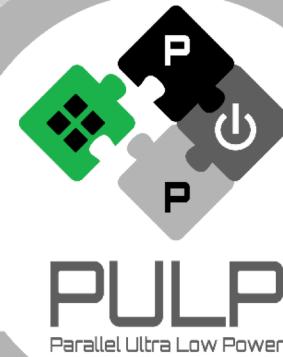




Understanding and working with PULP



Pasquale Davide Schiavone
and the PULP team

¹Integrated System laboratory, ETH, Zurich, Switzerland

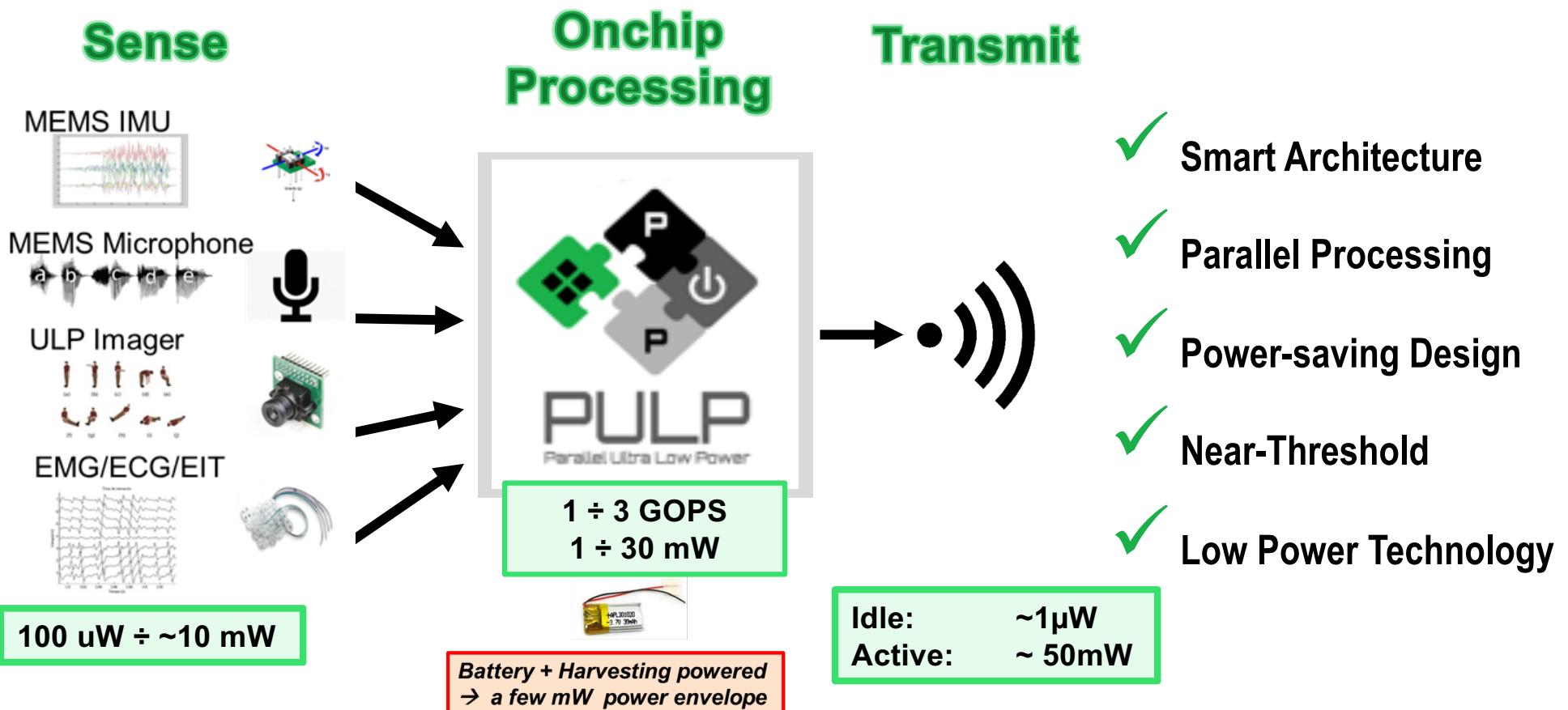
²Energy Efficient Embedded Systems Laboratory, University Of Bologna, Bologna, Italy



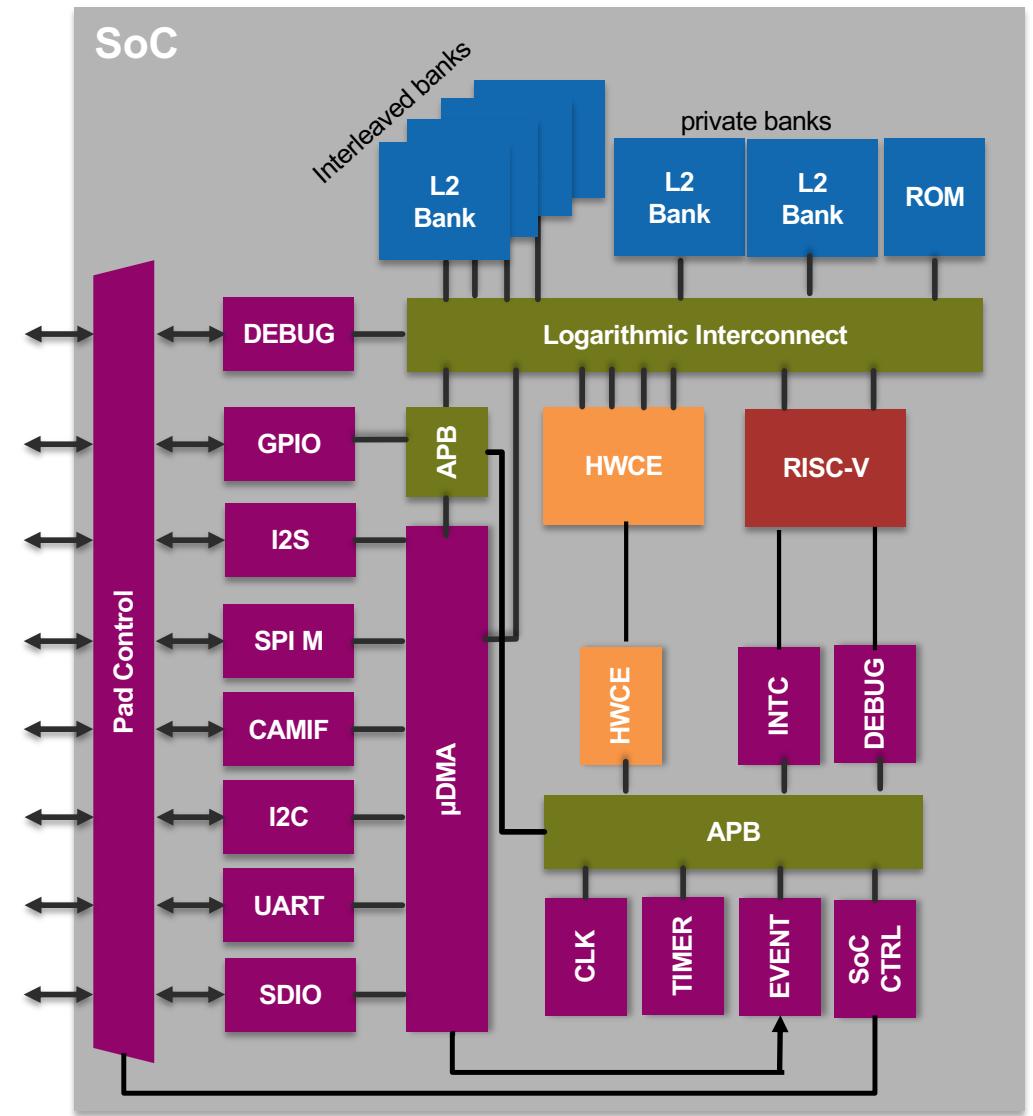
¹Department of Electrical, Electronic
and Information Engineering

ETH zürich
²Integrated Systems Laboratory

Near Sensor (aka Edge) Processing

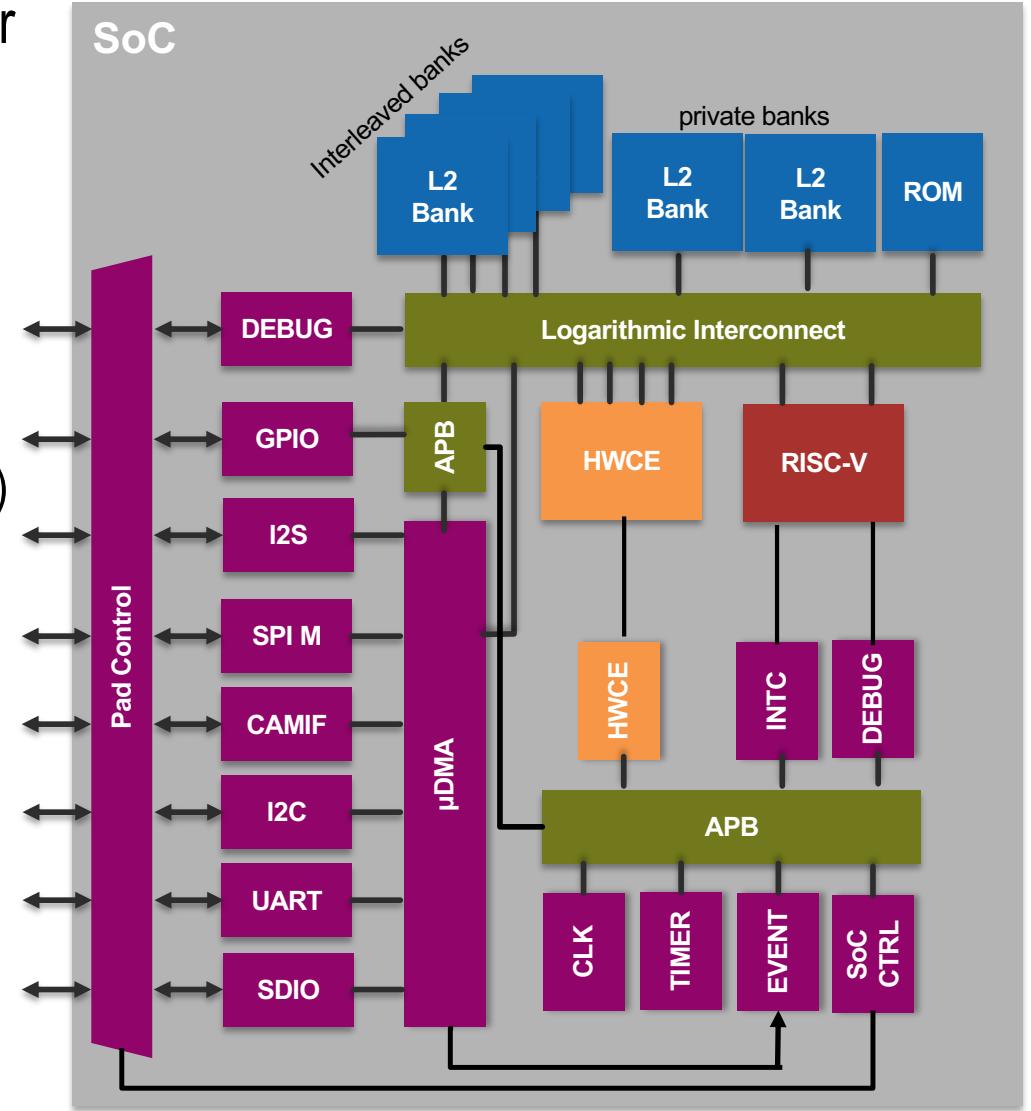


PULPissimo Architecture

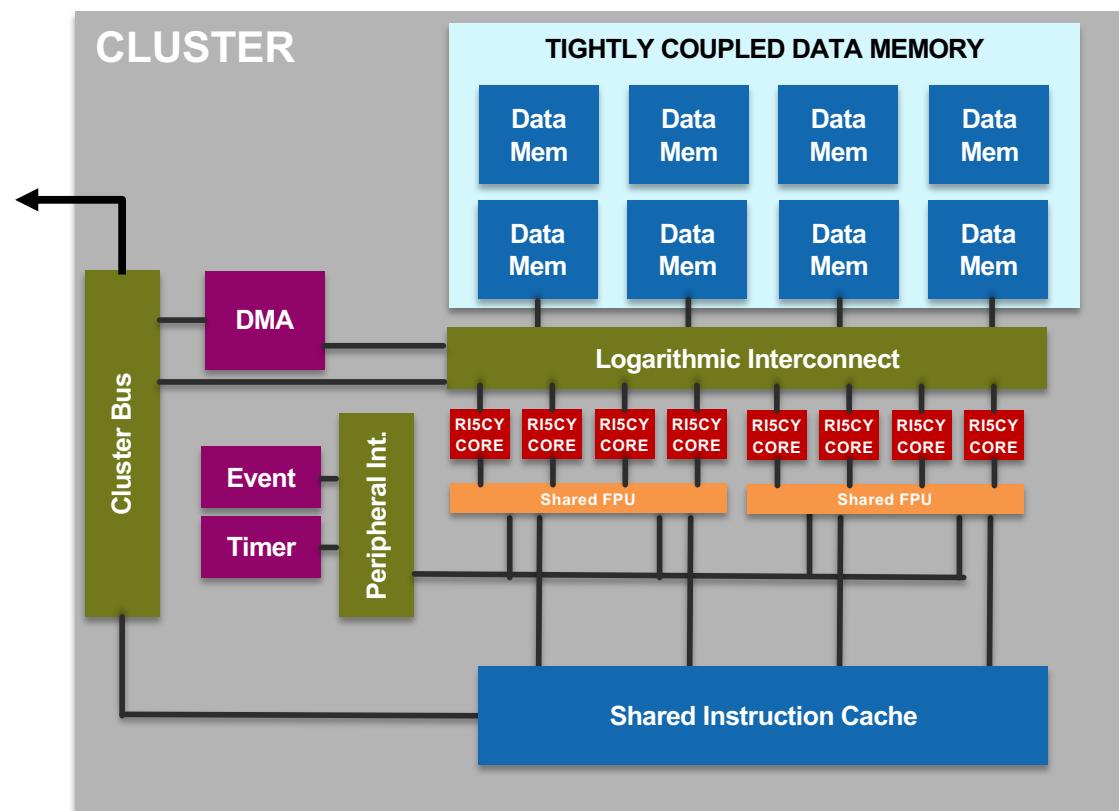


PULPissimo Architecture

- RISC-V based advanced microcontroller
 - 512kB of L2 Memory
 - 16kB of energy efficient latch-based memory (L2 SCM BANK)
- Rich set of peripherals:
 - QSPI (up to 280 Mbps)
 - Camera Interface (up to 320x240@60fps)
 - I2C, I2S (up to 4 digital microphones)
 - JTAG (Debug), GPIOs,
 - Interrupt controller, Bootup ROM
- Autonomous IO DMA Subsystem (μ DMA)
- Power management
 - 2 low-power FLLs (IO, SoC)

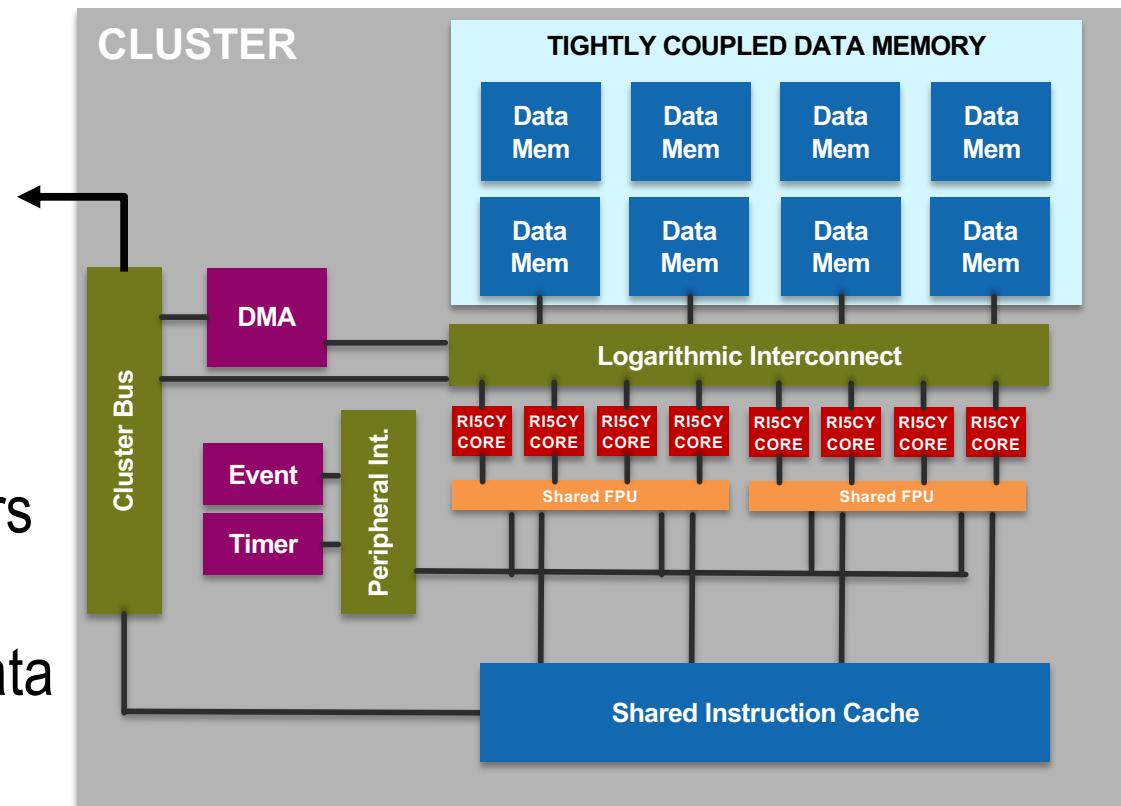


PULP Cluster Architecture



PULP Cluster Architecture

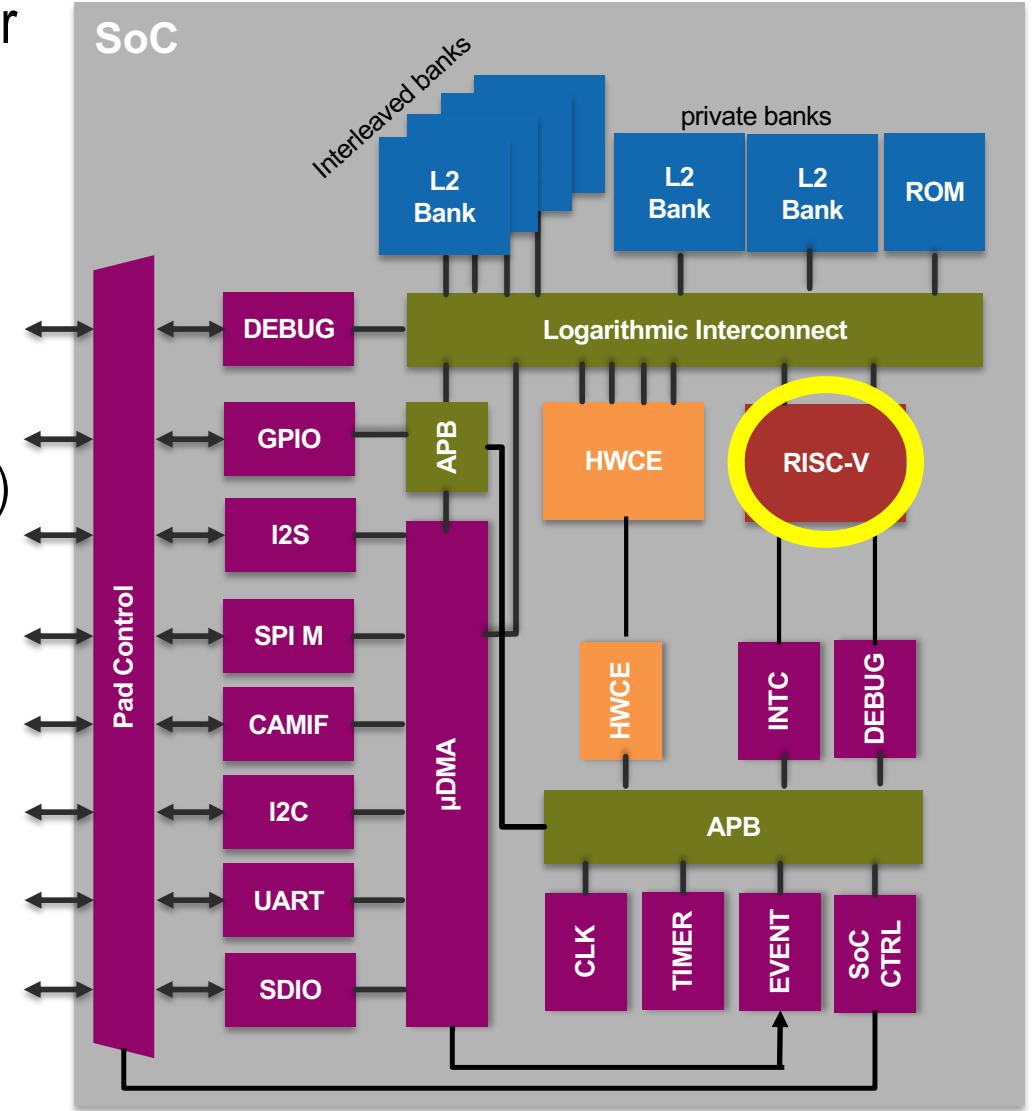
- 8 RISC-V multicore cluster
 - 64kB of L1 Memory
- Shared FPU for efficient resources minimization
 - 2 FPU, 1 every 4 cores
- Shared I\$
 - Optimize cache usage
- Multi-Core event unit for barriers and clock-gate management
- DMA for efficient L2 ↔ L1 data transfers



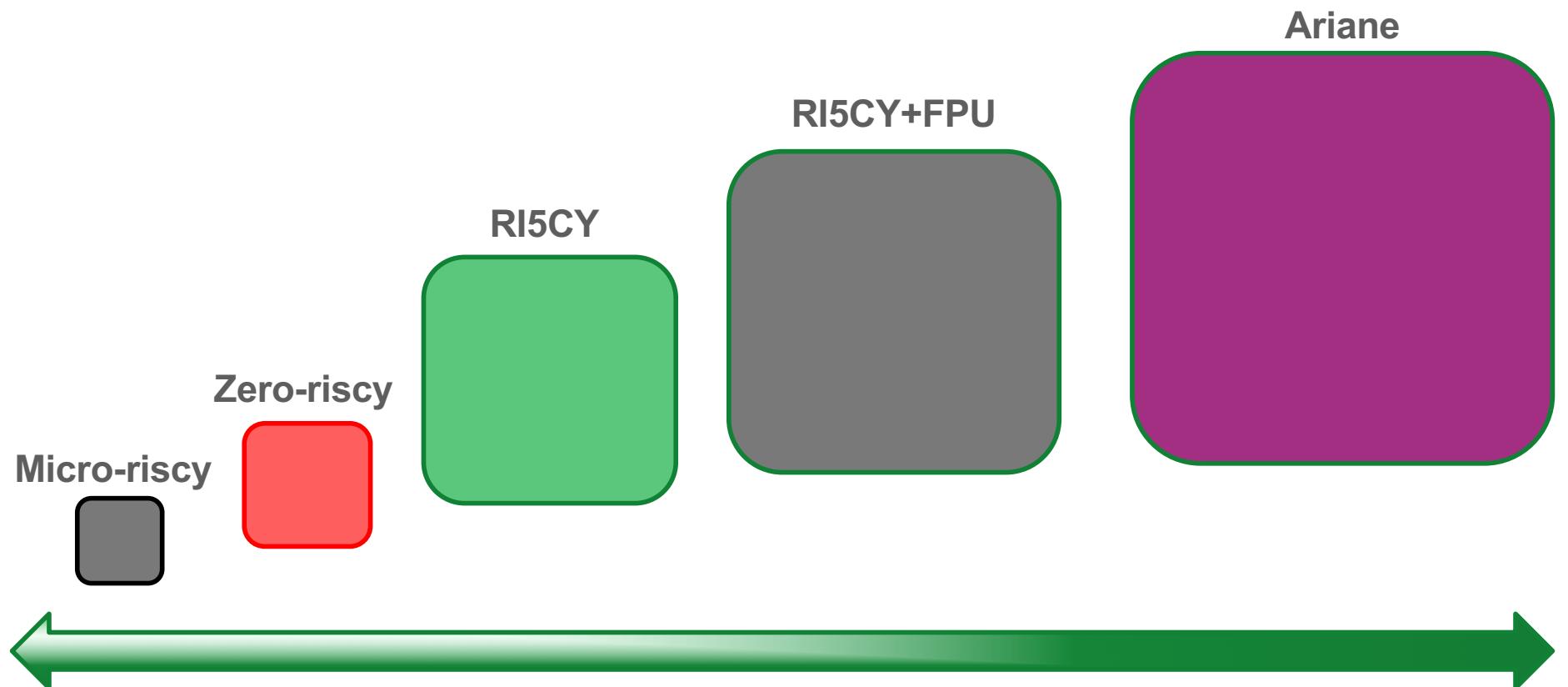
The RISC-V PULP cores

PULPissimo Architecture

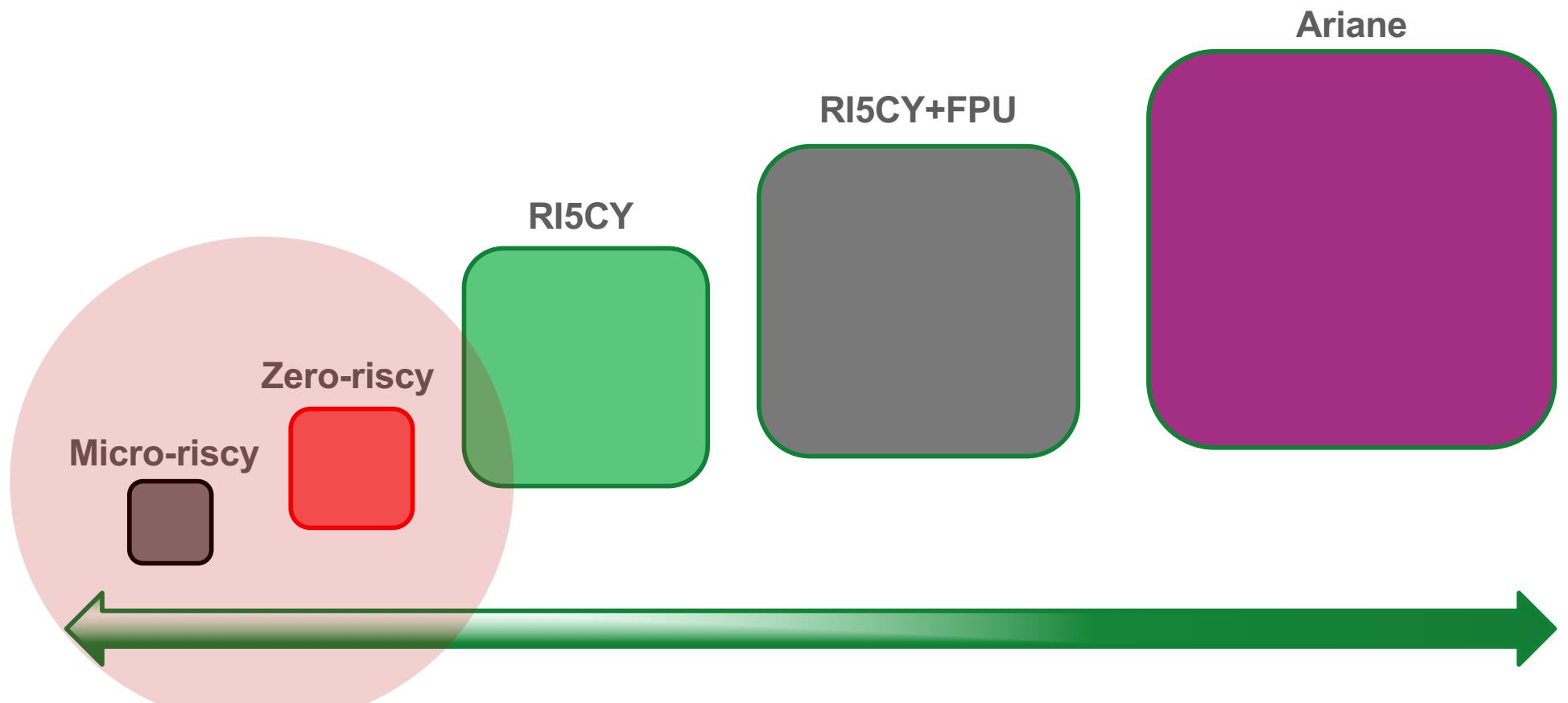
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Different Workload? Different core



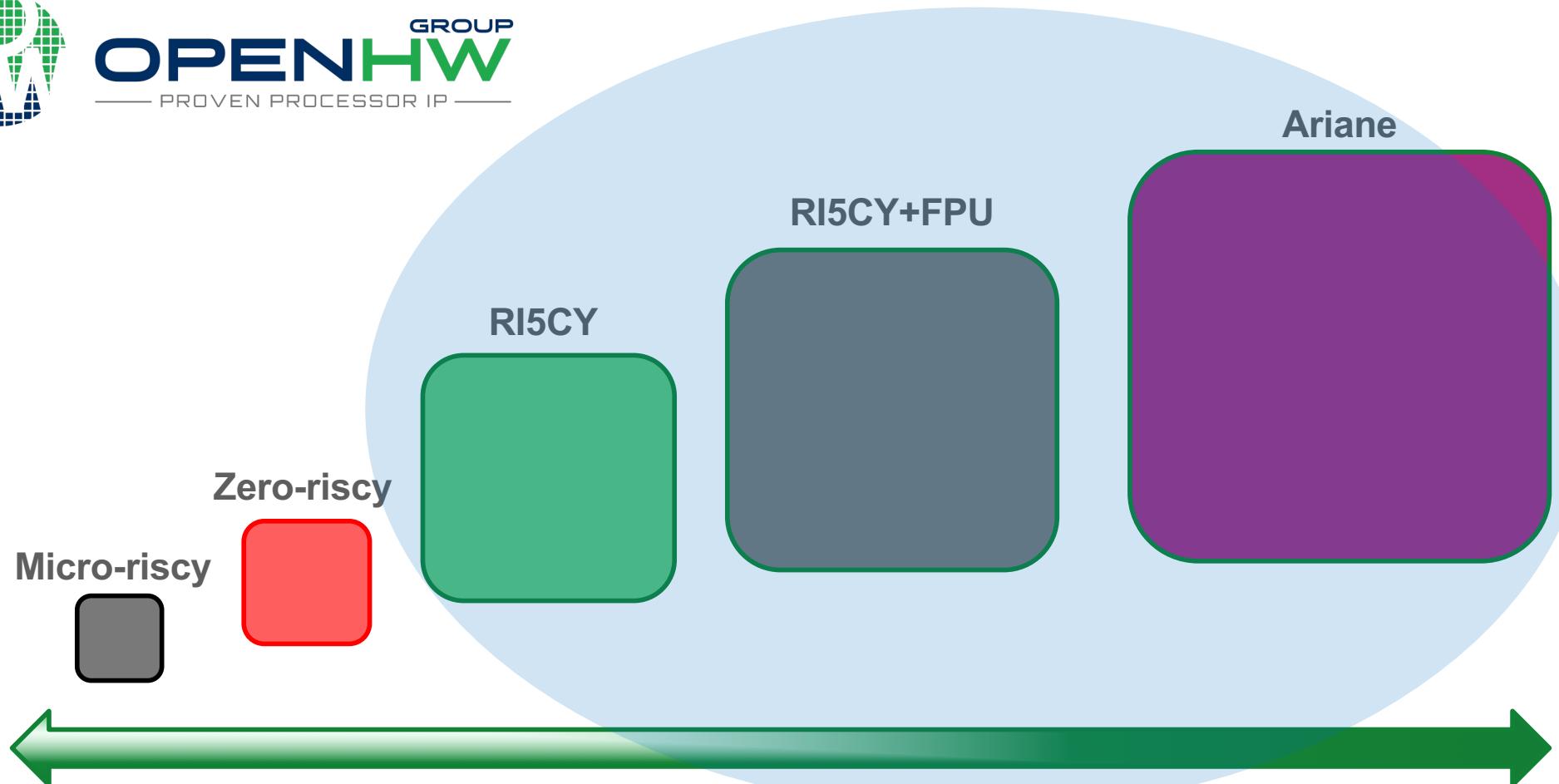
Different Workload? Different core



Now part of **lowRISC** under the «IBEX» name



Different Workload? Different core



Going to be part of

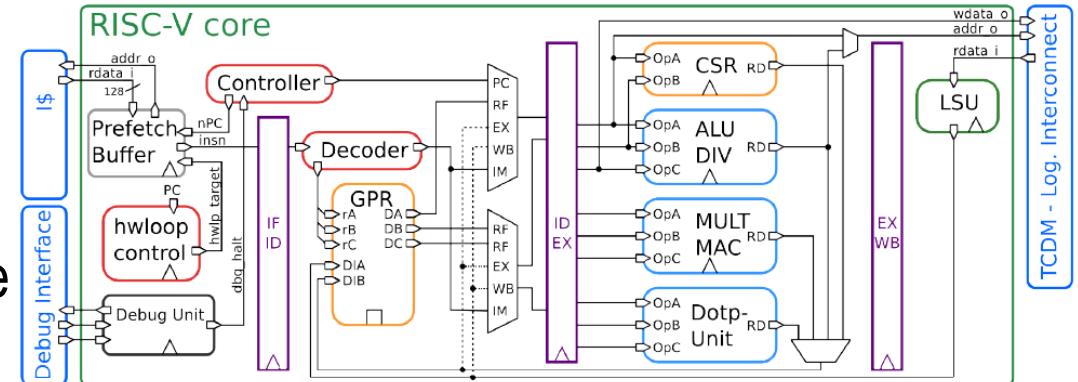


IP core family



RI5CY Processor: our workhorse core

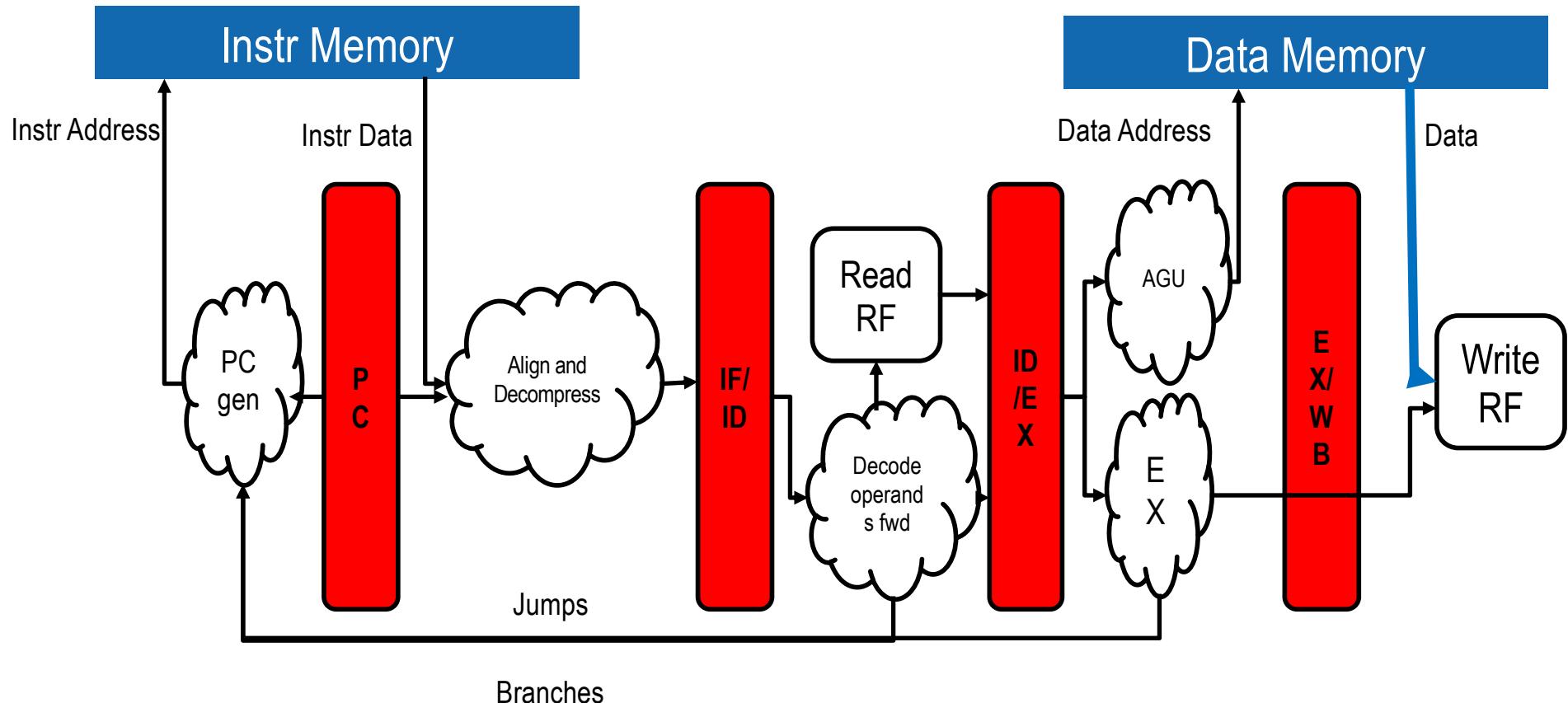
- 4-stage pipeline
 - RV32IMFCXpulp
 - 70K GF22 nand2 equivalent gate (GE) + 30KGE for FPU
 - Coremark/MHz 3.19
 - Includes various extensions
 - pSIMD
 - Fixed point
 - Bit manipulations
 - HW loops
- Silicon Proven
 - SMIC130, UMC65, TSMC55LP, TSMC40LP, GF22FDX



<https://github.com/pulp-platform/riscv>

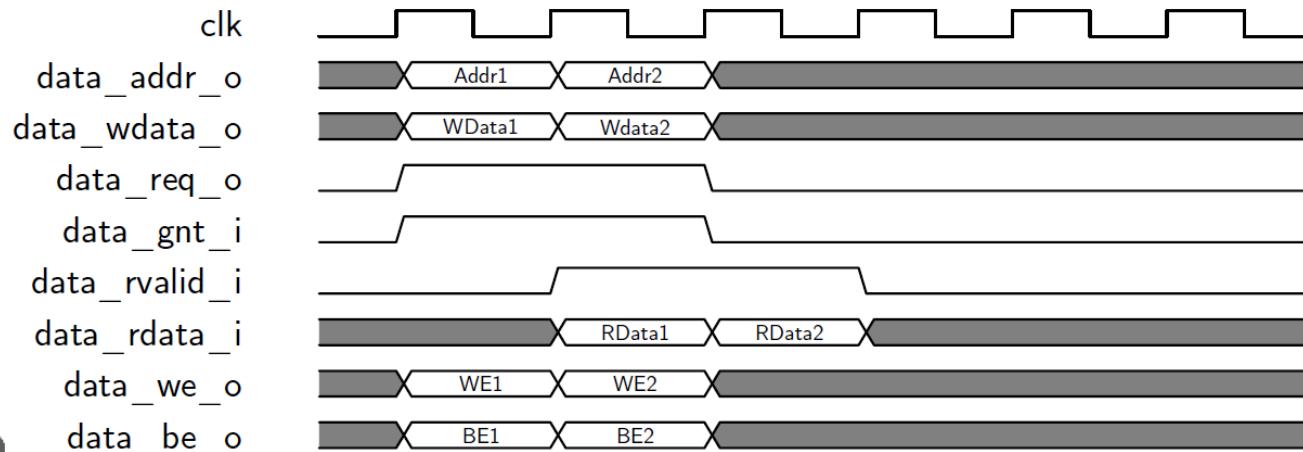
- **NEW Floating Point Unit:**
 - Iterative DIV/SQRT (9 cycles)
 - Parametrizable latency for MUL, ADD, SUB, Cast
 - Single cycle load, store

RI5CY simplified pipeline



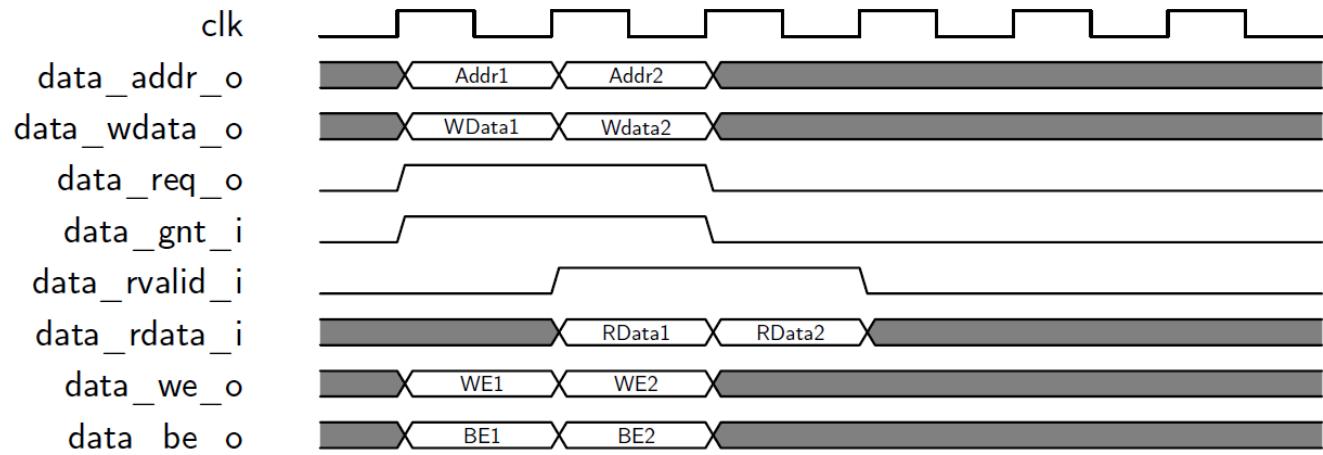
PULP Cores Memory Interface (1/2)

- Request with Address (32bits) and request (1bit) signal
 - Byte Enable (BE) (4bits): byte, short or word memory transaction) in case of Load/Store
 - Write Enable (WE) (1 bit)
 - wdata (32bits): data to write in case of store operations
- Response with Grant signal and Valid signal
 - The core can be interfaced with multicycle memory accesses
 - Grant comes from the arbiter
 - Valid from the memory subsystem
 - rdata (32bits): data to read. It has to be sampled when the valid signal is high

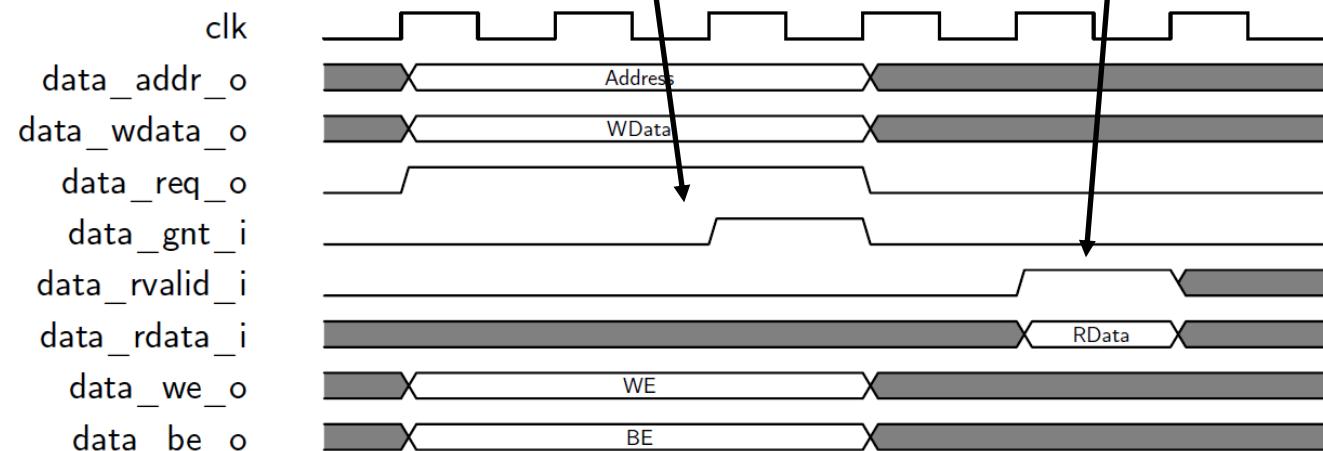


PULP Cores Memory Interface (2/2)

- Back2Back Memory Transactions



- Slow Memory Transactions



Xpulp Extensions: General Purposes Extensions 1

• Memory Access Extensions

- Misaligned memory accesses (not ISA extension)
 - Load or Store 32/16bit values with non-multiple of 4/2 addresses
 - Useful when dealing with packet-data (32bits values holding 2/4 elements)
 - It requires 2 access to the memory, data manipulation done in the load-store-unit
 - e.g. LOAD 32bit at 0x0000_0002
 - Read from memory higher 16bits at 0x0000_0000
 - Read from memory lower 16bits at 0x0000_0004 and pack the data
 - Save instructions (code size) and speed up execution
 - Explicit load to 0x0000_0000 and 0x0000_0004, shift and or operations

Original RISC-V	Misaligned Ext
<code>lw x2, 0(x10)</code> <code>lw x3, 4(x10)</code> <code>slli x2, x2, 16</code> <code>slli x3, x3, 16</code> <code>or x3, x3, x2</code>	<code>Iw x2, 2(x10)</code>

Xpulp Extensions: General Purposes Extensions 2

- **Memory Access Extensions**

- Post Increment Load/Store
 - Automatic register update with computed address
 - Useful in array iterations
 - Save instructions
 - It requires extra write register file port or slower execution
- Register-Register Load/Store (and Post Increment)
 - Immediate is only 12bits
 - Use register-register address calculation for 32bits offset

Original RISC-V

```
lw x2, 4(x10)
lw x3, 4(x12)
addi x10, x10, 4
addi x12, x12, 4
...
LOOP
```

AutoIncrement Load/Store Ext

```
lw x2, 4(x10!)
lw x3, 4(x12!)
...
LOOP
```

Xpulp Extentions: General Purposes Extensions 3

• Hardware loops extensions

- HWLs or Zero Overhead Loops to remove branch overheads in for loops.
 - Smaller loop benefit more!
- Loop needs to be set up beforehand and is fully defined 3 SP regs by:
 - Start address → lp.starti L, Imm12 → START_REG[L] = PC + 2*Imm12
 - End address → lp.endi L, Imm12 → END_REG[L] = PC + 2*Imm12
 - Counter → lp.count{-,i}, L, {rs1,Imm12} → COUNT_REG[L] = rs1/Imm12
 - Short-cut → lp.setup{-,i}, L, {rs1,ImmC}, Imm12
 - START_REG[L] = PC + 4, END_REG[L] = PC + 2*Imm12, COUNT_REG[L] = {rs1,ImmC}
- Two sets registers implemented to support nested loops (L=0 or 1)
- Performance:
 - Speedup can be up to factor 2!

Original RISC-V

```
mv x5, 0  
mv x4, 100  
Lstart:  
    addi x4, x4, -1  
    nop  
    nop  
bne x4, x5, Lstart
```

HW Loop Ext

```
lp.setupi 100, Lend  
nop  
Lend: nop
```

Xpulp Extentions: Bit Manipulation

- **Bit manipulation extensions**

- RISC-V reserved the “RVB” extensions but it is still an on-going topic
- PULP developed its own bit-manipulation and possibly will align with RVB
 - Contribution to the official task in the RISC-V community
- Bit Manipulation instructions list
 - Extract N bits starting from M from a word and extend (or not) with sign
 - Insert N bits starting from M in a word
 - Clear N bits starting from M in a word
 - Set N bits starting from M in a word
 - Find first bit set
 - Find last bit set
 - Count numbers of 1 (popcount)
 - Rotate

Original RISC-V

```
mv x5, 0  
mv x7, 0  
mv x4, 32  
Lstart:  
andi x6, x8, 1  
add x7, x7, x6  
addi x4, x4, 1  
srai x8, x8, 1  
bne x4, x5, Lstart
```

BitMan Ext

```
p.cnt x8, x8
```

Xpulp Extentions: DSP

- DSP extensions
 - General purposes
 - ABS, CLIP/Saturation
 - MIN, MAX
 - MAC and MSU
 - Fixed Point Support
 - ADD and SUB with normalization and round
 - MUL and MAC with normalization and round
 - Possibility to share some resources
 - ABS reuses the adder and comparator in the ALU
 - Clip adds a comparator but reuses adder and previous comparator
 - Normalization done by connecting adder output to the shifter
 - Round done by exploiting multi-operand adders

Original RISC-V

```
add x4, x4, x5  
addi x4, x4, 1  
slri x4, x4, 1
```

DSP Ext

```
p.addRN x4, x5, x5, 1
```

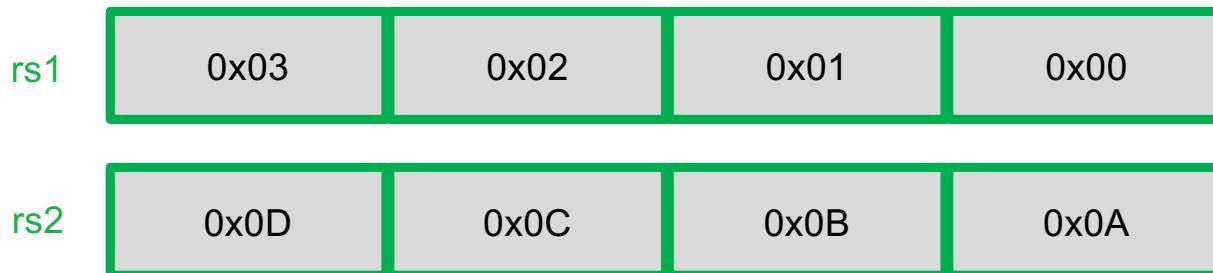
Xpulp Extentions: packed-SIMD 1/4

- **packed-SIMD extensions**
 - RISC-V reserved the “RVP” extensions but it is still an on-going topic
 - It also includes DSP extensions
 - Differently from “RVV” vectorial extensions, vectors are packet to the integer RF
 - Make usage of resources the best in performance with little overhead
 - Target for embedded systems, RVV is for high performance
 - pSIMD in 32bit machines
 - Vectors are either 4 8bits-elements or 2 16bits-elements
 - pSIMD instructions

Computation	add, sub, shift, avg, abs, dot product
Compare	min, max, compare
Manipulate	extract, pack, shuffle

Xpulp Extentions: packed-SIMD 2/4

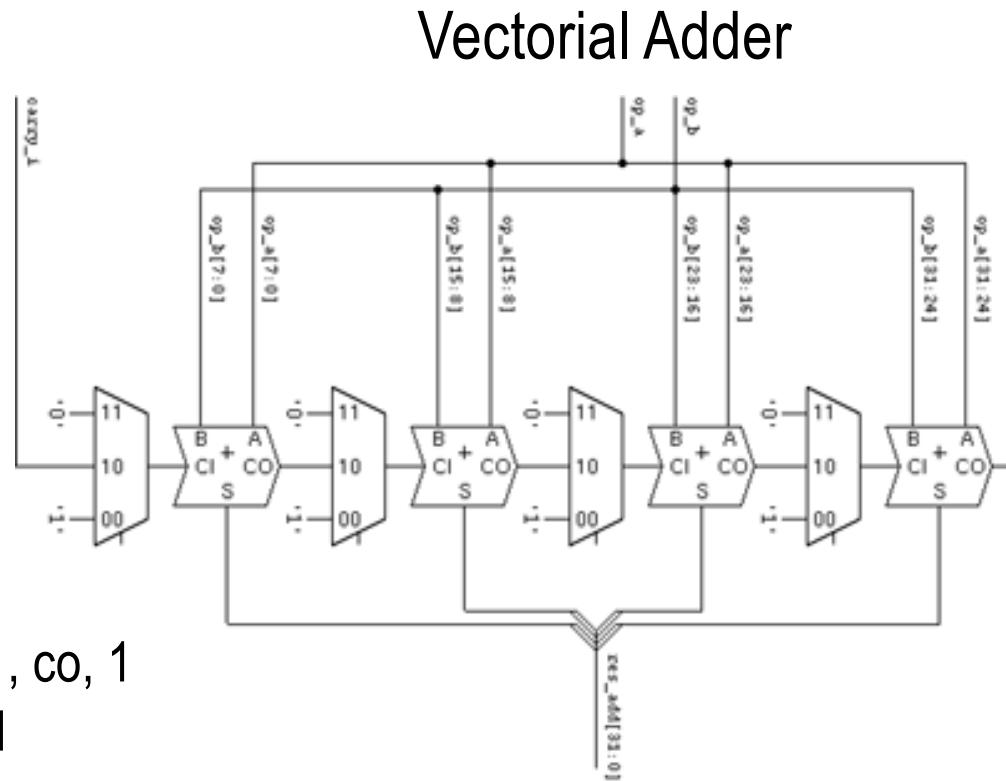
- Same Register-file
 - The instruction encode how to interpret the content of the register



add rD, rs1, rs2	$rD = 0x03020100 + 0x0D0C0B0A$
add.h rD, rs1, rs2	$rD[0] = 0x0100 + 0x0B0A$ $rD[1] = 0x0302 + 0x0D0C$
add.b rD, rs1, rs2	$rD[0] = 0x00 + 0x0A$ $rD[1] = 0x01 + 0x0B$ $rD[2] = 0x02 + 0x0C$ $rD[3] = 0x03 + 0x0D$

Xpulp Extentions: packed-SIMD 3/4

- HW reuse for small overhead
- Vector modes:
 - bytes, halfwords, word
 - 4 byte operations
 - With byte select
 - 2 halfword operations
 - With halfword select
 - 1 word operation
- Play with carry chain
 - 32bit adder → 35bit adder
 - Vector halfword sub → Carry = co, 1, co, 1
 - Vector byte sub → Carry = 1, 1, 1, 1
 - word sub → Carry = co, co, co, 1



Xpulp Extentions: packed-SIMD 4/4

- Shuffle instructions
- In order to use the vector unit the elements have to be aligned in the register file
- Shuffle allows to recombine bytes into 1 register

- `pv.shuffle2.b rD, rA, rB`

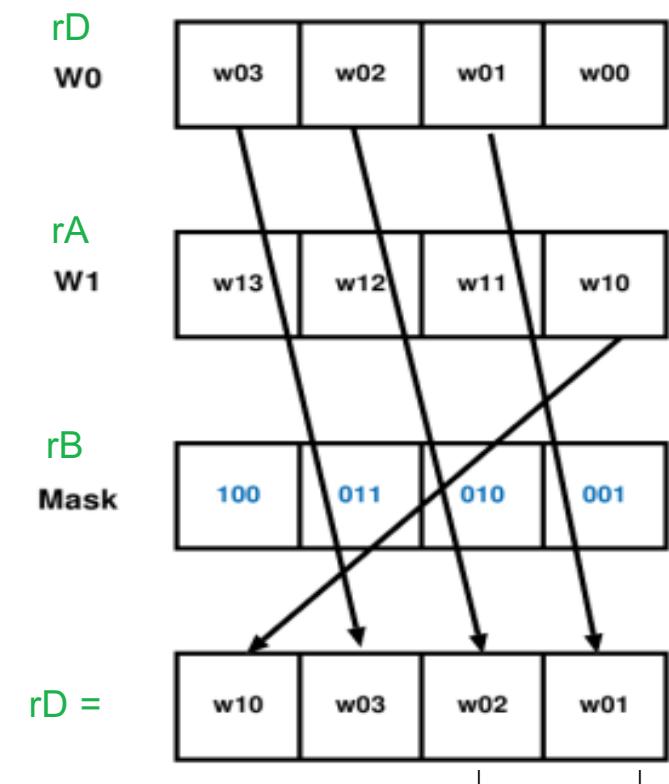
$$rD\{3\} = (rB[26]==0) ? rA:rD \{rB[25:24]\}$$

$$rD\{2\} = (rB[18]==0) ? rA:rD \{rB[17:16]\}$$

$$rD\{1\} = (rB[10]==0) ? rA:rD \{rB[9: 8]\}$$

$$rD\{0\} = (rB[2]==0) ? rA:rD \{rB[1: 0]\}$$

- With $rX\{i\} = rX[(i+1)*8-1:i*8]$



ISA Extensions: Putting it All Together

```
for (i = 0; i < 100; i++)  
    d[i] = a[i] + b[i];
```

Baseline

```
mv x5, 0  
mv x4, 100  
Lstart:  
    lb x2, 0(x10)  
    lb x3, 0(x11)  
    addi x10,x10, 1  
    addi x11,x11, 1  
    add x2, x3, x2  
    sb x2, 0(x12)  
    addi x4, x4, -1  
    addi x12,x12, 1  
    bne x4, x5, Lstart
```

Auto-incr load/store

```
mv x5, 0  
mv x4, 100  
Lstart:  
    lb x2, 1(x10!)  
    lb x3, 1(x11!)  
    addi x4, x4, -1  
    add x2, x3, x2  
    sb x2, 1(x12!)  
    bne x4, x5, Lstart
```

HW Loop

```
lp.setupi 100, Lend  
    lb x2, 1(x10!)  
    lb x3, 1(x11!)  
    add x2, x3, x2  
Lend: sb x2, 1(x12!)
```

Packed-SIMD

```
lp.setupi 25, Lend  
    lw x2, 4(x10!)  
    lw x3, 4(x11!)  
    pv.add.b x2, x3, x2  
Lend: sw x2, 4(x12!)
```

11 cycles/output

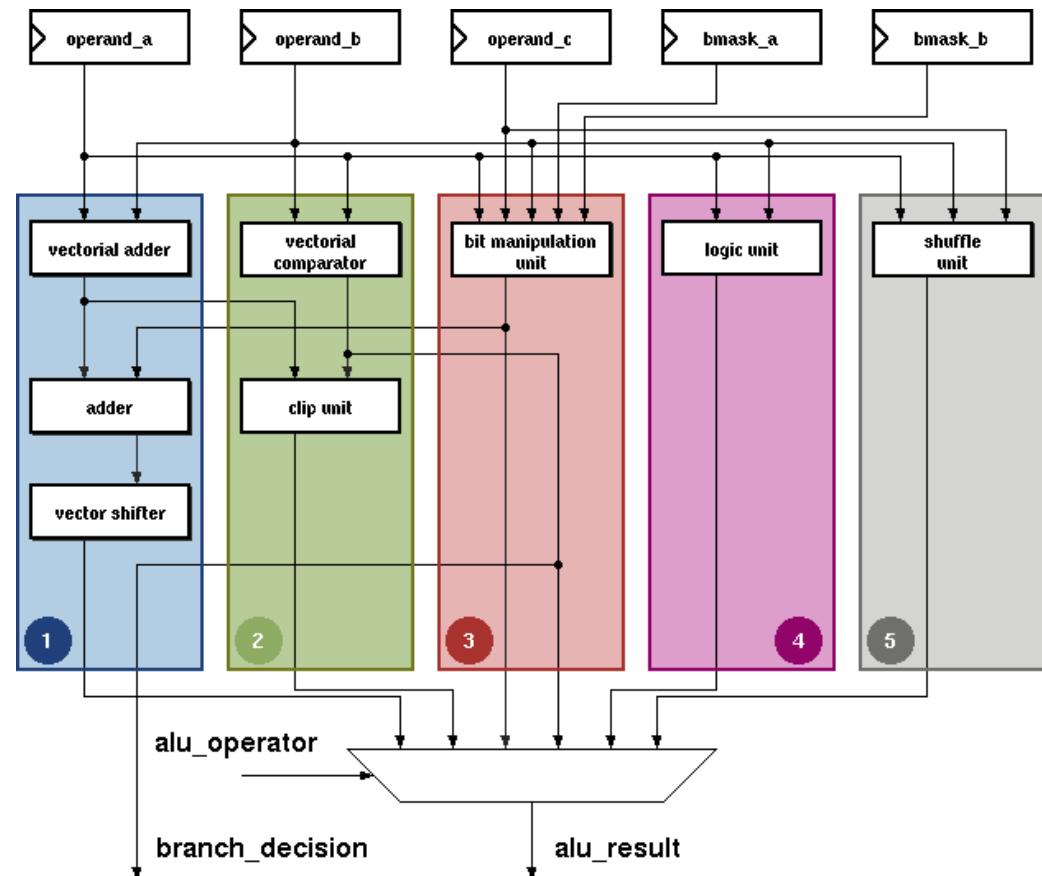
8 cycles/output

5 cycles/output

1,25 cycles/output

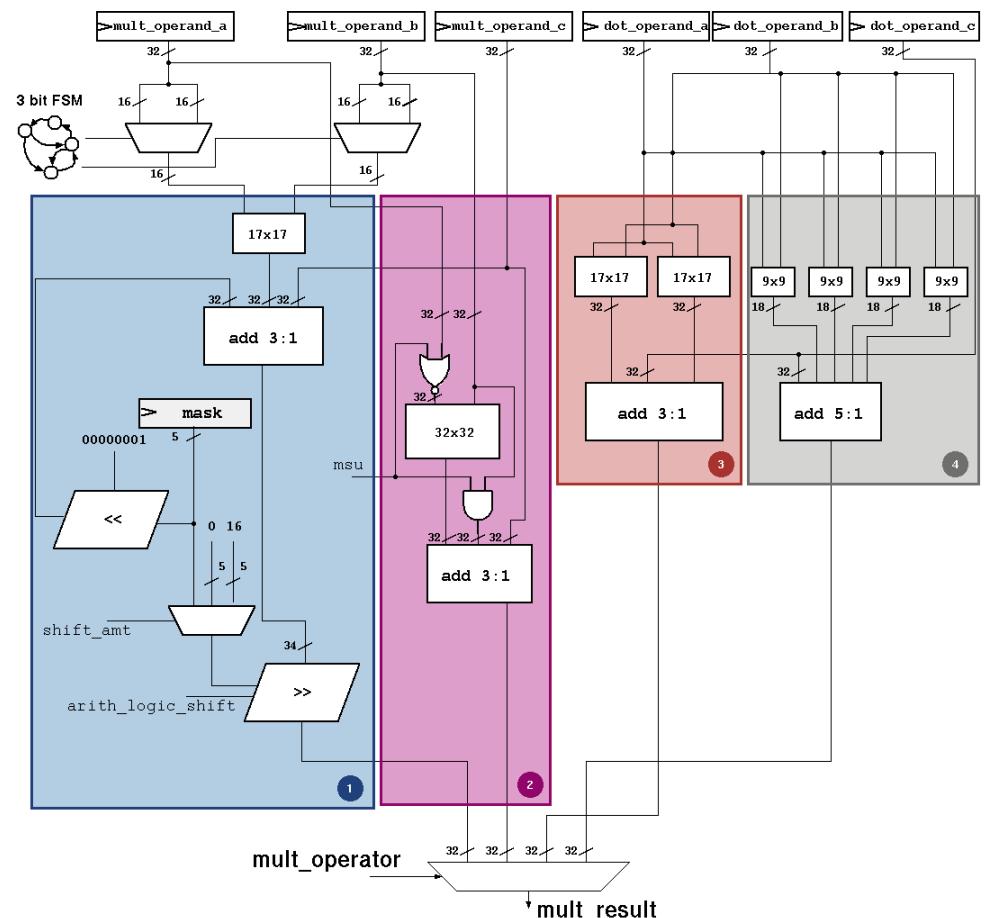
ALU architecture

- Advanced ALU for Xpulp extensions
- Optimized datapath to reduce resources
- Multiple-adders for round
- Adder followed by shifter for fixed point normalization
- Clip unit uses one adder as comparator and the main comparator



MUL architecture

- (blue) 16x16 with sign selection for short multiplications [with round and normalization]. 5 cycles FSM for higher 64-bits (mulh* instructions)
- (purple) One single cycle mac unit that performs MAC, MSU and MUL
- (red) short parallel dot product
- (grey) byte parallel dot product
- Clock gating to reduce switching activity between the integer and SIMD multiplier



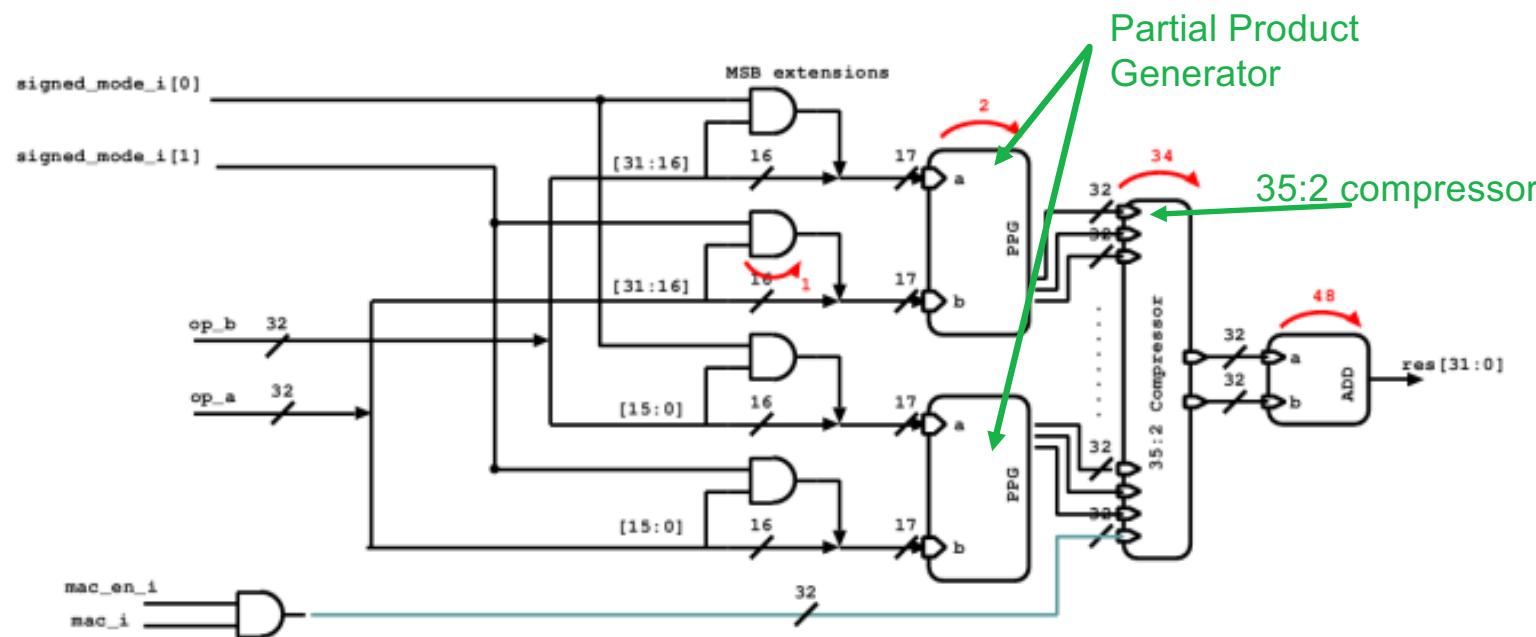
Dot Product Multiplier

- Dot Product: (half word example)

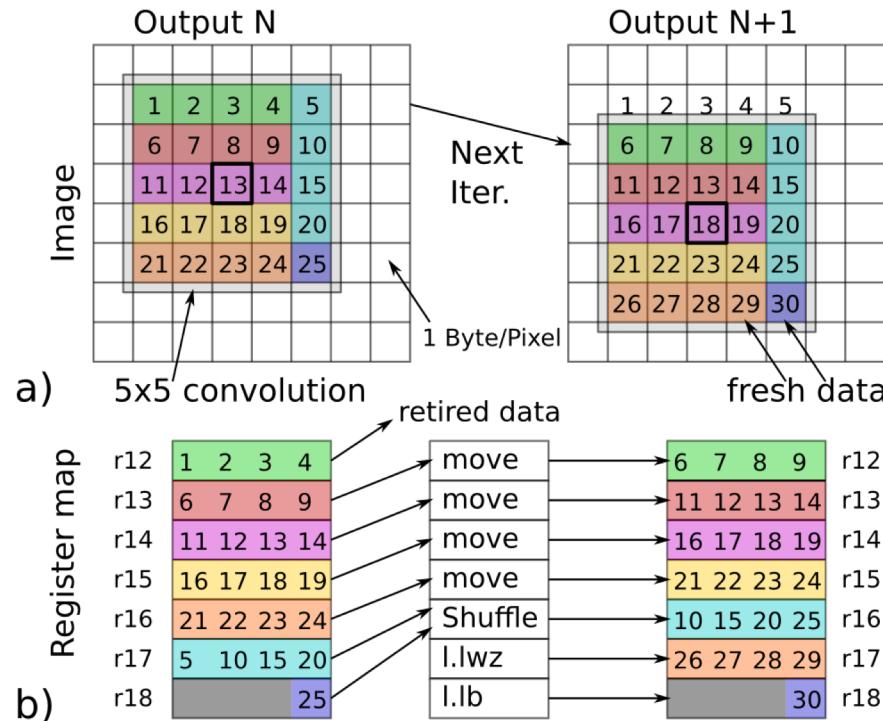
$$C[31:0] = A[31:16]*B[31:16] + A[15:0]*B[15:0] + C[31:0]$$

32 bit 32 bit 32 bit

=> 2 multiplications, 1 addition, 1 accumulation in 1 cycle!

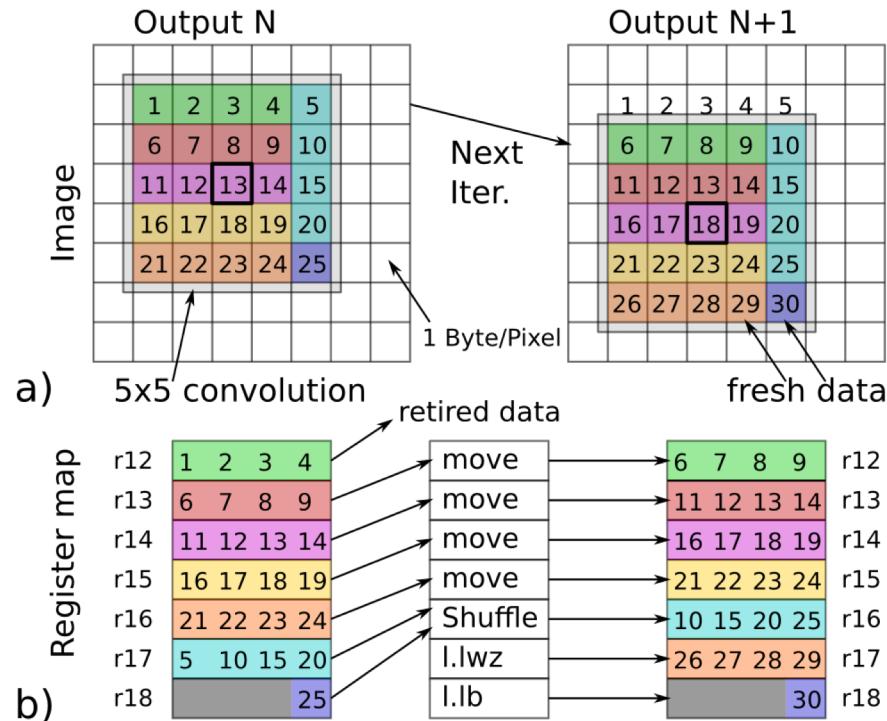


2D Convolution with Xpulp Extensions: performance + less memory pressure



- Convolution in registers
- 5x5 convolutional filter

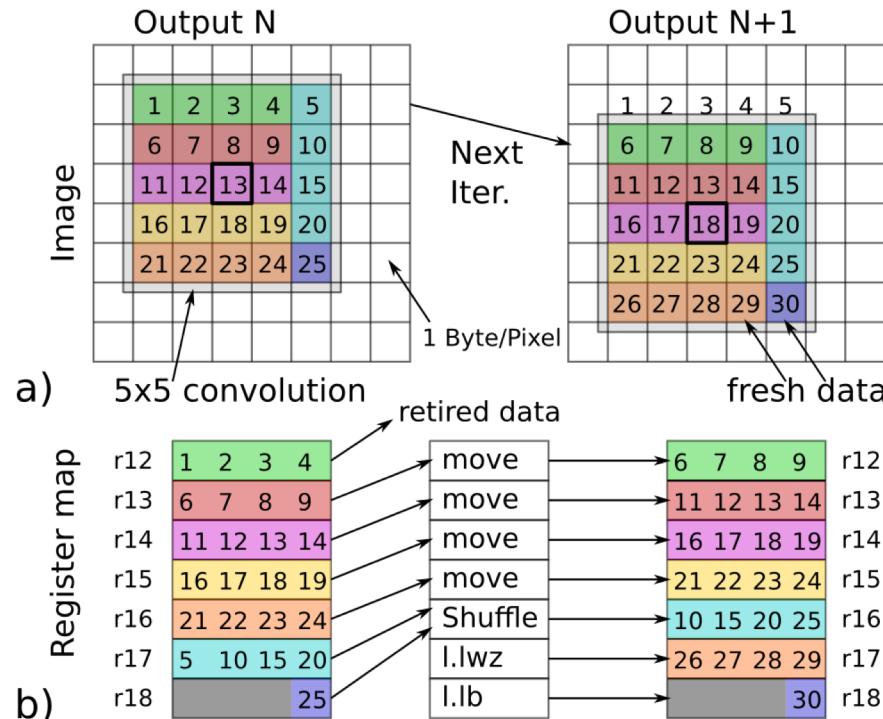
2D Convolution with Xpulp Extensions: performance + less memory pressure



- Convolution in registers
- 5x5 convolutional filter

- 7 Sum-of-dot-product
- 4 move
- 1 shuffle
- 3 lw/sw
- ~ 5 control instructions

2D Convolution with Xpulp Extensions: performance + less memory pressure



- Convolution in registers
- 5x5 convolutional filter

- 7 Sum-of-dot-product
- 4 move
- 1 shuffle
- 3 lw/sw
- ~ 5 control instructions

20 instr. / output pixel → Scalar version >100 instr. / output pixel

PULP core examples – RV32IMC vs RV32IMCXPulp General code

- 2 bytes saved
(X instructions not compressed)
- Number of instructions reduced (21 vs 18)
- Removed branch penalties

```
start_loop:  
    addi a6,t1,-32  
    c.mv a7,t5 //address of matA  
    addi t3,a0,-32  
loop0:  
    c.mv a4,t3 //address of matA  
    c.mv a2,a7  
    c.li a5,0  
loop1:  
    lbu a3,0(a4) //load byte  
    lbu a1,0(a2)  
    c.addi a4,a4,1 //post increment  
    mul a3,a3,a1 //mul  
    c.add a5,a5,a3 //acc after mul  
    andi a5,a5,255  
    c.addi a2,a2,1  
    bne a4,a0,loop1 // branch penalty  
    sb a5,0(a6)  
    c.addi a6,a6,1  
    addi a7,a7,32  
    bne a6,t1,loop0 //branch penalty  
    addi t1,a6,32  
    addi a0,a4,32  
    bne t1,t4,start_loop
```

```
start_loop:  
    addi t3,t5,-32  
    c.mv a7,s2 //address of matB  
    addi t1,t4,-32  
    lp.setupi x0,32,stop0  
    c.mv a3,t1 //address of matA  
    c.mv a2,a7  
    c.li a5,0  
    sub a4,t4,t1 //loop count1  
    lp.setup x1,a4,stop1 //hw loop  
    p.lbu a0,1(a3!) //load byte with post increment  
    p.lbu a1,32(a2!)  
    p.mac a5,a0,a1 //mac  
stop1: andi a5,a5,255  
    p.sb a5,1(t3!) //store result with post increment  
stop0: c.addi a7,a7,1  
    addi t5,t5,32  
    addi t4,a3,32  
    bne t5,t6,start_loop
```

PULP core examples – RV32IMCXPulp General code vs Opt code

- The innermost loop has 4x less iterations
 - 4 bytes per matrix are loaded as a 32b word
 - Dot product with accumulation performs in 1 cycle 4 macs

...

```
lp.setup x1,a4,stop1
p.lbu a0,1(a3!)
p.lbu a1,1(a2!)
stop1: p.mac a5,a0,a1
....
```

... //iterate #COL/4

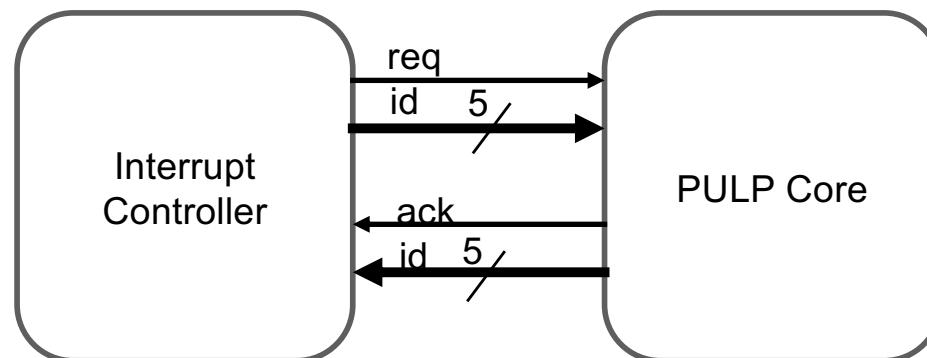
```
lp.setup x1,a6,stop1
p.lw a1,4(t1!) //load 4-bytes with post inc
p.lw a5,4(t3!)
stop1: pv.sdotsp.b a7,a1,a5 //4 mac
....
```

PULP cores Interrupts

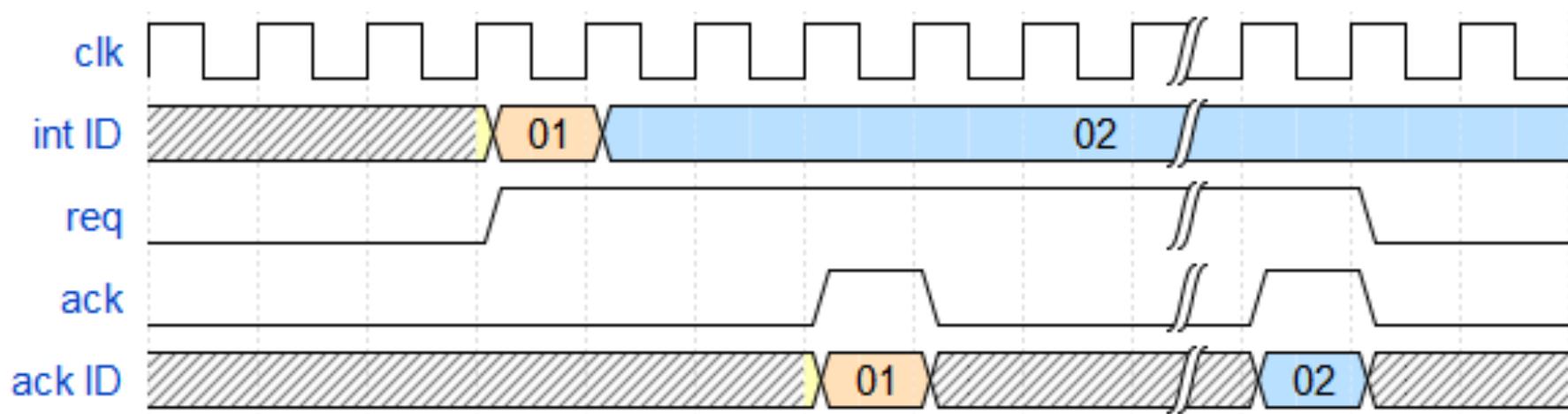
- *Asynchronous events*
 - If interrupt is taken, jump to xtvec
 - xtvec holds the base address to jump
 - + 4*interrupt ID for computing the actual address
 - No delegation supported
 - All interrupts are handled in machine mode
 - External interrupt controller interact with peripheral subsystem and SW events

PULP cores interrupts protocol

- Asynchronous protocol between CORE and INTController
 - The core takes few cycles before jumping
 - The external interrupt controller may change ID number
 - e.g. higher priority requests from peripherals
 - The core tells the interrupt controller which ID has been used to calculate the address of the interrupt vector table
 - The interrupt controller clears the taken ID

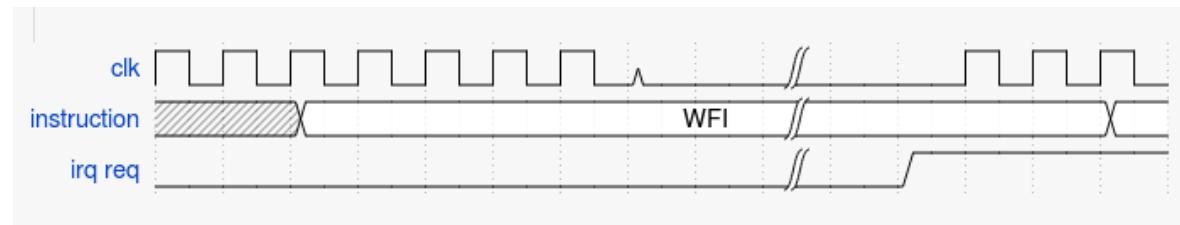


PULP cores interrupts protocol – timing diagram

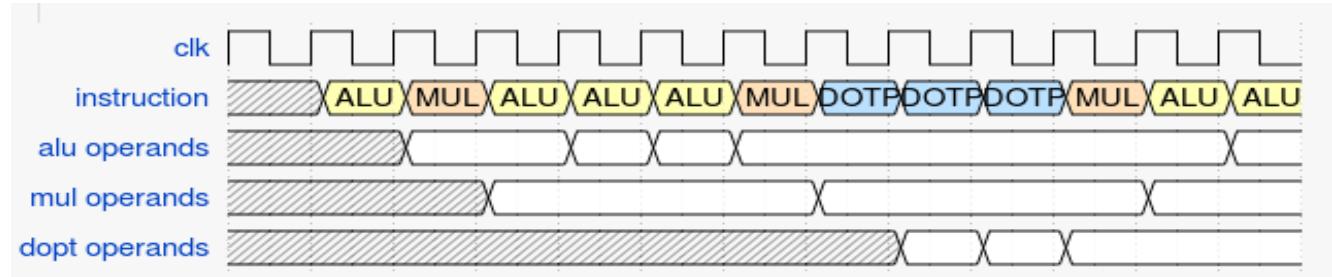


Wait For Interrupt & Power manager

- WFI instruction disables the clock
 - Dynamic power saved when core is in IDLE
 - Taken or Not interrupts wake up the core that starts from the instruction after WFI
 - The core waits for all the inflight instructions before switching off the clock
 - eg if a load is waiting for the valid signal, long divisions, floating point mac, debug



- The pipeline and state registers are clock gated when not used
 - The ALU, Integer Multiplier and Dot Product units have different operands registers
 - In the ID stage, the decoded instruction can be part of one of these 3 domains, the others 2 are clock gated



Performance Counter 1/3

- Registers in the CSR space that counts events
- Number of cycles and number of retired instructions used to calculate “IPC – Instructions per cycle”
- Performance counters used for counting the stalls

- Load stalls**

- Value not yet returned from memory

```
//LOAD STALL
lw    x10, 0x0(x2)
add  x10, x10, 0x4
```

PC	IF	ID	EX	WB
A+4 to lmem	<i>Y from lmem[A]</i>	<i>add needs value from lw → STALL</i>	addr to Dmem	-
A+8 to lmem	<i>Y from lmem[A]</i>	<i>add needs value from lw → FWD</i>	Bubble	D from Dmem
A+12 to lmem	<i>Z from lmem[A+4]</i>	decode Y	add	

Performance Counter 2/3

- Jump stalls (jalr)
 - Stall to break path from EX stage to Imem

PC	IF	ID	EX	WB
A+4 to Imem	<i>Y from Imem[A]</i>	<i>jalr needs x10 → STALL</i>	mul	-
x10+0x4 to Imem	<i>Bubble</i>	<i>Jump to x10+0x4</i>	-	-

```
//JALR STALL
mul x10, x10, x10
jalr x11, x10, 0x4
```

Performance Counter 3/3

- Other performance counters used to monitor
 - Number of cycles lost for fetching (Instruction Cache for instance)
 - Number of load, stores, branches, taken branches, jumps and compressed instructions

Address	Perf Counter	Description
0x782	LD_STALL	Number of load data hazards
0x783	JR_STALL	Number of jump register data hazards
0x784	IMISS	Cycles waiting for instruction fetches, i.e. number of instructions wasted due to non-ideal caching
0x785	LD	Number of data memory loads executed. Misaligned accesses are counted twice
0x786	ST	Number of data memory stores executed. Misaligned accesses are counted twice
0x787	JUMP	Number of unconditional jumps (j, jal, jr, jalr)
0x788	BRANCH	Number of branches. Counts taken and not taken branches
0x789	BTAKEN	Number of taken branches.
0x78A	RVC	Number of compressed instructions executed

Example Performance Counter

...enable perf counters...

csrw 0x782,x0 //reset perf counter LD_STALL

// loop 100 times over load stall

lp.setupi x1,100,stop_loop

lw x10,4(x14!)

stop_loop: add x11,x11,x10 //stall due to load dependency

csrr x15,0x782 // → x15 contains 100

Simulation Tracer

- For every instruction executed, the core prints on a file the
 - “TIME STAMP – PC – INSTRUCTION – OPERANDs and RESULTs”

Disassembly of section .text.startup.main:

PC	Address	Instruction	Mnemonic	Operands
00000400	<main>:			
400:	00100537	lui	a0, 0x100	
404:	ff010113	addi	sp, sp, -16	
408:	00050513	mv	a0, a0	
40c:	00112623	sw	ra, 12(sp)	
410:	030010ef	jal	1440 <puts>	
414:	00c12083	lw	ra, 12(sp)	
418:	00000513	li	a0, 0 # 0 <__DYNAMIC>	
41c:	01010113	addi	sp, sp, 16	
420:	00008067	ret		

Instr encoding

Relative jumps/branch target

Disassembled instruction

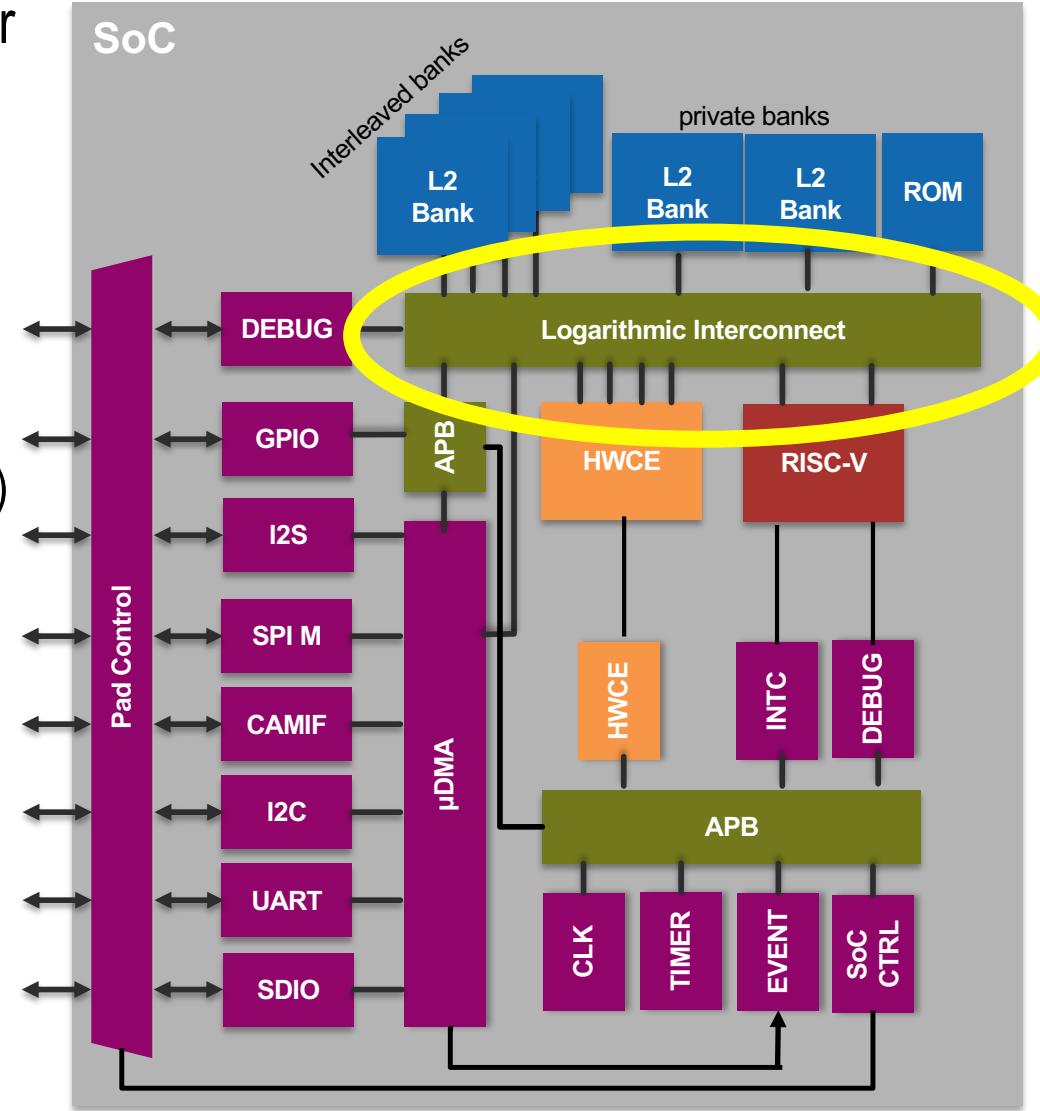
- Trace file (build/pulpissimo/trace_core_1f_0.log):

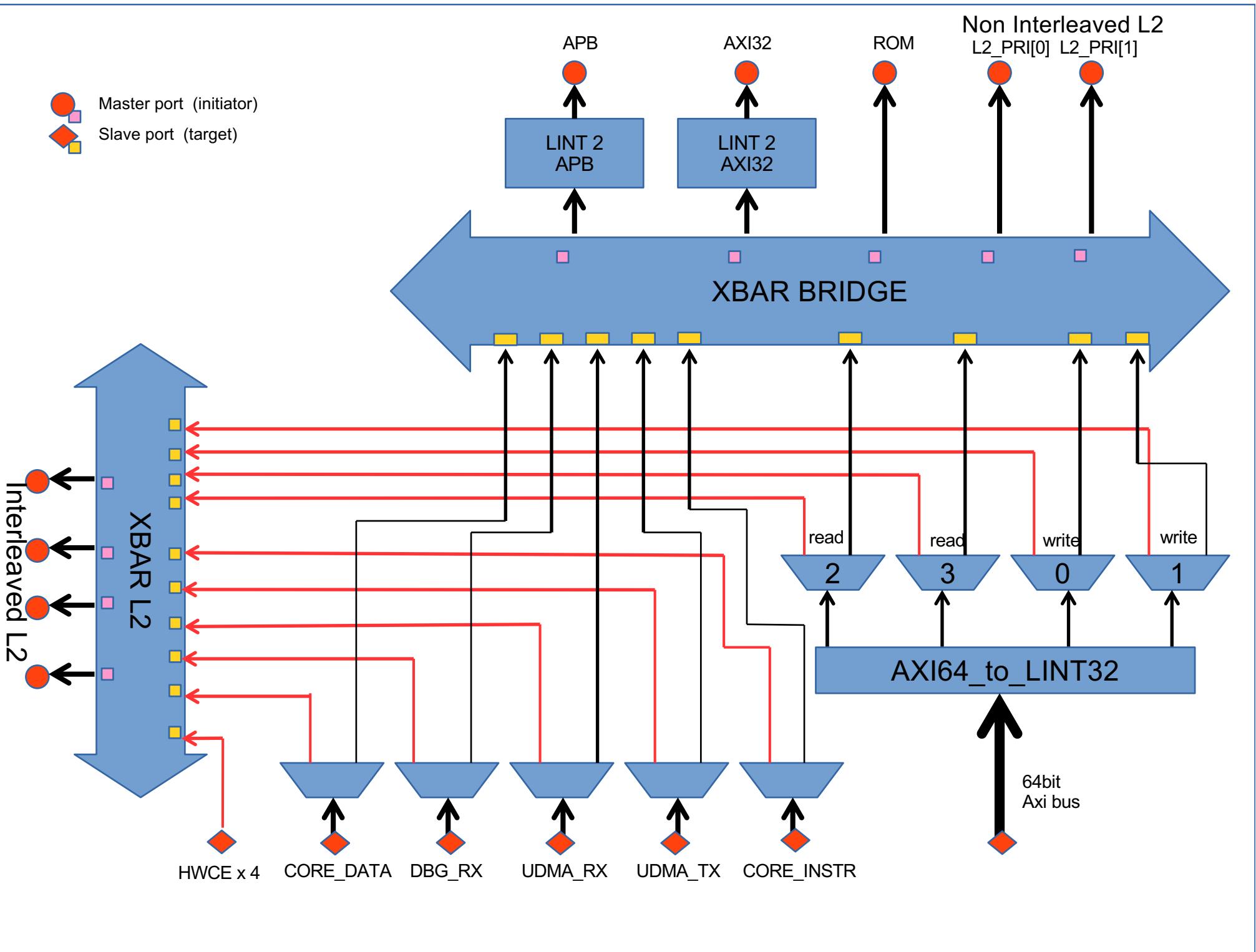
Time	Cycles	PC	Instr	Mnemonic		
18880000	455	00000080	00c0006f	jal	x0, 12	
18960000	457	0000008c	30501073	csrrw	x0, x0, 0x305	
19000000	458	00000090	00000093	addi	x1, x0, 0	x1=00000000
19040000	459	00000094	00008113	addi	x2, x1, 0	x2=00000000 x1:00000000
19080000	460	00000098	00008193	addi	x3, x1, 0	x3=00000000 x1:00000000
19120000	461	0000009c	00008213	addi	x4, x1, 0	x4=00000000 x1:00000000
19160000	462	000000a0	00008293	addi	x5, x1, 0	x5=00000000 x1:00000000
19200000	463	000000a4	00008313	addi	x6, x1, 0	x6=00000000 x1:00000000
19240000	464	000000a8	00008393	addi	x7, x1, 0	x7=00000000 x1:00000000
19280000	465	000000ac	00008413	addi	x8, x1, 0	x8=00000000 x1:00000000
19320000	466	000000b0	00008493	addi	x9, x1, 0	x9=00000000 x1:00000000
19360000	467	000000b4	00008513	addi	x10, x1, 0	x10=00000000 x1:00000000

Hybrid Logarithmic Interconnect

PULPissimo Architecture

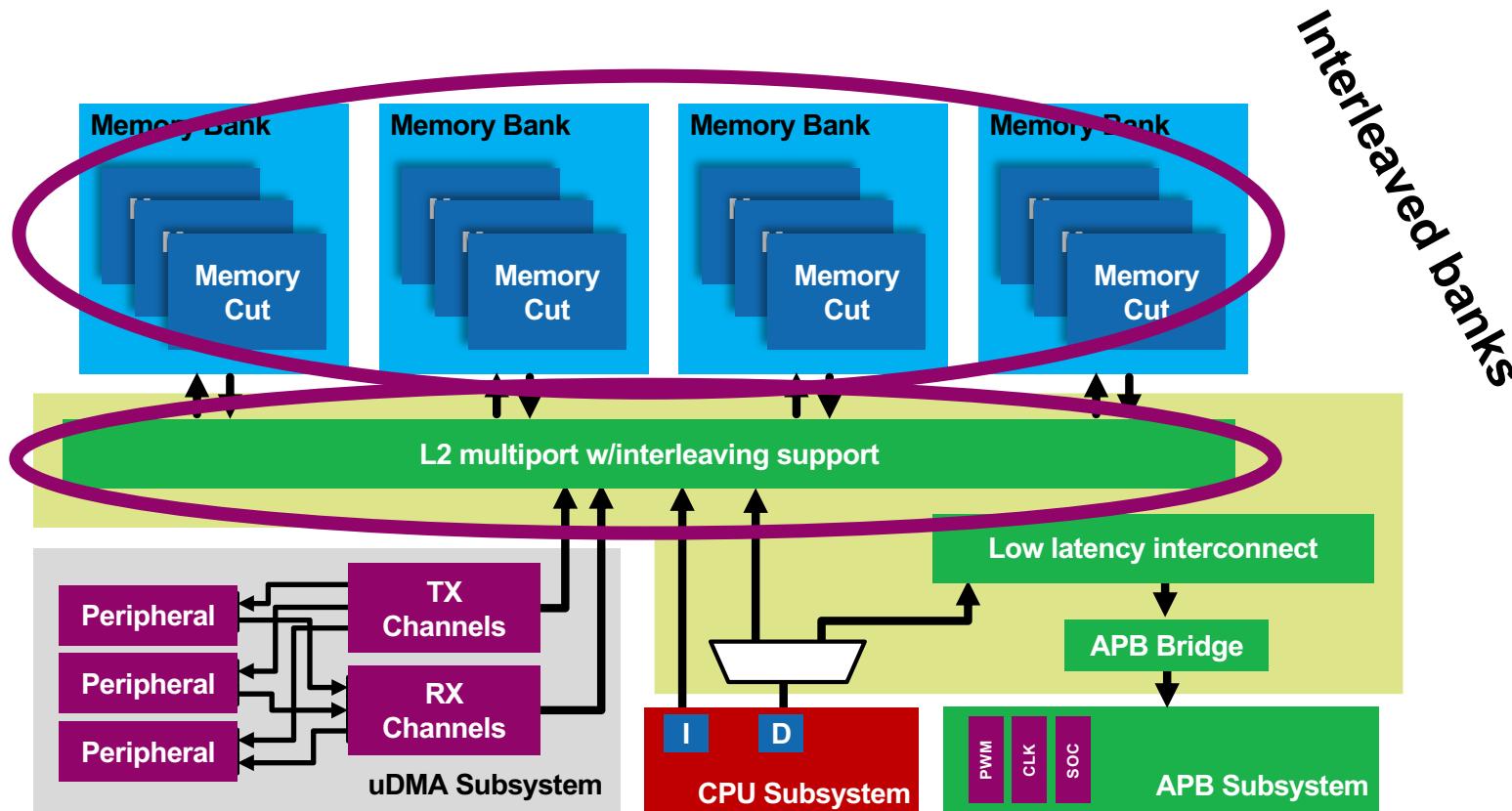
- RISC-V based advanced microcontroller
 - 512kB of L2 Memory
 - 16kB of energy efficient latch-based memory (L2 SCM BANK)
- Rich set of peripherals:
 - QSPI (up to 280 Mbps)
 - Camera Interface (up to 320x240@60fps)
 - I2C, I2S (up to 4 digital microphones)
 - JTAG (Debug), GPIOs,
 - Interrupt controller, Bootup ROM
- Autonomous IO DMA Subsystem (μ DMA)
- Power management
 - 2 low-power FLLs (IO, SoC)



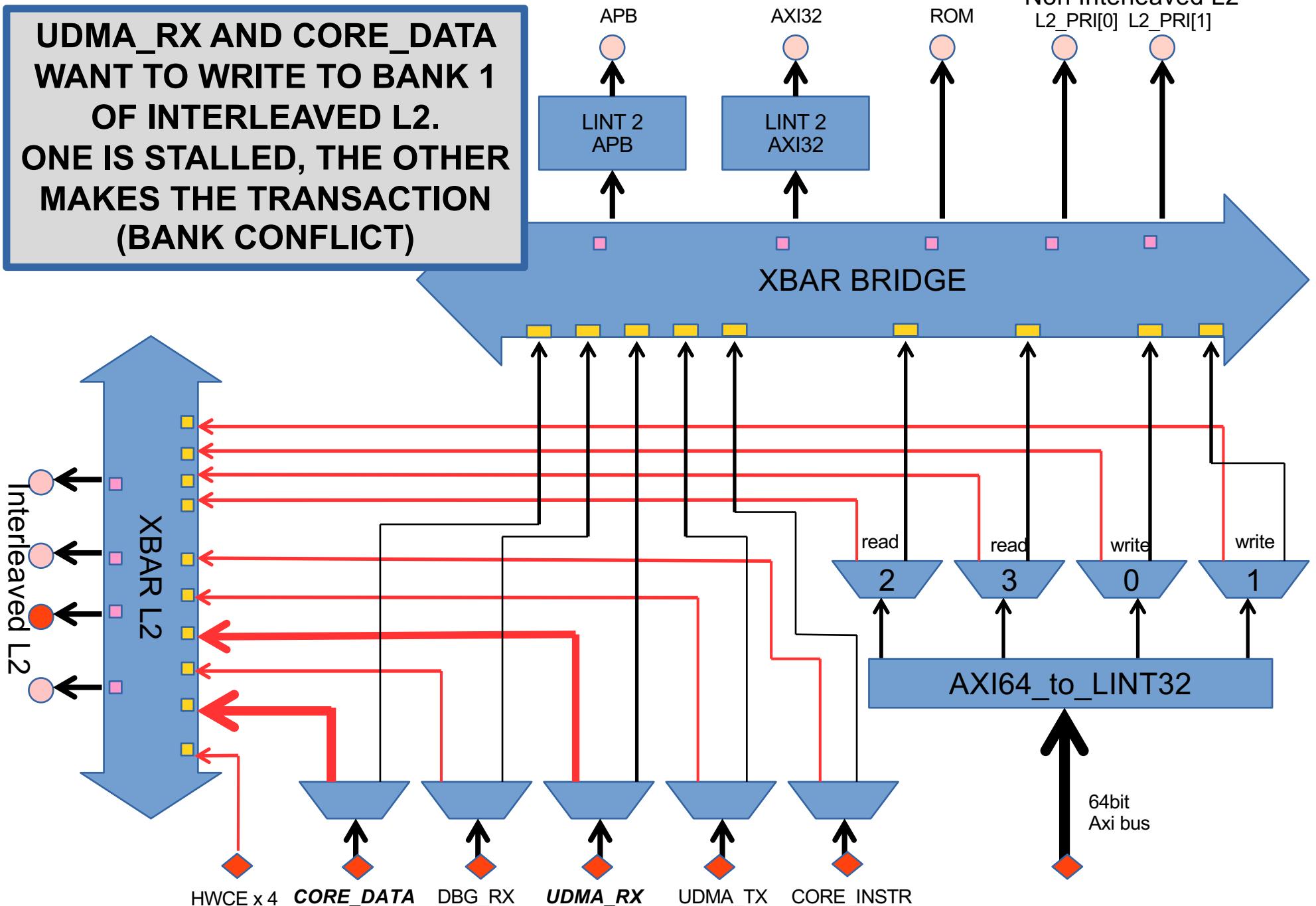


Interconnect performance

- Low latency interconnect with word level interleaving to reduce contention
- 4 PORT memory capable of handling maximum BW of $4 \times 32 \times \text{Freq}$
- High performance plugs to the processing subsystem



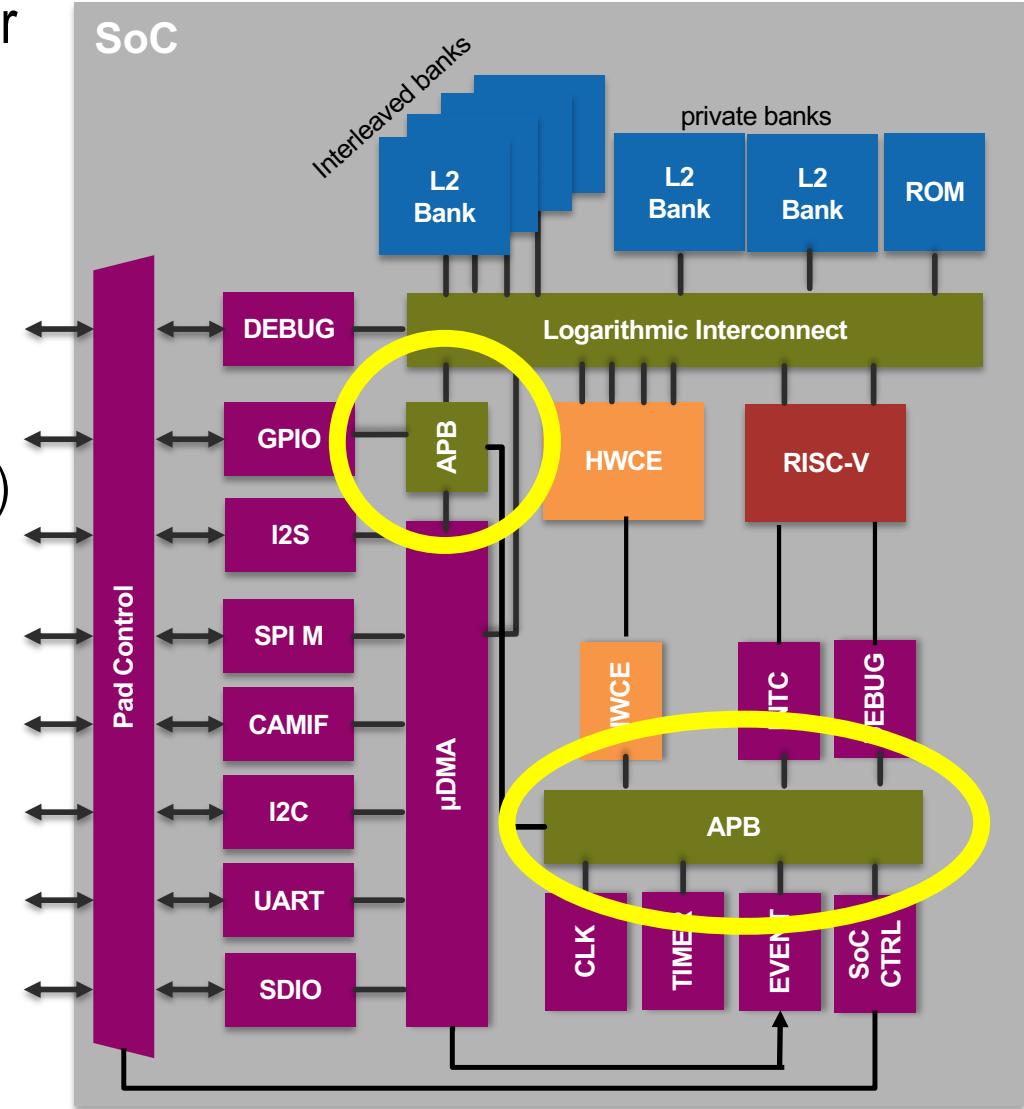
**UDMA_RX AND CORE_DATA
WANT TO WRITE TO BANK 1
OF INTERLEAVED L2.
ONE IS STALLED, THE OTHER
MAKES THE TRANSACTION
(BANK CONFLICT)**



Peripheral Interconnect

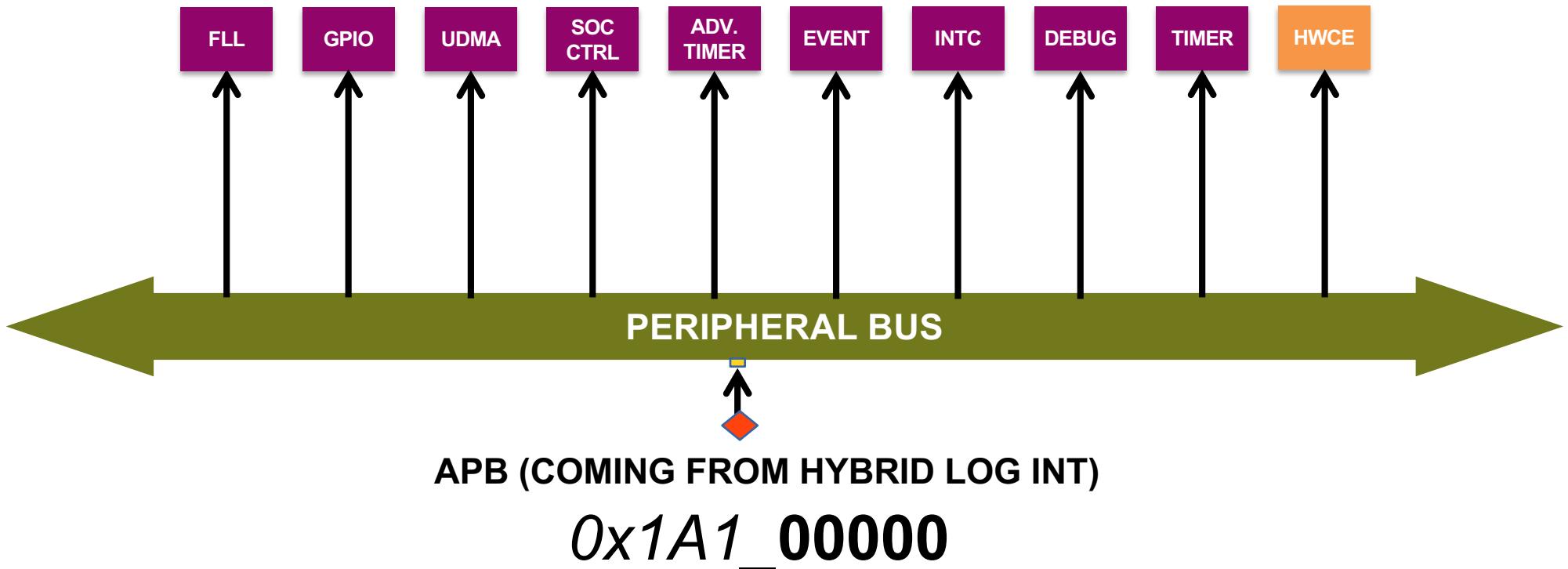
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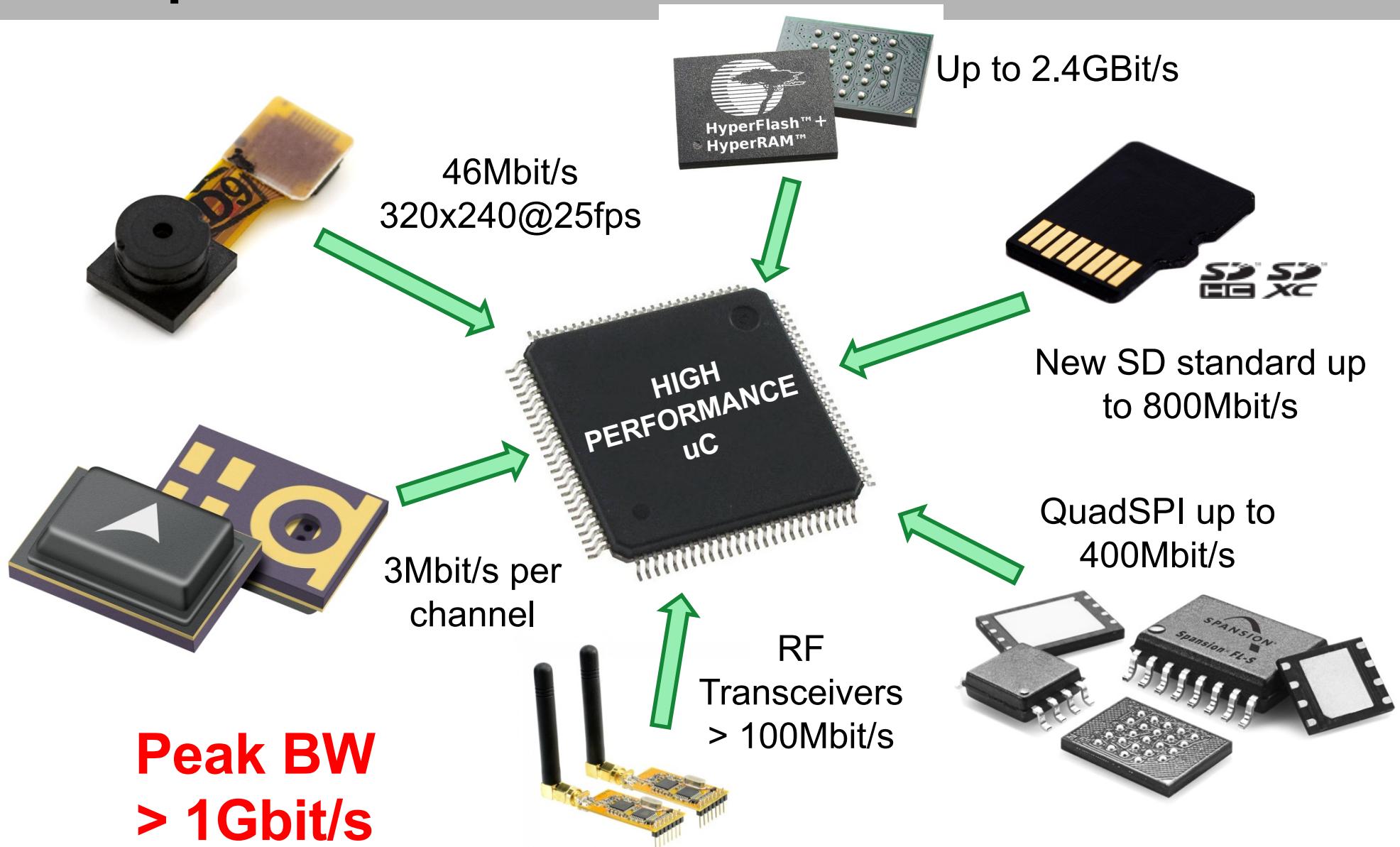
Peripheral Bus

Only one APB request! If more, stalled in the HYBRID LOGARITMIC INTERCONNECT (AS BANK CONFLICT)



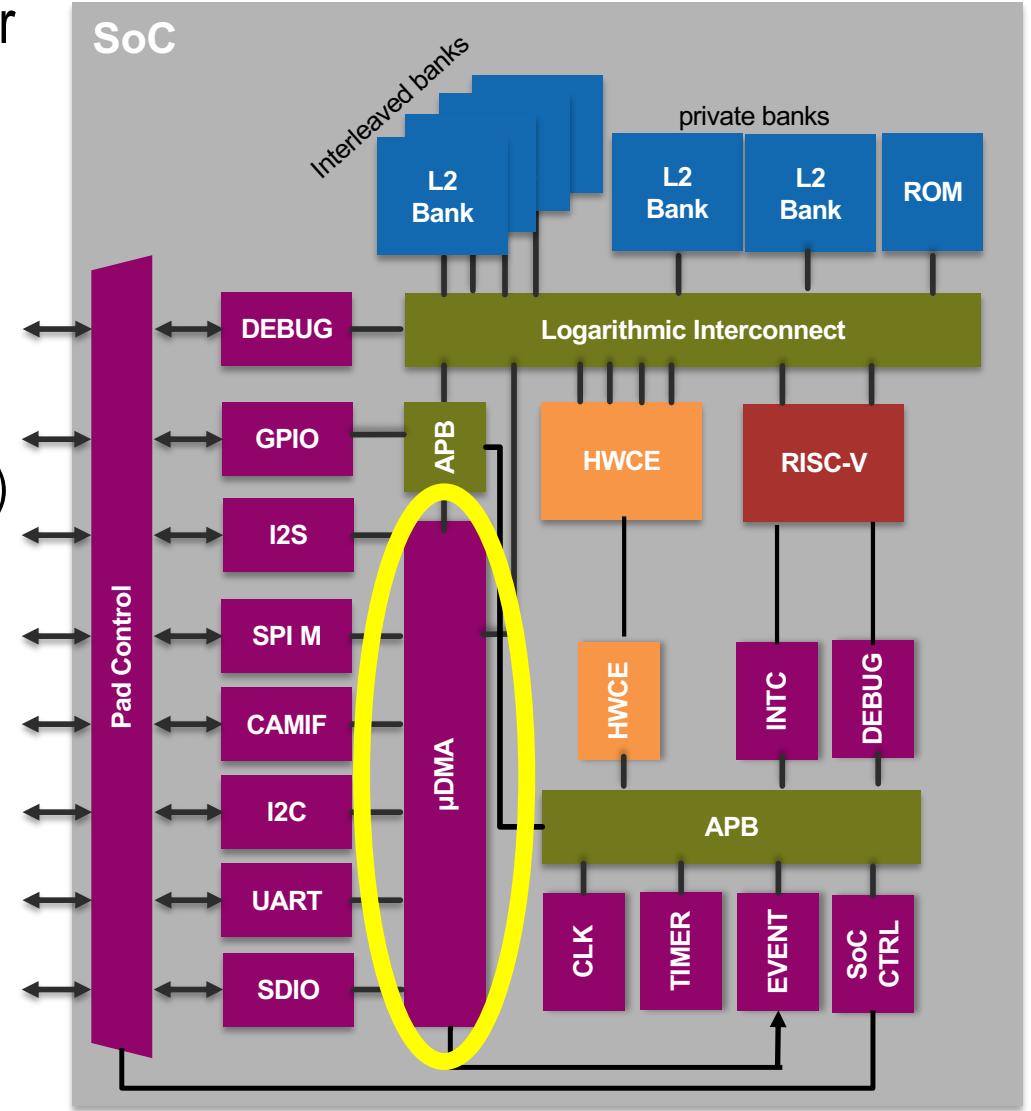
µDMA: An Autonomous I/O Subsystem

I/O requirements

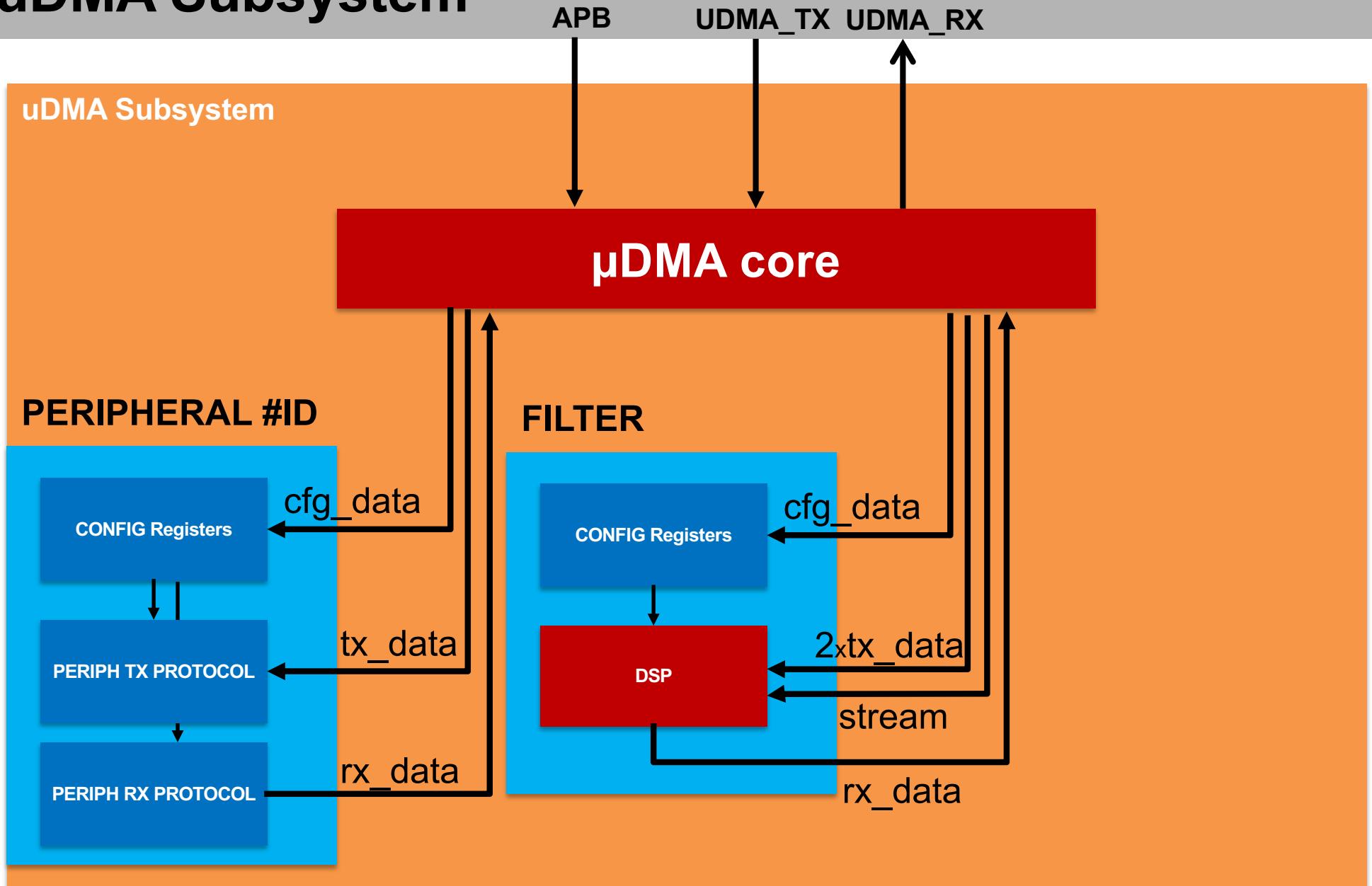


PULPissimo Architecture

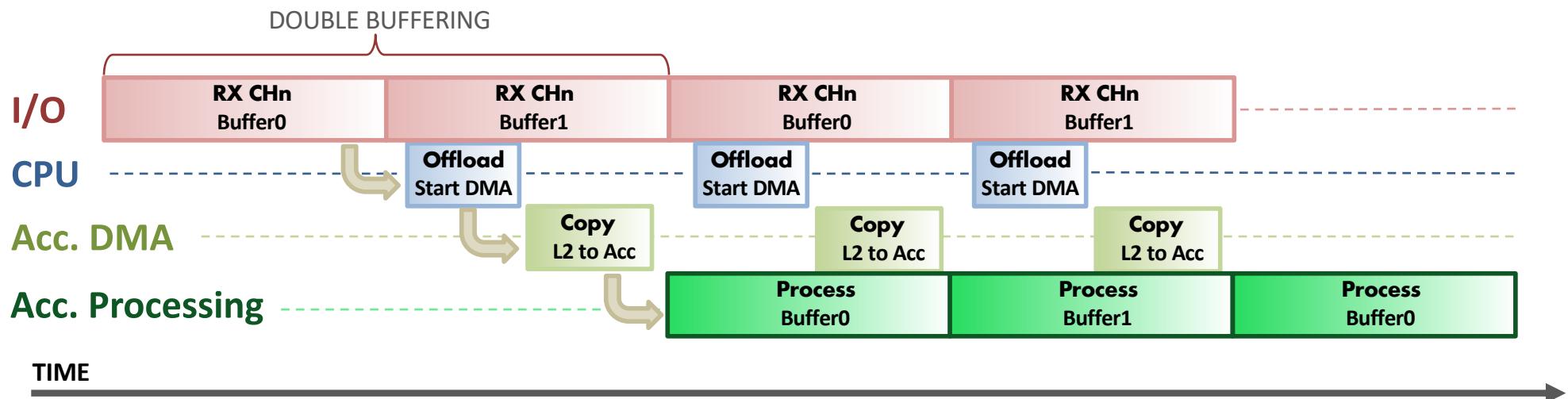
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uDMA Subsystem



Offload pipeline

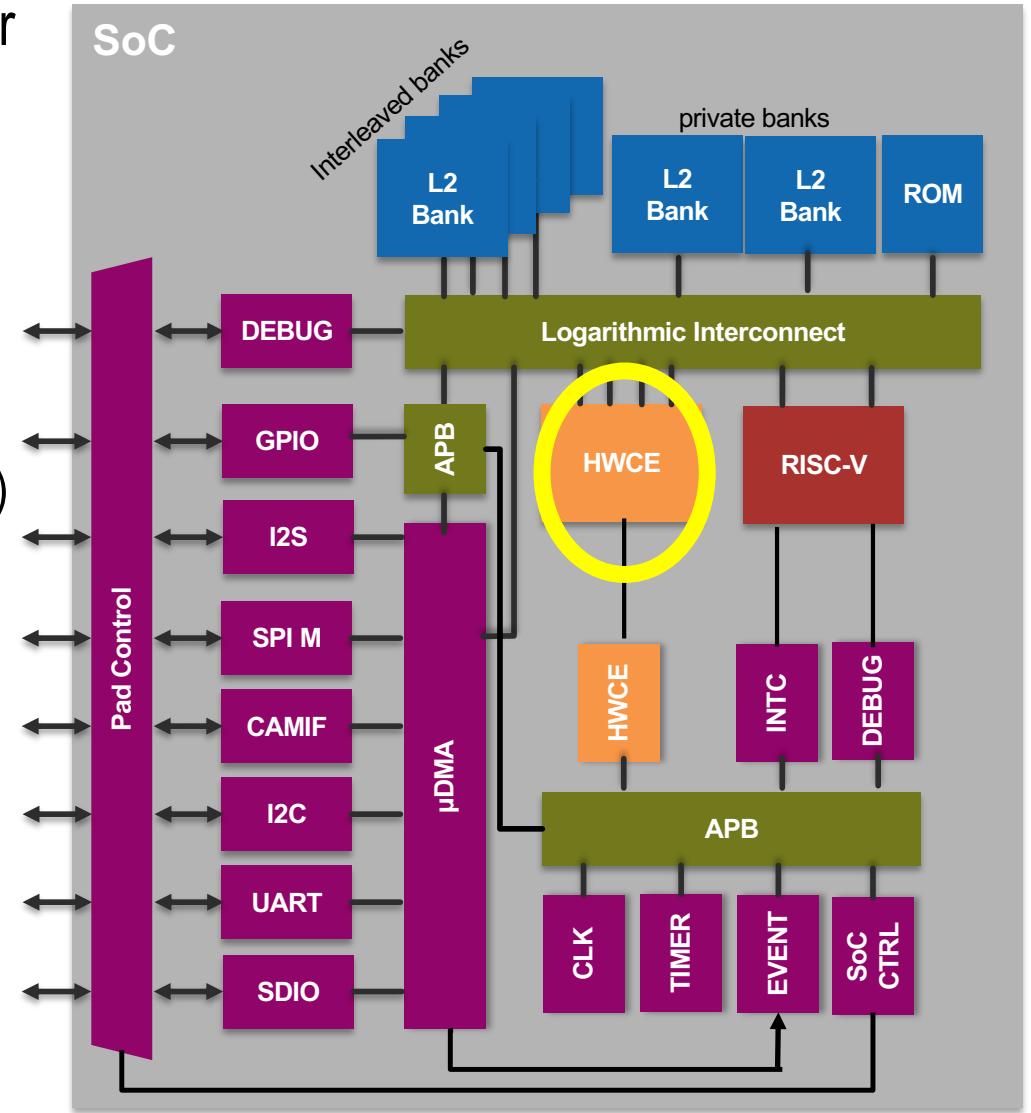


- Efficient use of system resources
- HW support for double buffering allows continuous data transfers
- Multiple data streams can be time multiplexed

Hardware Accelerator for Neural Networks

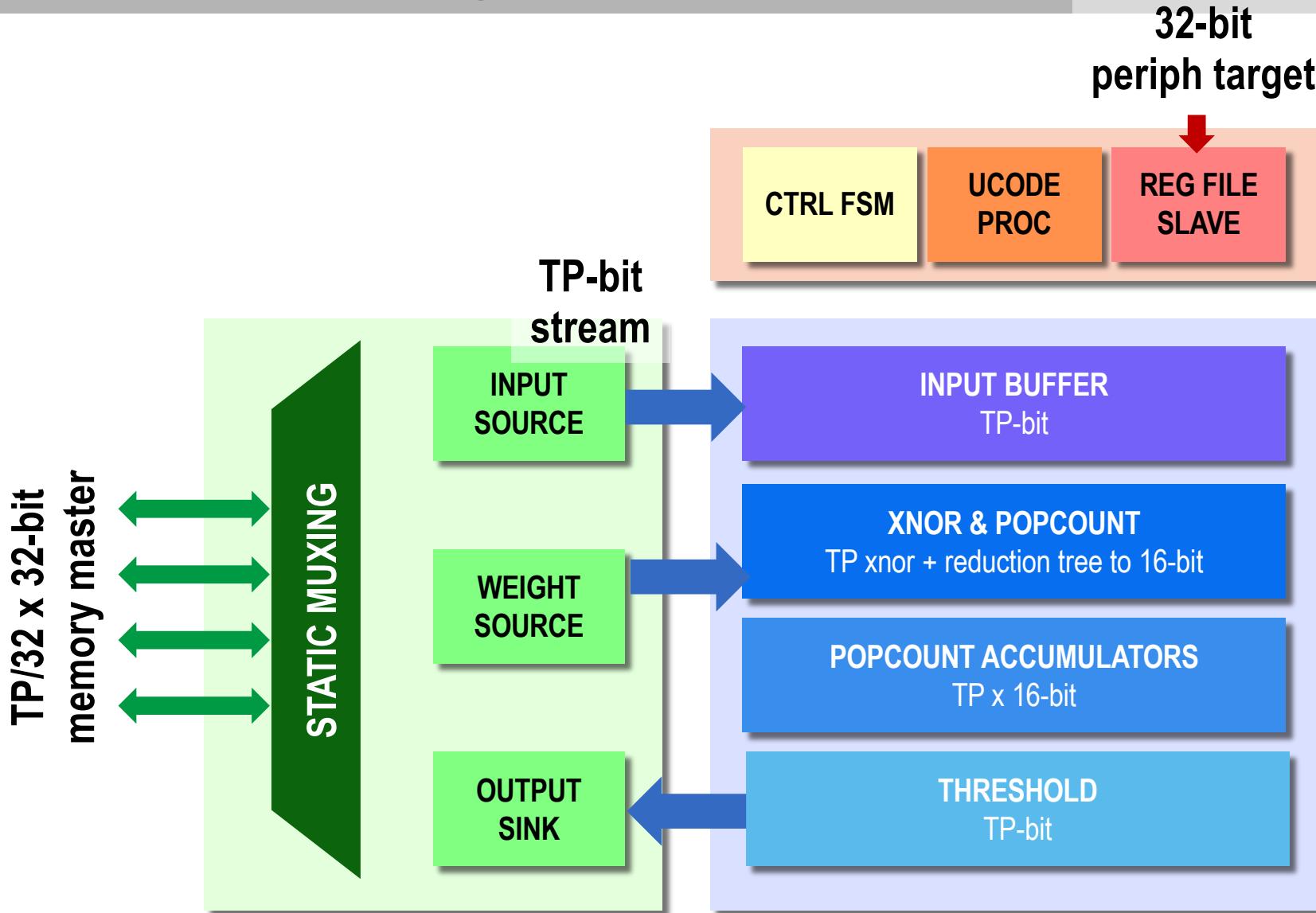
PULPissimo Architecture

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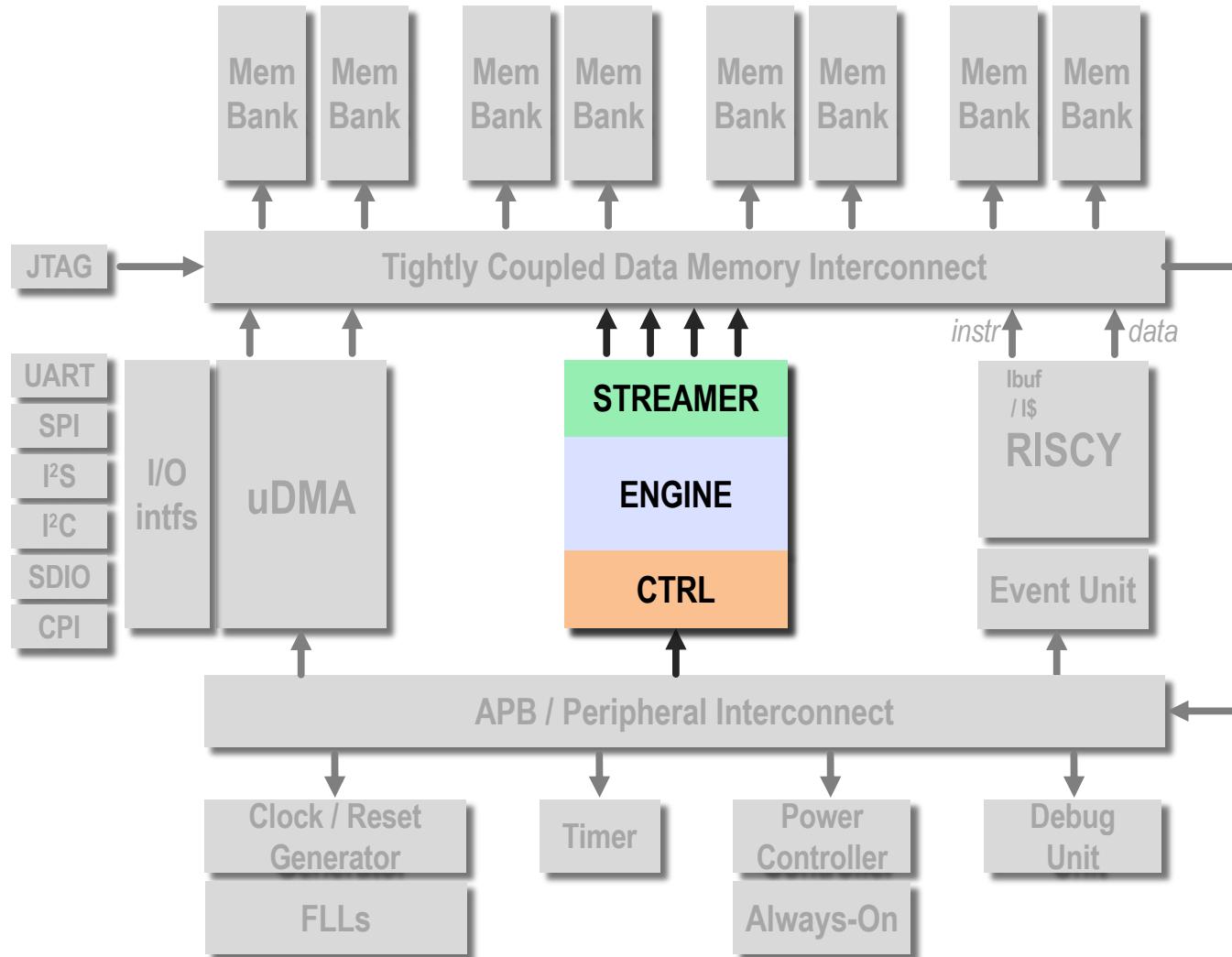


XNOR Neural Engine

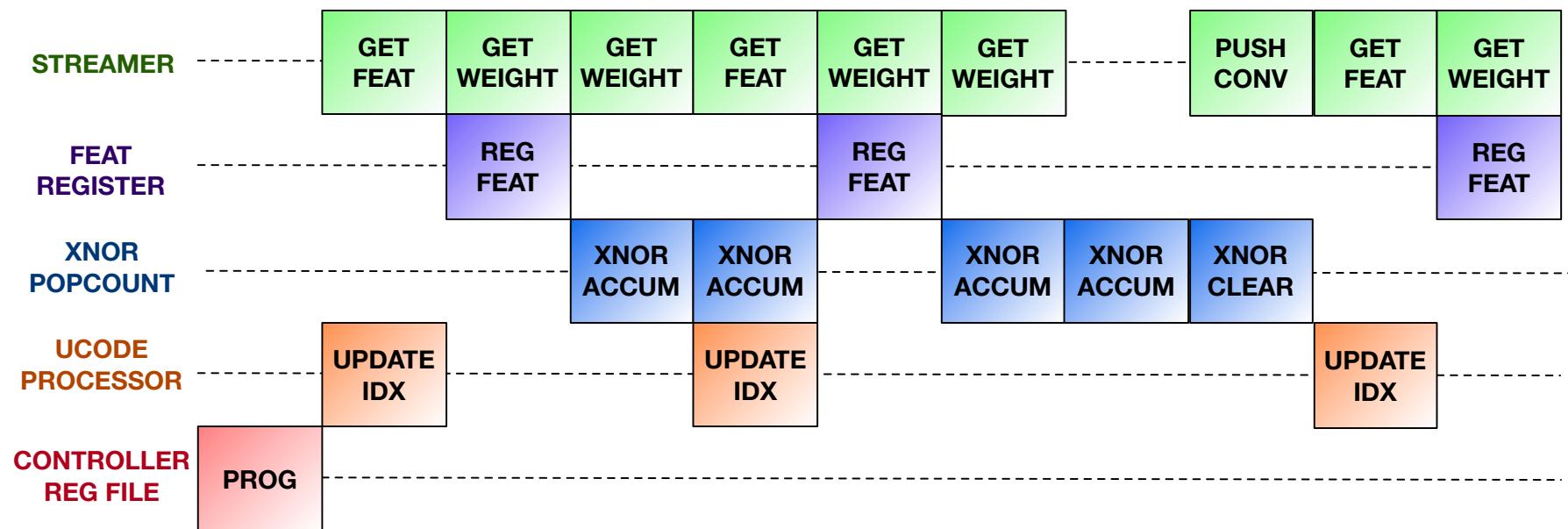
1. Motivation
2. BNNs
3. Architecture
4. Results



XNOR Neural Engine in PULPissimo



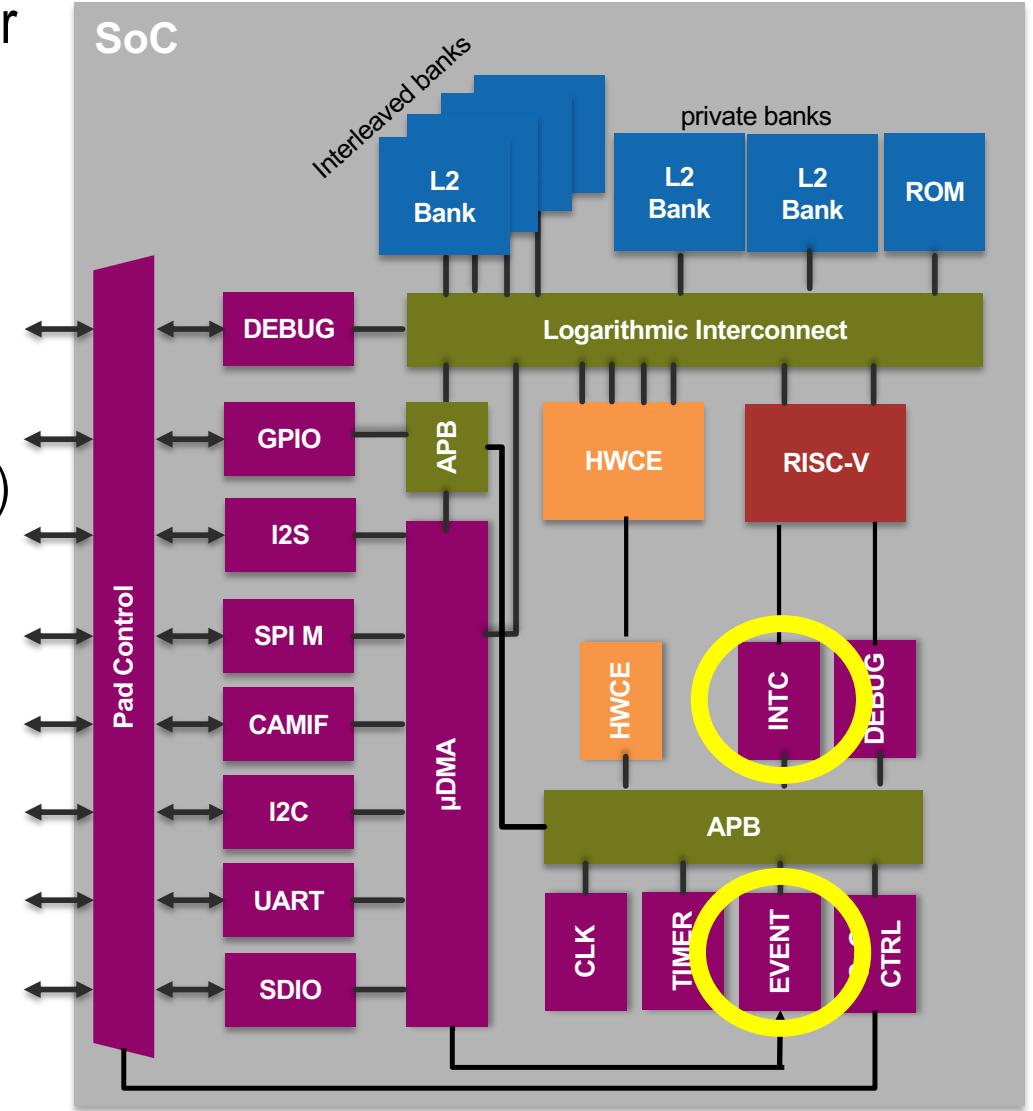
Operation in time



Interrupt Controller and Event Generator

PULPissimo Architecture

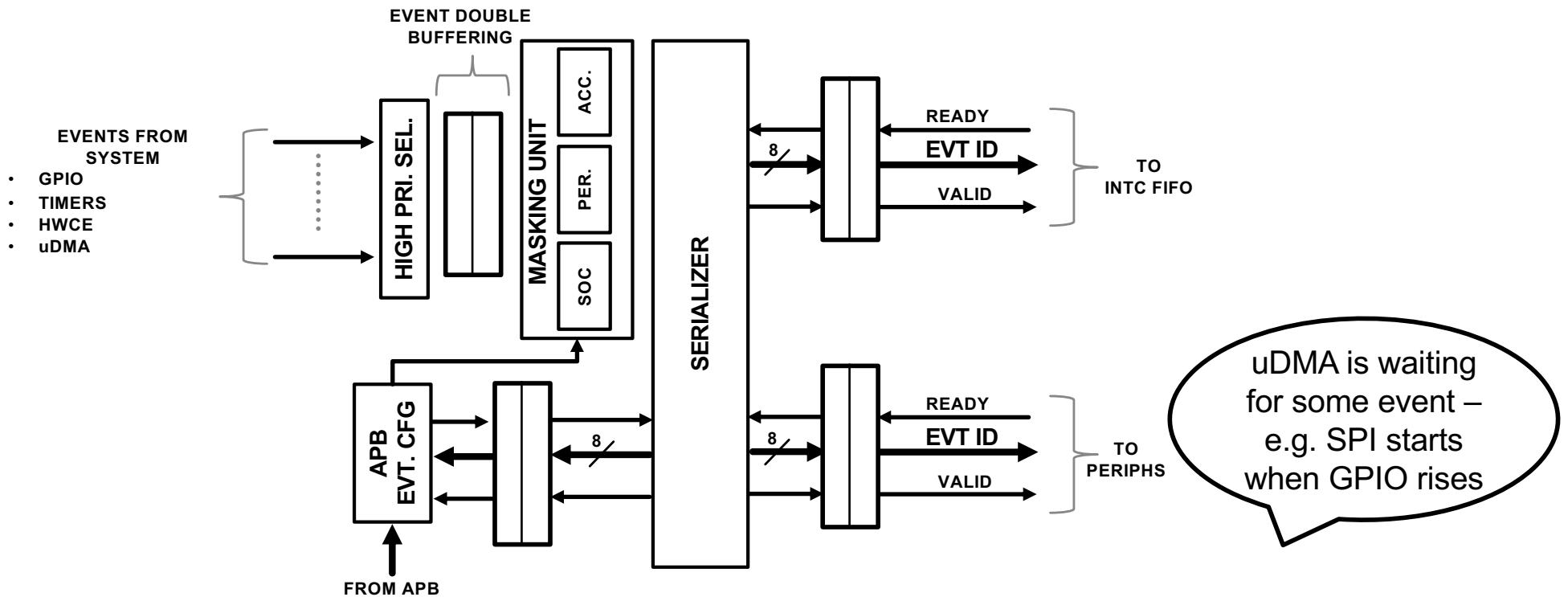
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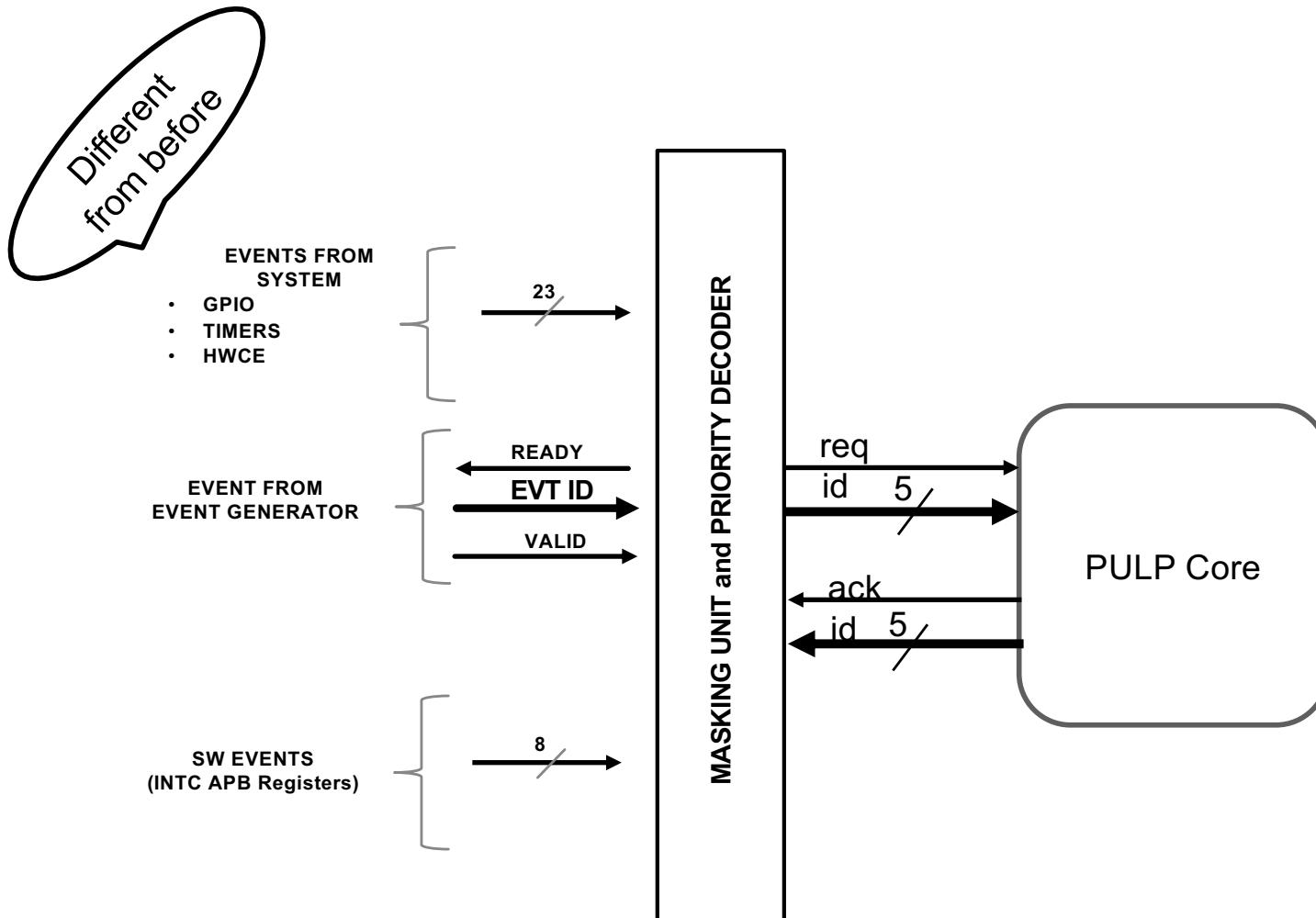
PULP interrupts controller (INTC)

- It generates interrupt requests from 0 to 31
- Mapped to the APB bus
- Receives events in a FIFO from the SoC Event Generator (i.e. from peripherals)
 - Unique interrupt ID (26) but different event ID
- Mask, pending interrupts, acknowledged interrupts, event id registers
- Set, Clear, Read and Write operations by means of load and store instructions (memory mapped operations)
- Interrupts come from:
 - Timers
 - GPIO (rise, fall events)
 - HWCE
 - Events i.e. uDMA

PULP Event Generator (EVENT)



Interrupts Source



TestBench

PULP TestBench

- It reads the compiled file (ADDRESS – INSTRUCTION)
- It sets with JTAG configuration registers
- It loads via JTAG the compiled file into the memory
- It writes to the FETCH_ENABLE register in the APB (Soc Control)
 - Now the core starts running the application
- It waits for the END-OF-COMPUTATION bit
 - When the core returns from the “main” function, it writes to a specific memory location in the APB (SoC Control) the word “1XXX_XXXX”, where 1 indicates the core finished its program and XXX_XXXX is the returned value (e.g. “**return 0;**”)
- It reports an error if XXX_XXXX is not 0

HANDS-ON



PULPissimo on GitHub

- PULPissimo is available @ <https://github.com/pulp-platform/pulpissimo>
- `git clone git@github.com:pulp-platform/pulpissimo.git`

This screenshot shows the GitHub repository page for the PULPissimo project. The repository name is `pulp-platform / pulpissimo`. The top navigation bar includes options for Unwatch (31), Unstar (64), Fork (22), and Insights. Below the navigation, there are links for Code, Issues (9), Pull requests (0), Projects (0), Wiki, Security, and Insights. A summary bar at the top provides metrics: 176 commits, 18 branches, 6 releases, 7 contributors, and a View license link.

This is the top-level project for the PULPissimo Platform. It instantiates a PULPissimo open-source system with a PULP SoC domain, but no cluster.

The repository page lists the following commits:

Commit	Message	Date
bluewww	Restructure different tb modes and readd support for flash boot	9 days ago
doc	fixed datasheet	10 months ago
rtl	Restructure different tb modes and readd support for flash boot	9 days ago
setup	First commit of the new PULPissimo microcontroller, have fun! The PUL...	a year ago
sim	Updated boot code so that it stops if bootsel is 1	2 months ago
LICENSE.md	First commit of the new PULPissimo microcontroller, have fun! The PUL...	a year ago

Dependencies

- “*ips_list.yml*” holds the needed sub-IPs.
- “*update-ips*” to download them
- *iptools* downloads the IPs recursively
- *iptools* generates compilation scripts and [synthesis] scripts
- “*ips*” folder contains downloaded IPs
- “*rtl*” folder contains PULPissimo RTL, testbench, etc

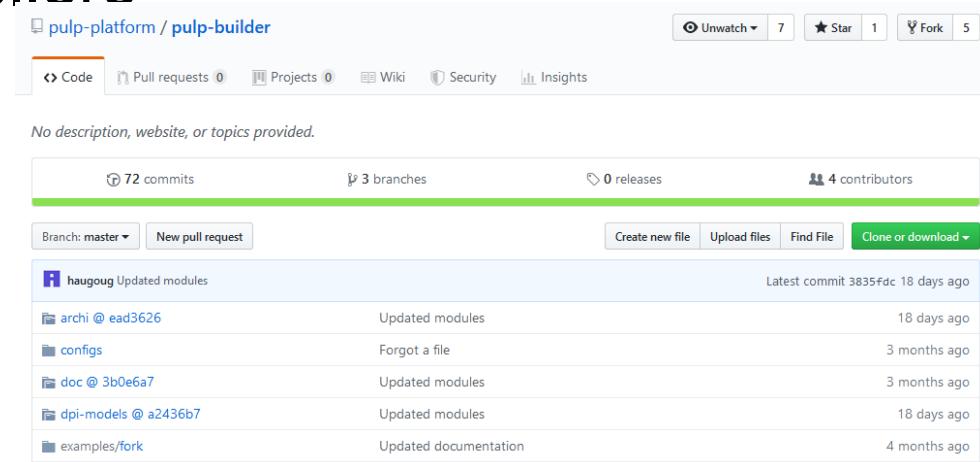
PULP IPs

- Every IP is a different GIT repository
 - Easier to maintain and creates little mess on many-people projects
 - Every IP has one or more maintainers of the PULP group
- “*src_files.yml*” for each IP to list the RTL files
 - used to generate scripts, modelsim library names, options, etc
- PULPiSSIMO IPs are also available on GitHub
- *make sdk* to download and install the PULP SDK



PULP SDK

- The SDK contains all the tools and runtime support for PULP based microcontrollers



- The SDK contains from low-level bare-metal procedure for setting the PULP cores and peripherals (e.g. crt0) all the way up to a set of higher level functions (API) to help applications developers to leverage all the supported features



Environment Variable

- *VSIM_PATH* points to your *pulpissimo/sim* folder
 - Execute make clean lib build opt
- *PULP_RISCV_GCC_TOOLCHAIN* to your bin folder of the PULP GCC

Compile & Simulate PULP

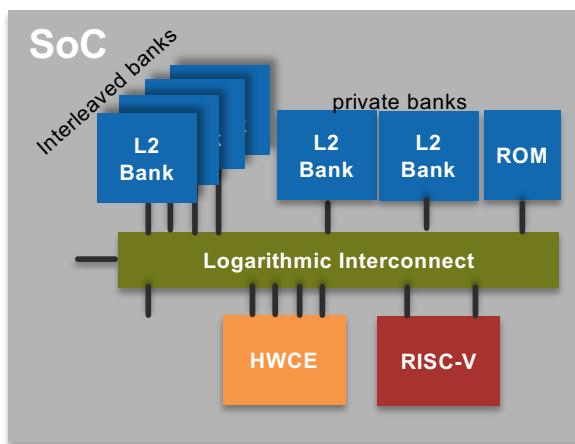
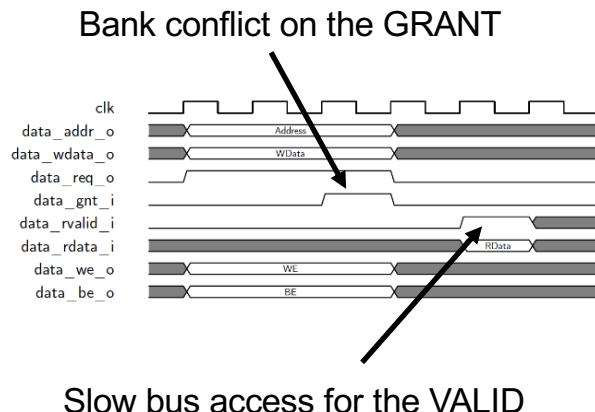
- PULP compilation and simulation scripts and flow are based on *modelsim*
 - **To compile**
 - *cd pulpissimo/sim*
 - *make clean lib build opt*
 - **To execute an application**
 - *cd yourapplicationfolder*
 - *make clean all (to compile it)*
 - *make dis > dis.s (to generate the object dump)*
 - *make run gui=1 (to run modelsim with GUI)*
 - *make run*
 - **Assembler, Simulation Trace and Performance counter to analyze performance**

Programming PULP

- When programming for embedded system, the very first thing that should come to your mind is
 - LIMITED RESOURCES
 - It is completely different to write application for your personal PC than a microcontroller
 - You MUST know the total memory available, the architecture, the instructions of the core etc
 - In the context of embedded programming, you have the possibility to finely optimize all the SW stack to leverage your HW at the best
- Some tips are coming 😊

The C->ASM->MONITOR Loop

- When you write your C program, you must have in mind many things:
 - Where are my DATA? In which BANK? Will I have BANK conflicts? With whom?
 - Where are my instructions? In which BANK? Will I have BANK conflicts? With whom?
 - → This tells you whether you will have stalls from outside due to the system rather than the program per se, yet it is very important to know



- Core data stack in L2 Private Bank0
- Instructions in L2 Private Bank1
- HWCE data in L2 interleaved

None of the master ports in the Log. Interconnect Will create bank conflicts 😊

The C->ASM->MONITOR Loop

- When you write your C program, you must have in mind many things:
 - What is the ISA of my core?
 - Is my kernel (e.g. MatMul) using all the instructions of my ISA in an optimized way?
 - You check this by generating the assembler and double check the instructions.
Try to reverse what the compiler did as see whether you can do better or not
 - If not, you can use builtins or asm volatile statements to force the use of some instructions! (Or rewrite properly the C code)

```
...  
lp.setup x1,a4,stop1  
p.lbu a0,1(a3!)  
p.lbu a1,1(a2!)  
stop1: p.mac a5,a0,a1  
....
```

```
... //iterate #COL/4  
lp.setup x1,a6,stop1  
p.lw a1,4(t1!)  
p.lw a5,4(t3!)  
stop1: pv.sdotsp.b a7,a1,a5  
....
```

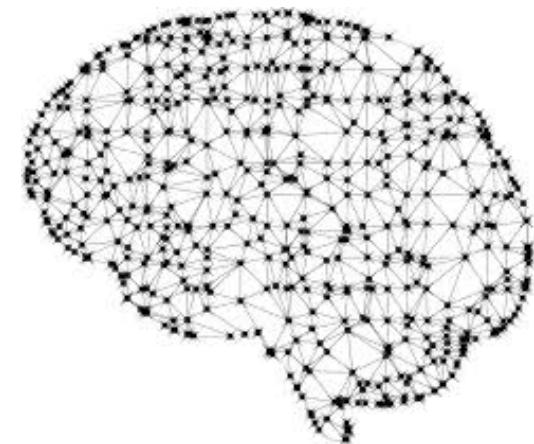
I am a
cool GUY

The C->ASM->MONITOR Loop

- When you write your C program, you must have in mind many things:
 - What are the performance I should expect?
 - Can I achieve that performance? Why?
 - If I don't have a clue, I should open the waveform and see where the stalls are coming from
 - How can I solve it? → Back to writing CODE (e.g. loop unrolling)

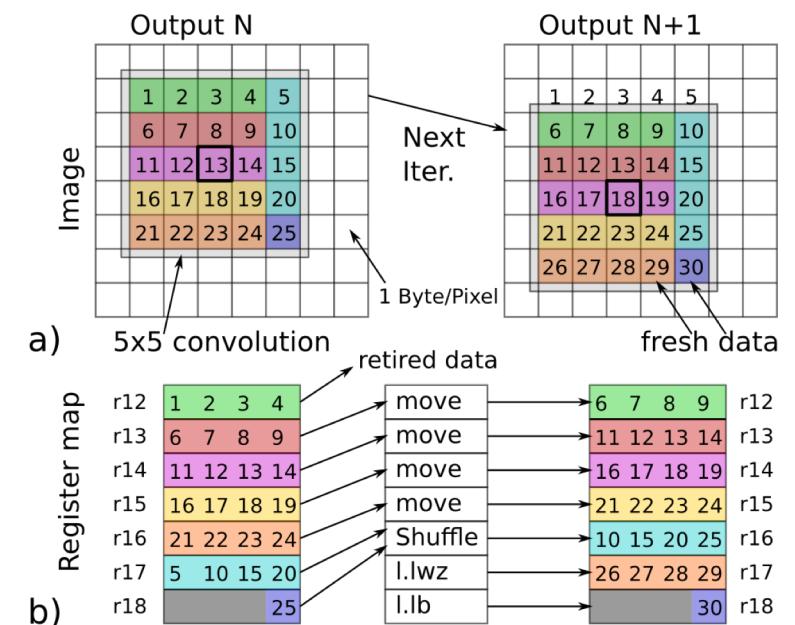
Hands-On → The Dot Product

- The dot product is an extremely common kernel in Artificial Intelligence operations
 - **RISCV extensions to achieve top performance**
 - **We are going to see**
 - *Optimized assembly code that uses*
 - *the MAC instruction*
 - *Zero-overhead HW-Loop*
 - *Automatic increment load/store*
 - *Loop unrolling to eliminate stalls*
 - *Optimized code that uses the SIMD extensions*



Hands-On → The 2D Convolution

- The 2D Convolution is the central kernel of Convolutional Neural Network
 - RISCV extensions to achieve top performance
 - We are going to see
 - Optimized C code that uses
 - gcc vectors
 - the shuffle instruction
 - the dot product
 - normalization and clip



Thanks a lot

- Thanks a lot for your attention
- I hope you enjoyed it ☺
- Get ready for the Hands On session

