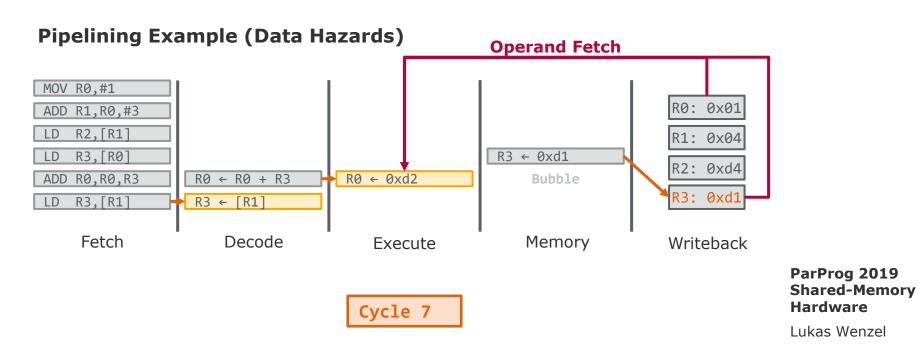
Chart **5.5**



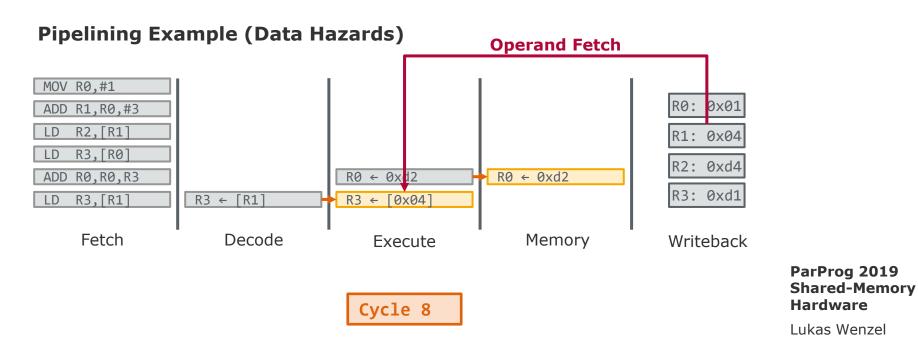
Pipelining Example (Data Hazards)





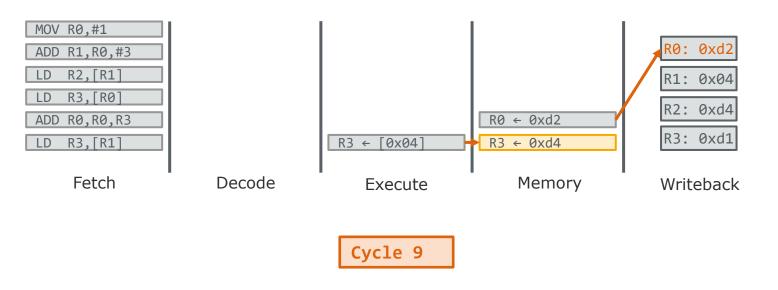








Pipelining Example (Data Hazards)

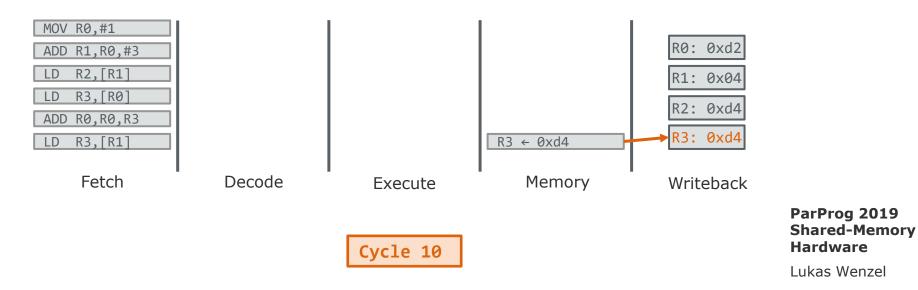


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Pipelining Example (Data Hazards)





Pipelining Example (Control Hazard)

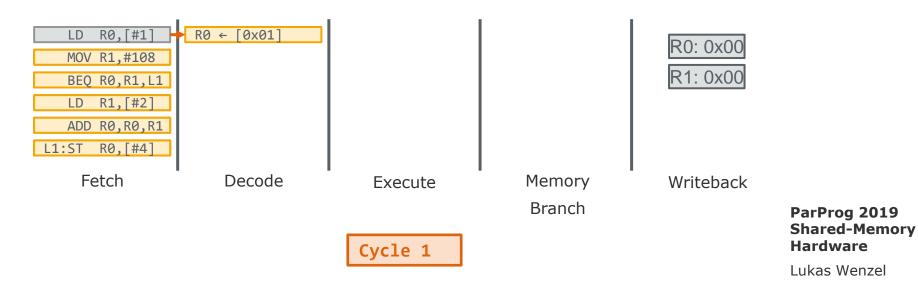
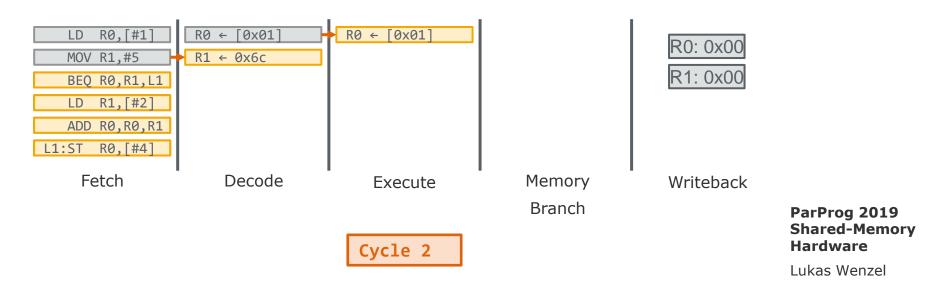
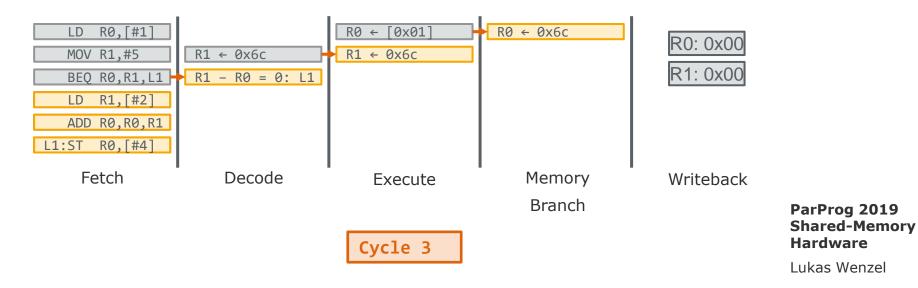


Chart 6.1

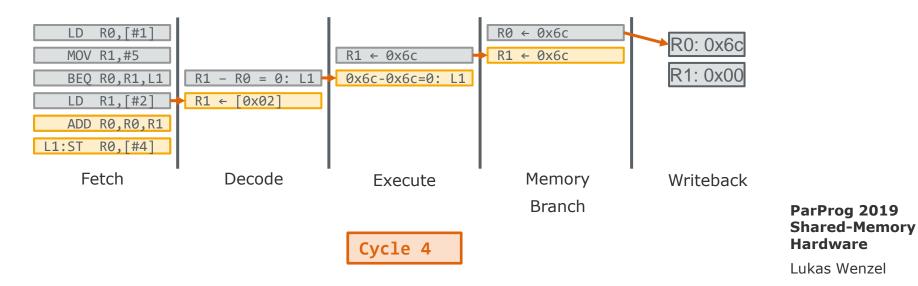






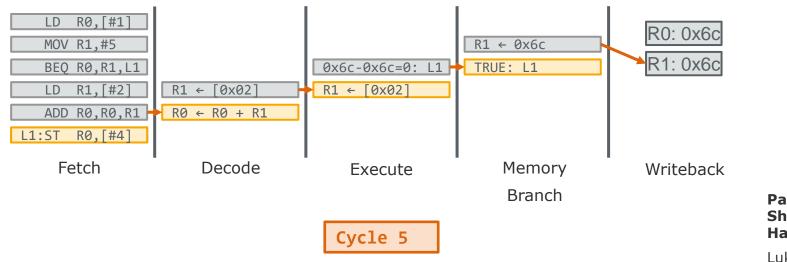








Pipelining Example (Control Hazard)

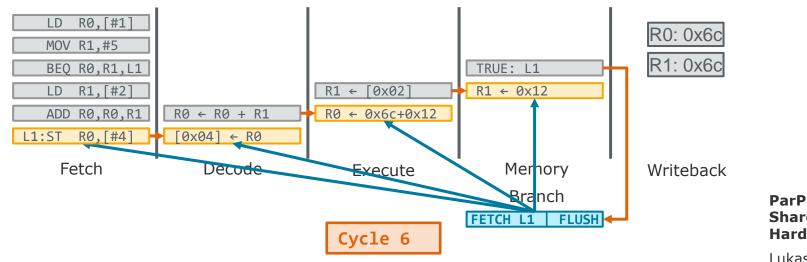


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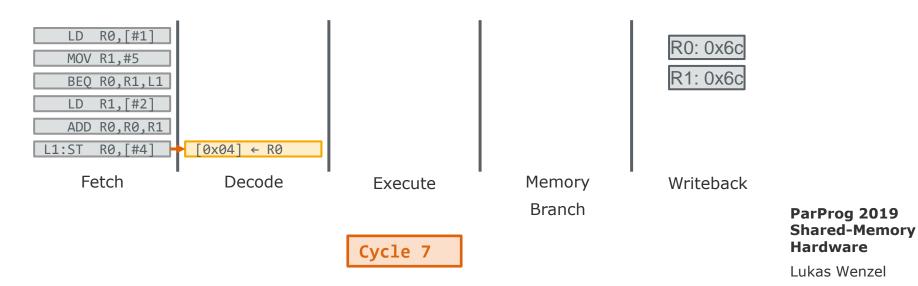


Pipelining Example (Control Hazard)

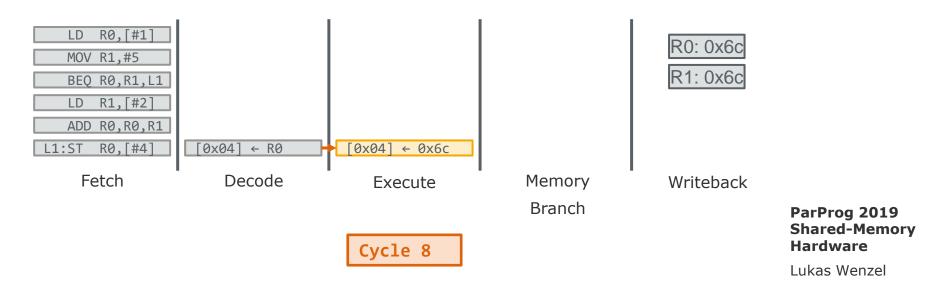


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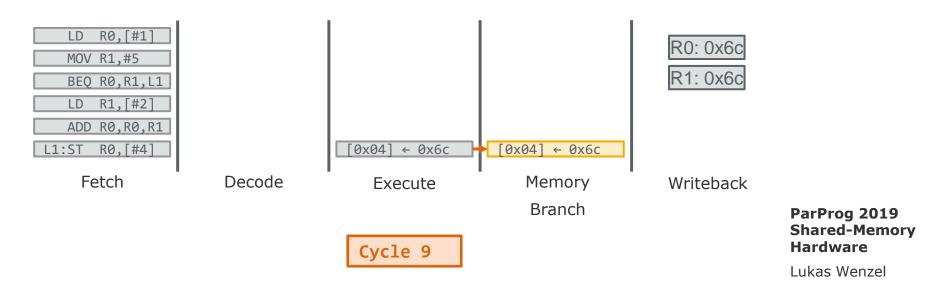




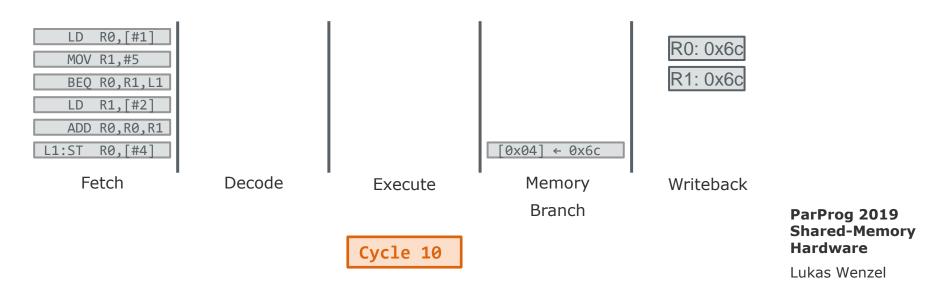












Pipelining Problems

- <u>Data Hazard</u>: Instruction requires operand that is not yet written back, Solutions:
 - Forwarding: Shortcut writeback path and transfer operands directly from intermediate stage
 - Generate Bubbles : Insert NOPs and halt preceeding stages until operand is available
- <u>Control Hazard</u>: Conditional branches may divert instruction stream, subsequent Fetches depend on branch completion, Solutions:
 - Generate Bubbles: Fetch stage halts after issuing a branch inserting NOPs, continues after branch target is computed
 - Branch Prediction: Fetch stage predicts branch target and continues issuing instructions, on misprediction all intermediate instructions are flushed

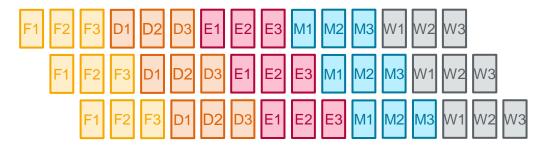
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Superpipelining

- Finer subdivision of stages (~ 20-30) decreases combinatorial path depth to achieve higher clock frequencies
 - Approach taken with Intel NetBurst microarchitecture, introduced 2000 and abandoned in 2008 due to Power Wall
 - Control Hazards can degrade performance towards that of a coarser pipeline (relies on accurate Branch Predictor)



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Superscalar Architecture

- Scalar pipelines can not exceed 1 IPC (instruction per cycle)
- Duplicate execution units to handle more than one independent instruction per cycle

Instructions are issued if no previous instruction is blocked and dependencies are met (operands and execution unit available)

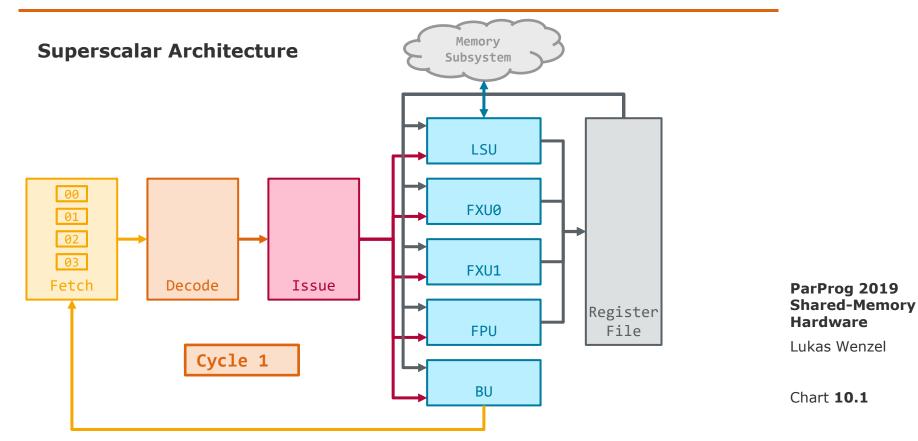
- <u>Frontend</u>: Instruction Fetch and Decode
 - Can be duplicated to supply multiple decoded instructions per cycle, as all instructions are independent at that stage
- Issue Queue: Schedules decoded instructions for execution
- <u>Backend</u>: Registers and various execution units (EU)
 - Fixed-Point units (FXU), Load-Store units (LSU), Floating-Point Units (FPU), Branch Units (BU)

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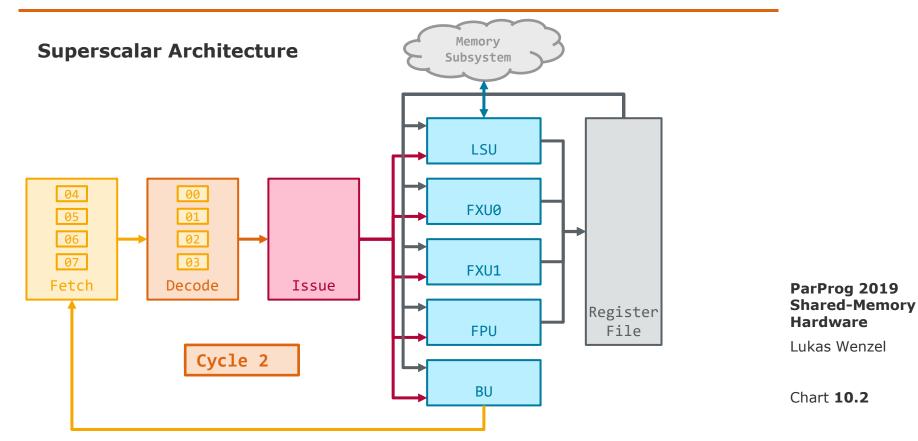
Chart **9**

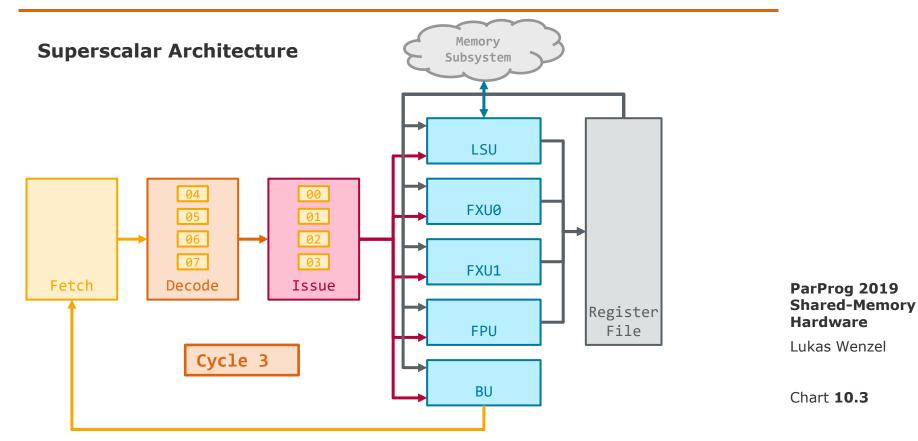


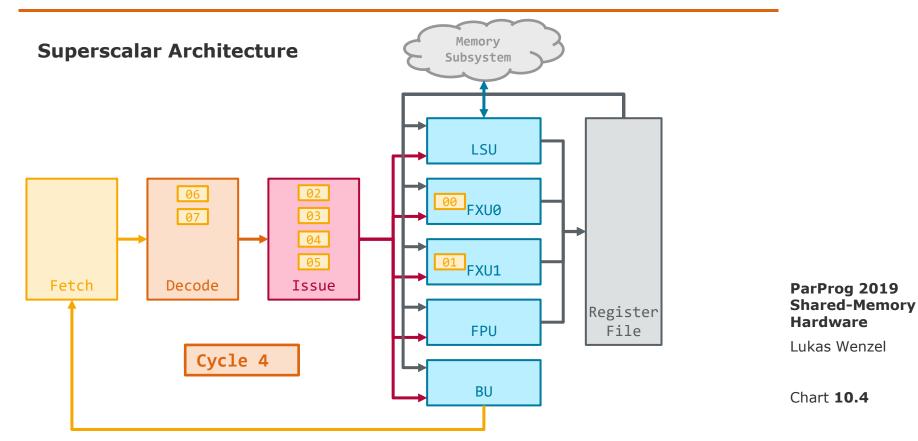
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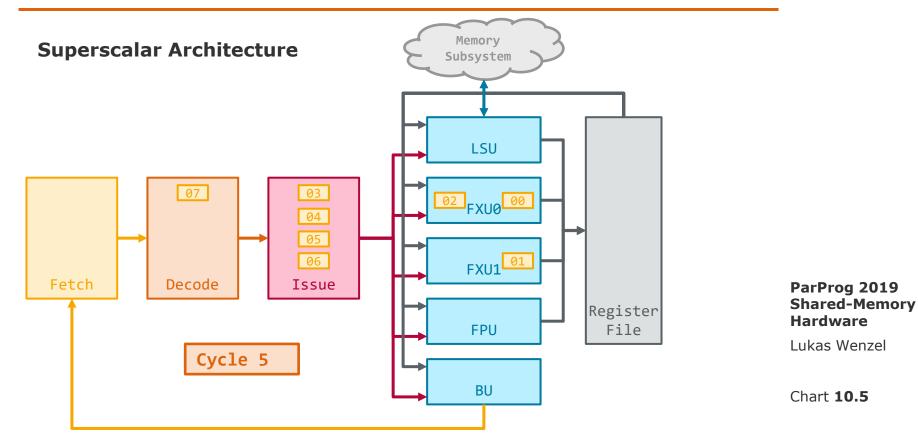
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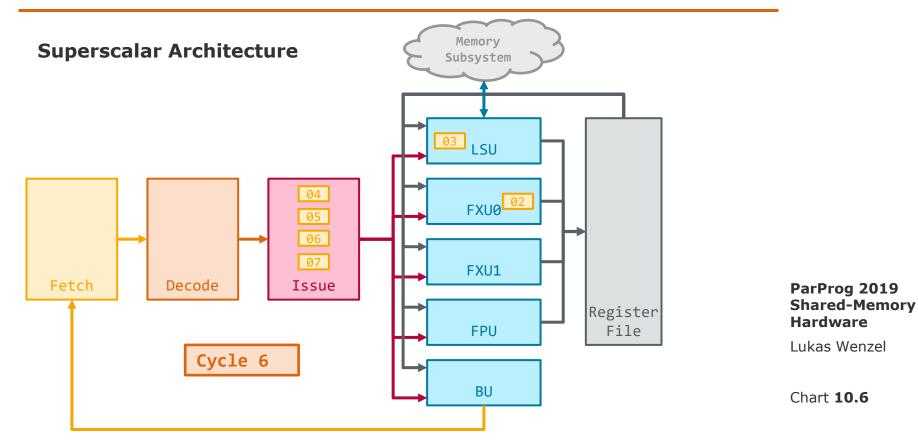
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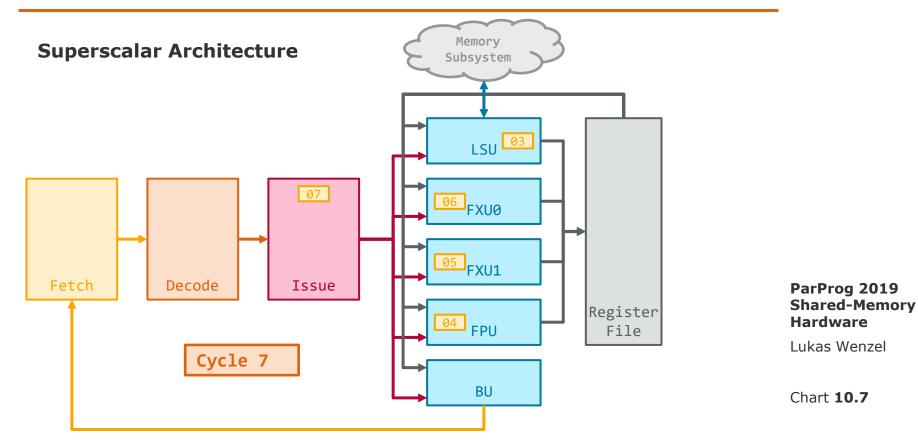


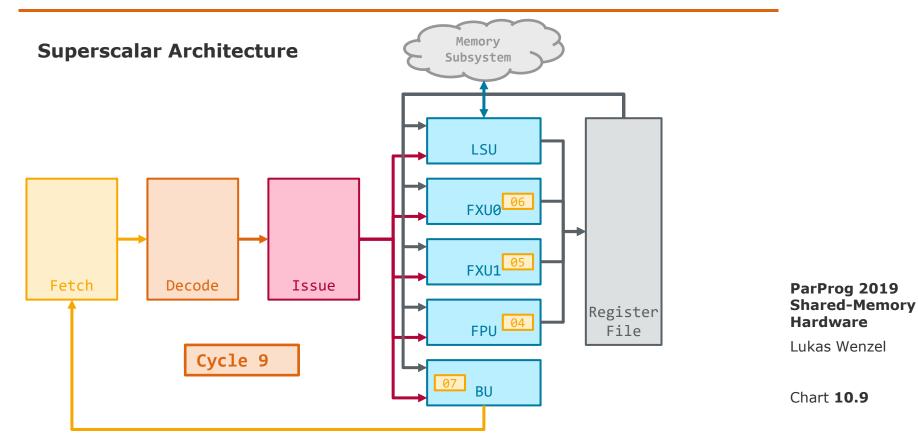


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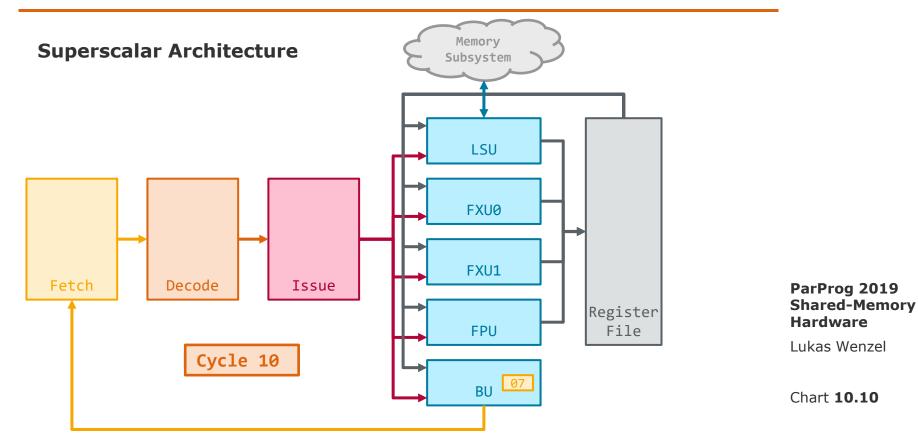




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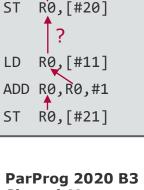
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Superscalar Architecture

- Frontend and execution units in backend are usually pipelined
- In-Order Execution: Issue queue must keep order of instruction stream:
 - Even independent subsequent instructions can not complete before a П delayed previous instruction (e.g. Load with cache miss)
 - Entire Backend is stalled for a single stalled execution unit
- False Dependencies: Write-after-Read conflicts on registers
 - Instruction might wait for destination register to become free, even though both operands and execution unit are available already



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R0,[#10]

ADD R0, R0, #1

LD

ST



Execution must *appear* sequential,

Instructions can be executed out of program order if:

- Dependency tracking in issue queue ensures that instruction is only executed once operands are available
- Architecturally visible effects of instruction are held back until previous instructions have applied their effects (commit)
- Add Reorder Buffer (ROB) to track computed but not yet committed results

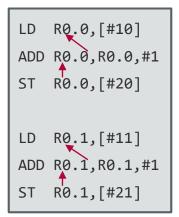
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Superscalar Optimization: Register Renaming

- Architectural Registers are likely to be reused within the execution window, creating false dependencies
 - Add more physical registers to accommodate conflicting usage
- Issue Queue maps architectural register numbers to a pool of physical registers



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Superscalar Optimization: Speculative Execution

- Analogous to scalar pipelines:
 - Branch instructions could act as barriers to Issue Queue
 - Efficient alternative: Branch Prediction continues instruction stream speculatively, on misprediction speculative instructions are nullified
- Out of order architecture can accommodate speculative execution:
 - Speculative instructions appear in Reorder Buffer after the branch instruction they depend on
 - Once branch commits, dependent instructions can be identified and if necessary discarded from Reorder Buffer
- Current Branch Predictors can achieve >95% accuracy!
- Problem: Not all instruction effects are nullified
 - Non-architectural state (e.g. in caches) sometimes can not be and usually is not rolled back, opening the way to side-channel attacks

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Even though programmers think in terms of sequential instruction streams, awareness of instruction level parallelism opens optimization potential.

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Very-Long-Instruction-Word (VLIW) /

Explicitly-Parallel-Instruction-Computer (EPIC)

- Alternative to dynamic instruction scheduling in superscalar architectures
 - Requires programmer or compiler to explicitly designate parallelizable instructions (static schedule)
 - Greatly simplifies hardware implementation
 - Burden on Compilers to statically determine instruction dependencies and optimal execution schedules
- Static analysis can not capture runtime effects like cache behaviour
 - One static execution schedule may not be optimal in all runtime situations
- Prominent example IA-64 architecture from 2001, not widely adopted
- Also some embedded architectures, DSPs, older GPUs



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Chart **16**





- ILP in a single instruction stream is limited due to dependencies
- Larger execution windows quickly become infeasible due to prohibitively complex dependency checking logic between executing instructions
- ILP exploitation techniques have reached stage of diminishing returns for general workloads

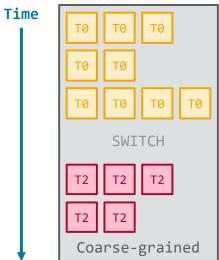
Executing multiple independent instruction streams offers new potential for parallelization!

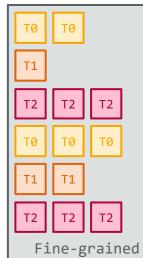
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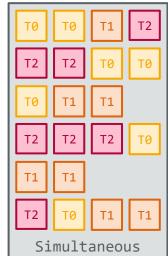


Single-Core Multithreading

- Threads are the smallest units of parallelism under programmers' explicit control
- There are different execution schemes for multiple threads on a single core:







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Chart 18





Simultaneous Multithreading (SMT)

- Superscalar Out of Order cores already have much of the logic required for SMT (i.e. dependency tracking, register renaming)
- SMT Support: Duplicate architectural state per hardware thread and tag instructions with thread number
- Issue Queue gains additional dependency domains
- Higher utilization of execution units

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SMT never increases but might decrease singlethread performance, if execution units are congested by other threads.

SMT never decreases but can increase core utilization and thus overall throughput.

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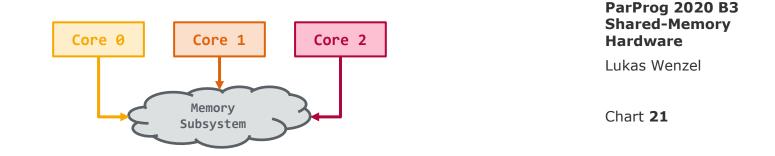
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Chart **20**



Multicore Machines

- Workloads with high degree of TLP can cause contention of the execution units available in a single core
- Distribute workload on multiple cores!
- Cores are self contained (do not share execution units or frontend logic)
- Cores share access to a memory subsystem





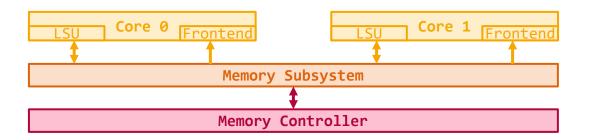
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And now for a break and a cup of Darjeeling.

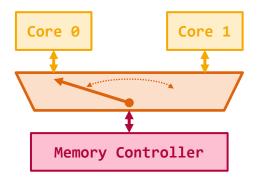
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- Cores initiate two types of memory operations:
 - Instruction Fetches through the Frontend
 - Data Loads/Stores through the Load-Store Units
- Multiple Cores are serviced by a shared memory subsystem, which performs main memory accesses via a memory controller



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- 1st Simplification: Model memory subsystem as a multiplexer
 - One core at a time has exclusive access to memory controller
- 2nd Simplification: Disregard Instruction Fetches
 - Fetches are not explicitly initiated by instructions
 - > Not covered by the consistency model



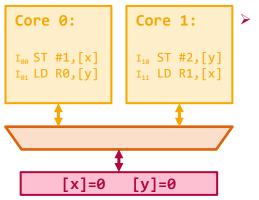
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What happens, if multiple (in-order) cores concurrently access memory?

- Sequential Consistency
 - Multiplexer might switch at arbitrary times
 - The global instruction order <_M arises from interleaving the local instruction orders <_{C0} and <_{C1}



Only guarantee: If two instructions are issued in a particular order by the core, they can not be reversed in the global memory order

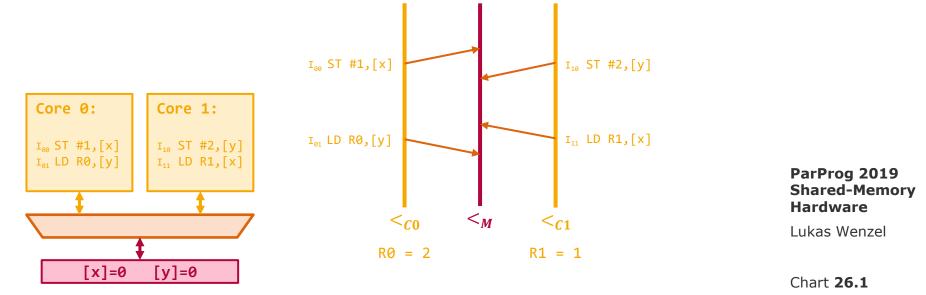
 $I_a <_{Cx} I_b \Rightarrow I_a <_{M} I_b$

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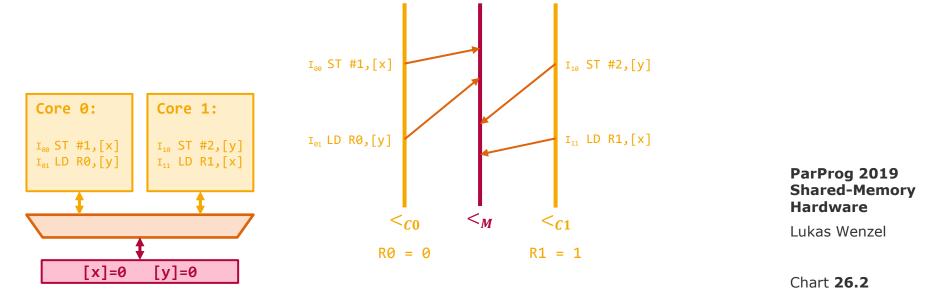


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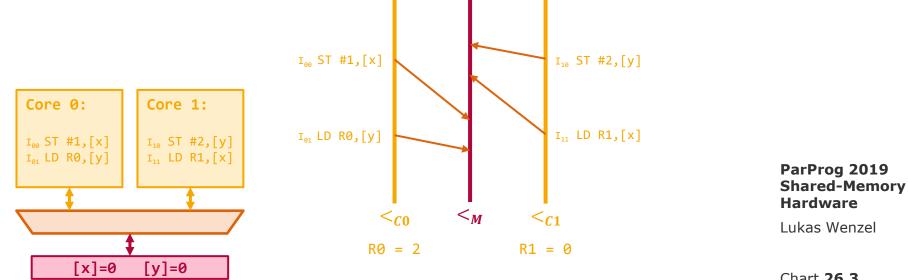


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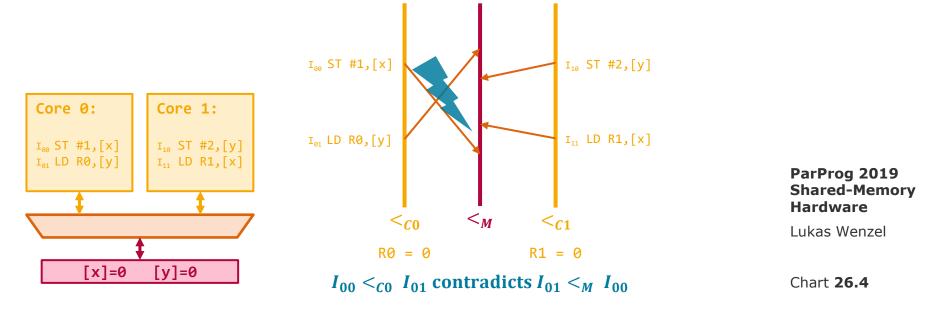


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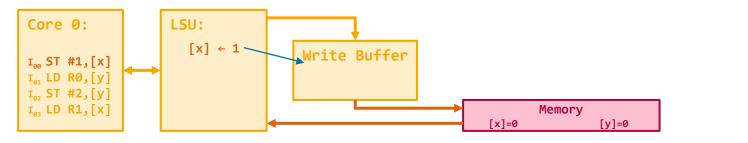
What happens, if multiple (in-order) cores concurrently access memory?





Excursion: Write Buffers

- Load instructions must wait for results from memory
- Store instructions produce no results for subsequent instructions
 - > LSU does not need to wait for an issued **Store** instruction to complete
- This optimization is implemented using <u>Write Buffers</u>, i.e. FIFO memories storing address and data of pending **Store** operations
- To maintain in-order illusion, subsequent Loads to addresses present in Write Buffer must return most recent buffered data (<u>Bypass</u>)

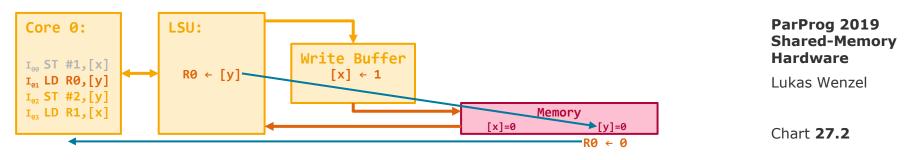


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Excursion: Write Buffers

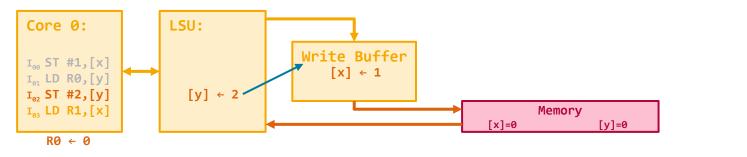
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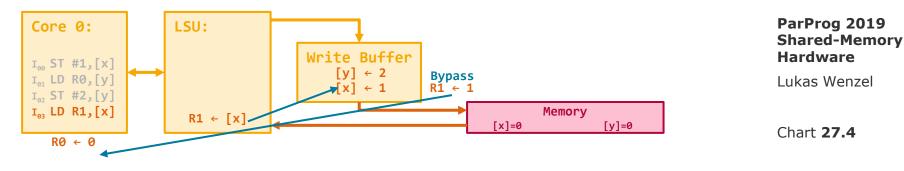
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Chart 27.3



Excursion: Write Buffers

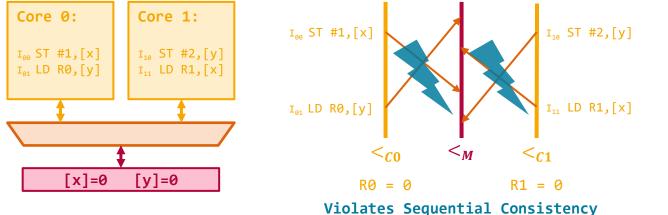
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What happens, if multiple (in-order) cores with <u>write buffers</u> concurrently access memory?

- Total Store Order
- Stores I₀₀ and I₁₀ wait in write buffer, while Loads I₀₁ and I₁₁ can proceed
- Store-Load-Reordering violates Sequential consistency
- > Define new consistency model to accommodate write buffers



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Chart **28**

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Total Store Order

- Abbreviation: $I_x \stackrel{M}{\leftarrow} I_y$ means that consistency model *M* guarantees: $I_x <_C I_y \Rightarrow I_x <_M I_y$
 - Formal description of TSO considers Load and Store instructions separately:
 - $\square \quad \text{Maintain Load-Load order: } L_a \stackrel{TSO}{\leftarrow} L_b$
 - Maintain Load-Store order: $L_a \stackrel{TSO}{\leftarrow} S_b$
 - Maintain Store-Store order: $S_a \stackrel{TSO}{\leftarrow} S_b$
 - No clause requiring Store-Load order

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Total Store Order

- If required, Store-Load reordering can be explicitly forbidden by interposing a Fence instruction
 - Fence effectively flushes the write buffer before performing any more Load instructions
- Additional clauses to formalize Fence (transitively ensures order between preceding and subsequent instructions):

$$L_{a} \stackrel{TSO}{\longleftarrow} F ; S_{a} \stackrel{TSO}{\longleftarrow} F$$

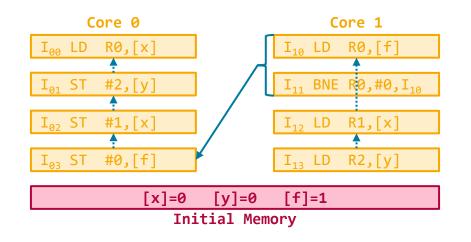
$$F \stackrel{TSO}{\longleftarrow} F$$

$$F \stackrel{TSO}{\longleftarrow} L_{a} ; F \stackrel{TSO}{\longleftarrow} S_{a}$$

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Total Store Order

- Widely implemented in architectures like SPARC and x86
- Missing Store-Load order is not problematic for most programming idioms:
 - Example: Guard access to variables using a flag





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Chart 31

Atomic Operations

- To make flag from previous example a proper lock, the acquire operation must atomically check and set it (i.e. using Test and Set instruction, TAS)
- New instruction type: Read-Modify-Write (RMW)
 - Combination of a Load and subsequent Store to the same address
 - No other accesses to that address may happen in between
- For consistency model, RMW acts as <u>both</u> Load and Store
 - SC and TSO maintain order between RMW and any other instruction type
- Possible RMW implementation: Flush write buffer, then lock the memory multiplexer not to switch between the Load and Store part of the instruction



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Weak Consistency

- TSO Fence demonstrates explicit request of ordering guarantees by programmer
- Many orderings are not required but enforced by strong consistency models like SC and TSO
- To release optimization potential, define consistency model that gives only explicitly requested ordering guarantees
 - Fences indicate required order
- Only guarantee without Fence is ordering between operations on the same address

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Weak Consistency

- Formalization:
 - Maintain order of operations on the same address:

$$L_a \stackrel{WC}{\leftarrow} L_a$$
; $L_a \stackrel{WC}{\leftarrow} S_a$; $S_a \stackrel{WC}{\leftarrow} L_a$; $S_a \stackrel{WC}{\leftarrow} S_a$

Force order between operations on different addresses with Fence:

$$L_a \stackrel{WC}{\leftarrow} F \quad ; \quad S_a \stackrel{WC}{\leftarrow} F$$
$$F \stackrel{WC}{\leftarrow} F$$
$$F \stackrel{WC}{\leftarrow} L_b \quad ; \quad F \stackrel{WC}{\leftarrow} S_b$$

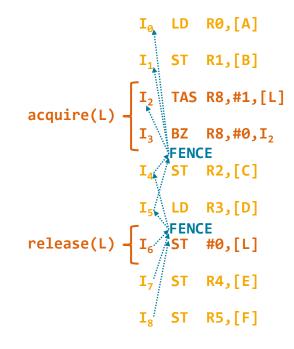
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Weak Consistency

- Critical section example:
 - $\hfill\square$ Section consists of ${\bf I}_4$ and ${\bf I}_5$
 - Guarded by lock L



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Release Consistency

- Minimum requirement for correct critical section implementation:
 - Instructions in CS execute after acquire()
 - Instructions in CS execute before release()
- Full Fences for acquire() and release() also ensure:
 - Instructions before CS execute before acquire()
 - Instructions after CS execute after release()
 - Unnecessary guarantees sacrifice optimization potential!
- > Instead use half Fences, that order in one, not both directions:
 - Acquire orders itself before subsequent instructions: $A \stackrel{RC}{\leftarrow} L_a$; $A \stackrel{RC}{\leftarrow} S_a$
 - **Release** orders preceding instructions before itself: $L_a \stackrel{RC}{\leftarrow} R$; $S_a \stackrel{RC}{\leftarrow} R$
 - □ Maintain order among Acquire and Release: $A \stackrel{RC}{\leftarrow} A$; $A \stackrel{RC}{\leftarrow} R$; $R \stackrel{RC}{\leftarrow} A$; $R \stackrel{RC}{\leftarrow} R$

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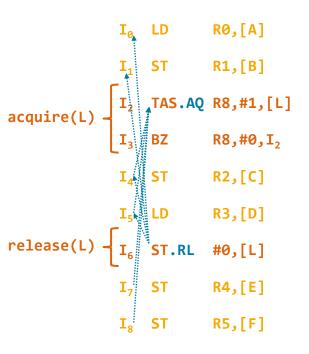


Chart **36**

Release Consistency

- Acquire and Release semantics can be attached to:
 - Regular Fence instructions
 - Load, Store and RMW instructions
- Allows acquire(L) and release(L) to have no ordering effect on instructions outside critical section

Or do they?

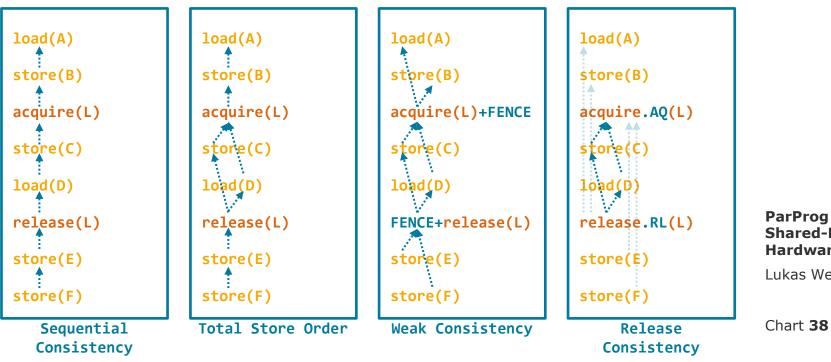




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Overview



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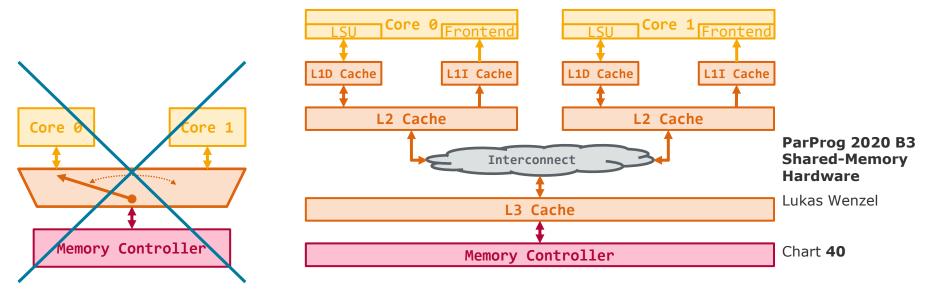


And now for a break and another cup of Darjeeling.

Shared-Memory Hardware Coherent Cache Hierarchy



- Current conception of memory subsystem is inaccurate:
 - Not a multiplexer granting exclusive access to memory controller
 - Instead: Hierarchy of caches striving to reduce memory operations reaching levels closer to memory controller



Caches

- Store copies of recently used main memory regions (<u>cache lines</u>)
 - If present (<u>cache hit</u>) core can operate on cached copy instead of main memory
- Caches are orders of magnitude smaller that main memory
 - Faster implementation: Lower access latency and higher throughput
- Resulting performance approaches that of the cache for a high hit ratio $Latency_{avg} = Latency_{Cache} \cdot HitRatio + Latency_{MainMem} \cdot (1 - HitRatio)$
 - Illusion of memory with cache speed and main memory size
- Requires high hit ratio
 - Based on temporal and spatial locality

Cache lines are the basic unit of the memory subsystem!

Any access (even single byte) will fetch an entire line (64-128 byte) into the cache.

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Chart 41

Prefetching

Technique to improve the cache hit ratio:

Hardware predicts or software indicates cache lines that will be accessed in the near future and fetches them proactively.

- Software: Explicit prefetch instructions like PREFETCHxx (x86) or DCBT (Data Cache Block Touch, Power)
- Tradeoff: Aggressive, erroneous or premature prefetching may defeat its purpose by evicting still used cache lines or wasting memory bandwidth.
 - Coverage: Ratio of accessed locations that were successfully prefetched
 - Accuracy: Ratio between prefetched locations that were and were not accessed

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Chart 43

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Shared-Memory Hardware Coherent Cache Hierarchy

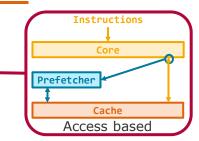
Prefetching

 <u>Access based Prefetchers</u> observe all memory accesses or only cache misses

Each access/miss might trigger a prefetch

Prefetched address is predicted using information associated with access/miss (address, program counter, history of addresses or offsets)

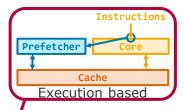
- <u>Temporal Correlation</u>: Record sequence of accessed addresses
- <u>Spatial Correlation</u>: Record data layout of accessed structures (relative offsets)
 - <u>Stride Prefetcher</u>: Recognizes layouts with fixed relative offsets
- <u>Execution based Prefetchers</u> analyze instruction stream directly to predict locations it might access



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Caches

- Distort global visibility of memory operations by cores!
 - Delayed propagation of **Stores** to main memory
 - Stale results from Loads by missing updates to main memory
- Order is restored by establishing the <u>Single-Writer-Multiple-Reader</u> (SWMR) invariant between caches:
 - A cache can only service a Store operation on a cache line if no other cache can service Loads or Stores from the same cache line
 - Multiple caches can service Loads on their local cache line copies as long as no Stores to the same cache line occur
- Caches obeying the SWMR invariant are called <u>coherent</u>
 - Mechanisms to maintain the SWMR invariant are <u>coherence protocols</u>

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Chart 44



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MSI Coherence Protocol

- MSI is a simple coherence protocol, based on a state machine
- Seen from a particular cache, each cache line is in one of three states:
 - <u>I</u>nvalid: The cache line is not present in the cache, this cache may service neither Load nor Store operations
 - <u>Shared</u>: The cache line is present in this and probably other caches, this cache may service Load operations
 - <u>M</u>odified: The cache line is only present in this cache, this cache may service Load and Store operations

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MSI Coherence Protocol

- Transitions may occur for two reasons:
 - 1) Required for servicing **Loads** or **Stores** from core
 - 2) Reacting to observed behavior of other caches (Snooping)

Examples:

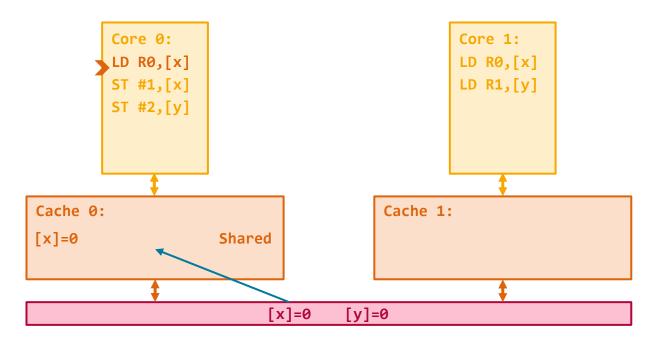
- 1) If the cache needs to service a Write operation on a Shared line, it must broadcast an invalidation message to all caches to ensure it holds the only copy before marking its line Modified.
- 2) If a cache holds a Modified line, it must snoop accesses to this line by other caches, if necessary write back its updates to memory and transition to Invalid state.

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MSI Coherence Protocol

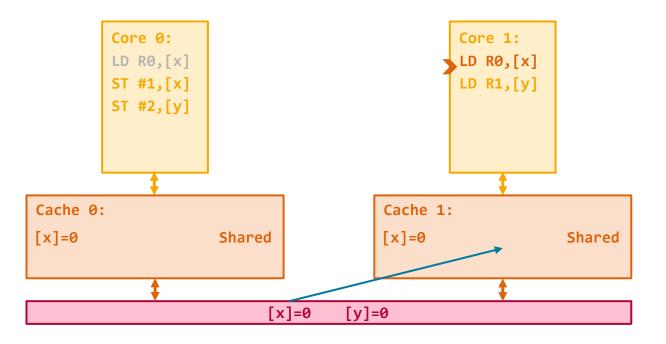




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MSI Coherence Protocol

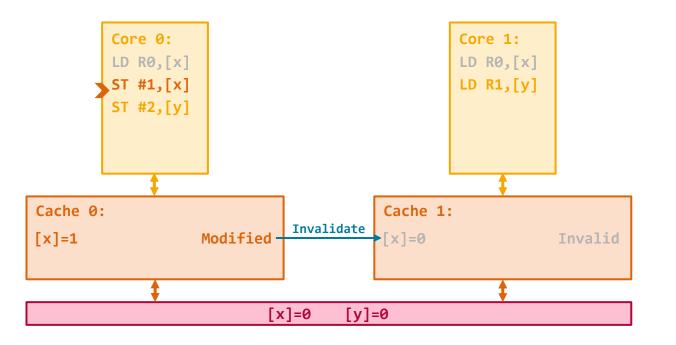


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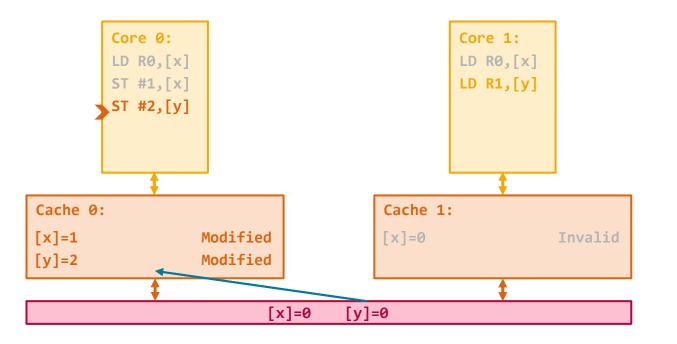
MSI Coherence Protocol



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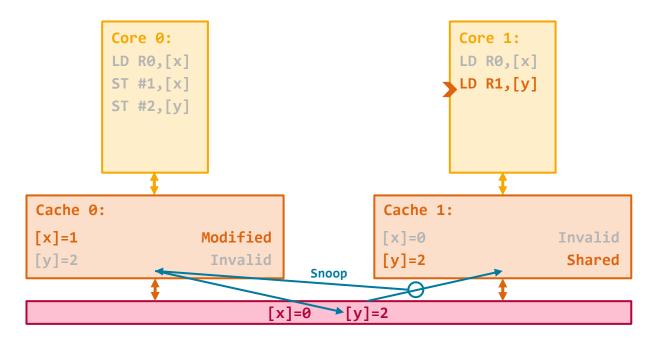
MSI Coherence Protocol



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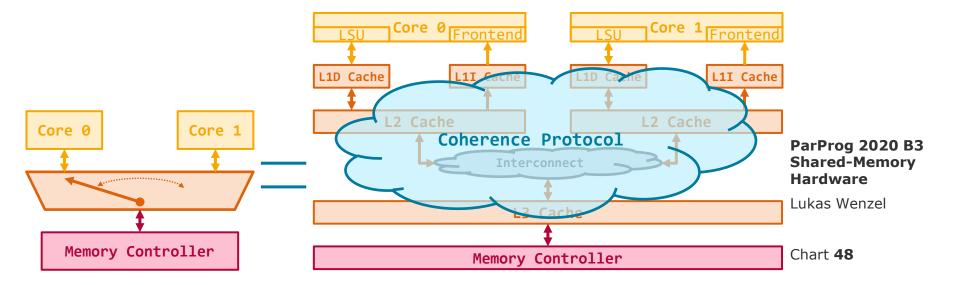
MSI Coherence Protocol



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A coherent cache hierarchy reestablishes sequential consistency equivalent to the original multiplexer model!



Shared-Memory Hardware References



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Can be accessed from the Uni Potsdam network at: https://www.morganclaypool.com/toc/cac/1/ ParProg 2020 B3 Shared-Memory Hardware



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And now for a break and the last cup of Darjeeling.