

# SRAM Compute-in-Memory Macro with Dual-Dataflow Architecture for Efficient Support of Multi-Modal Transformers and CNNs

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**Abstract**—This work presents a SRAM compute-in-memory macro with a dual-dataflow architecture that enables both uninterrupted static and dynamic-input matrix multiplication and accumulation (MAC) for the first time. This uniquely eliminates the traditionally heavy inter-bank load/store overhead of dynamic MACs in all prior SRAM art, where one of the two operands is required to statically reside into the array. The dual-dataflow architecture efficiently supports both CNNs and (multi-modal) transformers.

Unified and efficient static and dynamic MACs are enabled by the proposed 1) reset-less in-bitcell Boolean computations, 2) hybrid-domain accumulator, 3) concurrent write/compute. A 28-nm 160-kb SRAM testchip shows a competitive energy efficiency of up to 138.2 (30.5) TOPS/W for 8-bit integer S-MAC (D-MAC) at full output precision.

**Keywords**—AI, compute-in-memory, transformer models.

## I. INTRODUCTION

SRAM compute-in-memory (CIM) enables sizeable energy efficiency improvements in AI systems, thanks to superior data locality enforcement [1]. However, even in SRAM macros the latter is not preserved under workloads requiring frequent data updates and inter-bank load/store. Indeed, workloads in CNNs and attention vector/matrix computation in transformers are naturally supported by static MACs (S-MAC, Fig. 1) with weights being statically stored. Conversely, attention score computation in transformers involves dynamic MACs (D-MAC) where both inputs need to change at every new computation.

Prior SRAM compute-in-memory macros perform only S-MACs, negating true data locality in D-MACs and full bank utilization for computations due to the need for

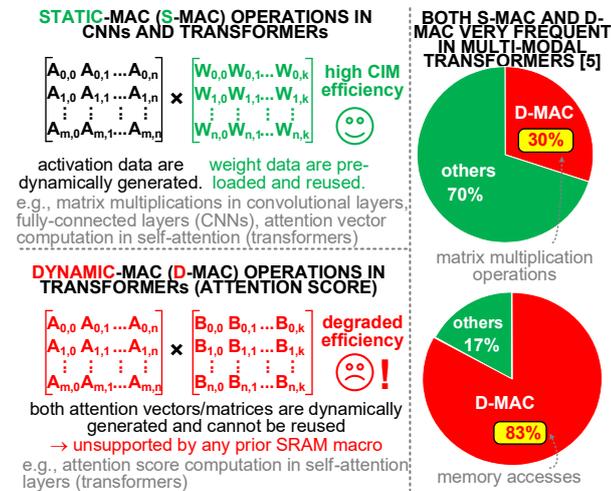


Fig. 1. Motivation for compute-in-memory designs with dual-dataflow architecture to efficiently support both static MAC (S-MAC) and dynamic MAC (D-MAC) operations in CNNs and transformers.

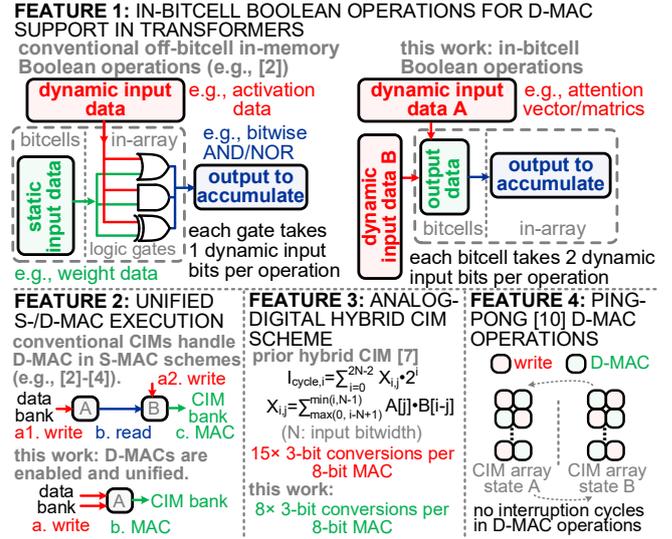


Fig. 2. Limitations in prior SRAM compute-in-memory architectures, innovation and advances enabled by the proposed SRAM CIM architecture.

preliminary load (i.e., static storage) of 1) one input into the array performing the computation, 2) the other input on another bank [2]. Though transposable buffer/CIM can partially mitigate such overhead [2], recent SRAM designs still execute D-MACs by repurposing S-MAC schemes, inevitably introducing extra interruptions and energy overheads (generally not included in prior energy efficiency evaluations) due to reloads [3], [4]. In key models such as multi-modal transformers, both S- and D-MACs substantially contribute to system energy and throughput, in view of their comparable number of operations (e.g., 30% D-MAC in [5]) and dominant memory accesses (e.g., 83% memory accesses in attention score [5]). This motivates the introduction of a dual-dataflow architecture that efficiently supports both S- and D-MACs, posing three challenges: 1) mitigate energy in data update/read/transfer, 2) reduce area overhead of S- and D-MAC unification, 3) reduce system interruption cycles.

This work introduces an input-versatile CIM with dual-dataflow architecture (Fig. 2), as enabled by: 1) in-bitcell 1-bit Boolean computations to support D-MAC, while suppressing the energy cost and the interruption cycles of conventional reset, 2) unified S- and D-MAC support for efficient and flexible workload execution, 3) analog-digital hybrid computation with competitive energy, 4) time-interleaved D-MAC for concurrent write/compute.

## II. PROPOSED ARCHITECTURE AND CIRCUIT TECHNIQUES

In the proposed architecture (Fig. 3), each CIM bank

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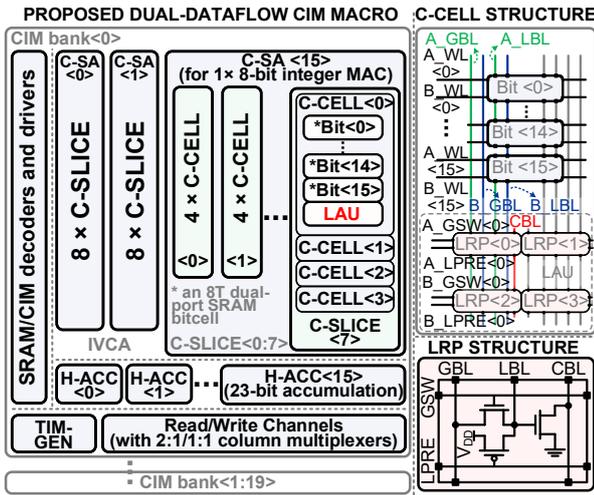


Fig. 3. Proposed dual-dataflow CIM architecture with input-versatile computing arrays (left), bitcell/circuit arrangement in a compute cell C-CELL (top-right), and local read port connections (bottom-right).

comprises an input-versatile computing array (IVCA), read and write channels with 2:1 and 1:1 column multiplexers, 16 hybrid accumulators (H-ACC), and a timing generator (TIM-GEN). The IVCA consists of 16 integer MAC computing sub-arrays (C-SA), each with 8 computing slices (C-SLICE). Each C-SLICE consists of 4 compute cells (C-CELL), each housing 16 bitcells and a local accumulation unit (LAU) containing 4 local read ports (LRP) for current accumulation.

In D-MACs (Fig. 4), each bank performs 8-bit unsigned integer multiplication/accumulation for two dynamic input streams. In *phase 1*, currently active C-CELLs in an IVCA compute in bitcell and store  $16 \times 8 \times 8$  1-bit multiplications (equivalent to 16 8-bit multiplications, see below) of a row (wordline) and a column-wise (bitline) input. The above 1-bit in-bitcell multiplications are based on 8T dual-port bitcells (e.g., [6]), which uniquely process two dynamic 1-bit inputs without pre-load/reset (Fig. 5). Reset-less Boolean operation is evidenced in Fig. 5, as the output depends only on the current inputs. The Boolean function (e.g., AND) is straightforwardly configured via simple bitline digital setting, eliminating extra routing and in-array e.g., gates [2]) or off-array extra resources (e.g., multipliers [7]). Since computation takes inputs directly from bitlines and

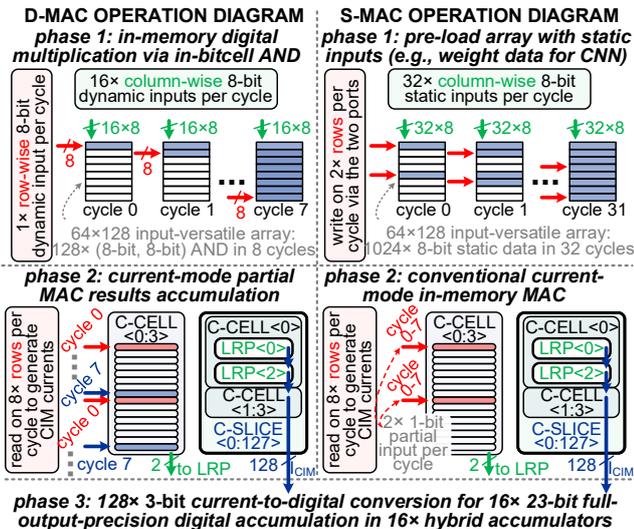


Fig. 4. Dual-dataflow operation: D-MACs (left) and S-MACs (right) are unified into the same macro. Reloads in conventional S-MACs repurposed for D-MACs are here eliminated (left).

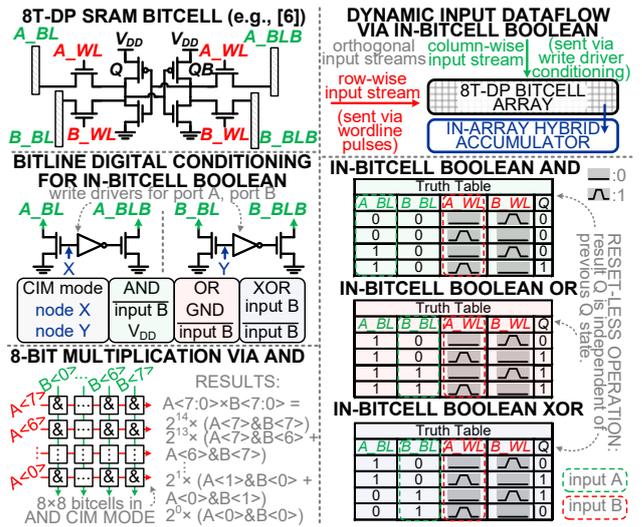


Fig. 5. Proposed in-bitcell Boolean computations, bitline digital conditioning in CIM mode (center-left), multiplication via in-bitcell AND (bottom-left), truth tables for in-bitcell computations (right).

wordlines, it suppresses inter-bank data transfers and array reloads, in contrast to prior CIMs (e.g., [2]-[4]). As opposed to prior in-bitcell Boolean operations [8], [9], the proposed reset-less operation avoids any interruption cycle, and drastically reduces bitcell bit-flips (i.e., energy), inducing high sparsity (e.g., 98% at 90% input sparsity for adopted AND). In *phase 2*, the 8 partial results from all 4 C-CELLs within 128 C-SLICES are accumulated by the LAUs in the form of cumulative compute-bitline current (CBL) for  $128 \times 8$  simultaneous accumulations/bank of partial results. In *phase 3*, the CIM currents are digitized in H-ACCs and then systolically aggregated into 23-bit MACs at full output precisions (Fig. 6).

In S-MACs (Fig. 4), each bank performs 8-bit unsigned integer MAC for one dynamic input stream with stationary weights. In *phase 1*, each C-CELL is conventionally pre-loaded with partial 1-bit stationary inputs. In *phase 2*, all C-CELLs perform two multiplications between two row-wise 1-bit partial dynamic inputs and two stationary 1-bit partial static inputs. Accumulated output currents are converted and aggregated in *Phase 3*.

In the array periphery, the efficient hybrid scheme in Fig. 6 suppresses ADC activity per MAC by  $1.8 \times$  over [7] by

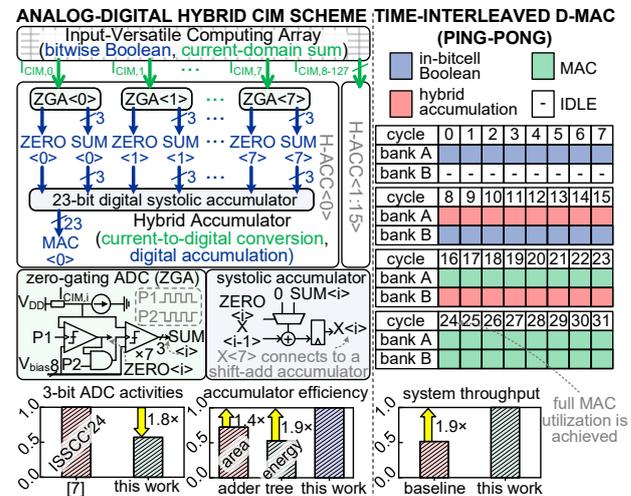


Fig. 6. Hybrid analog-digital accumulation (top-left), time-interleaved D-MACs via ping-pong scheduling (top-right), and comparison with prior baseline designs (conventional adder tree, no time interleaving, bottom).

accumulating 8 (instead of 1) partial multiplication results residing in same bit position. Periphery is pitch-matched to the minimum poly pitch of the bitcell. The 23-bit digital systolic accumulator (Fig. 6) improves area and energy efficiency by 1.9 $\times$  and 1.4 $\times$  compared with adder trees. Concurrent write/compute in D-MACs is enabled via ping-pong scheduling [10], improving throughput by 1.9 $\times$ .

### III. MEASUREMENT RESULTS

A testchip containing a 28-nm 20-bank SRAM macro with 160-Kb total capacity (Figs. 7-8) exhibits a compute (read) access time of 5 ns (2 ns) at  $V_{DD}$ =1.05 V for 8-bit integer S- and D-MACs with 128 accumulations into 23-bit full output precision, as shown in Fig. 9.

In S-MACs, state-of-the-art peak energy efficiency of 138.2 TOPS/W is achieved, improving prior art by 1.2-2.0 $\times$  [4], [7], [11], [13], [14]. In D-MACs, peak energy efficiency is 30.5 TOPS/W at typical 90% input sparsity. Fair comparison with prior CIM executing transformers [4] shows an energy efficiency improvement by 1.4 $\times$ . At the same time, the FoM used in [7] is improved by 1.3-2.0 $\times$  compared to [2], [4], [12], [14], which simply repurpose S-MACs due to D-MAC unavailability, while not reporting the additional load-store energy required. When accounting for the latter one (not needed in proposed dual-dataflow

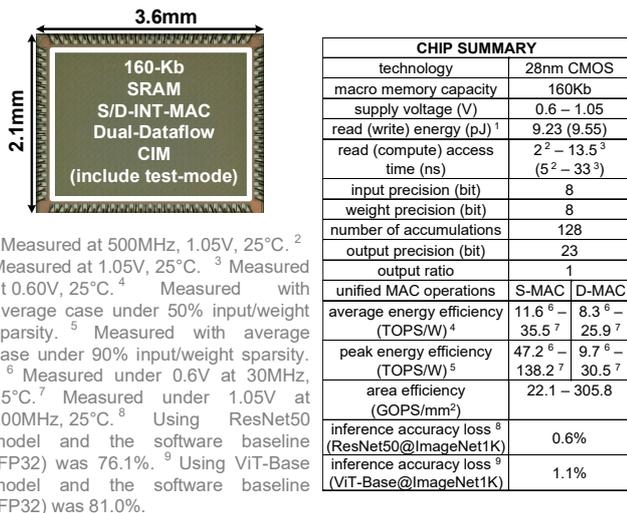


Fig. 7. Chip micrograph in 28nm (top-left), and chip summary table (right).

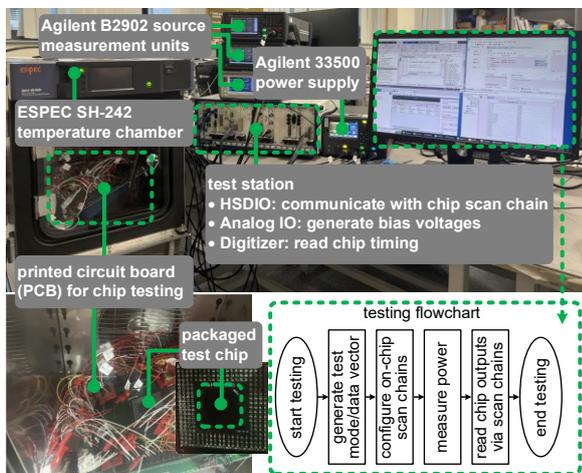


Fig. 8. Testing setup and testing flowchart for testchip functionality validation, and performance measurement.

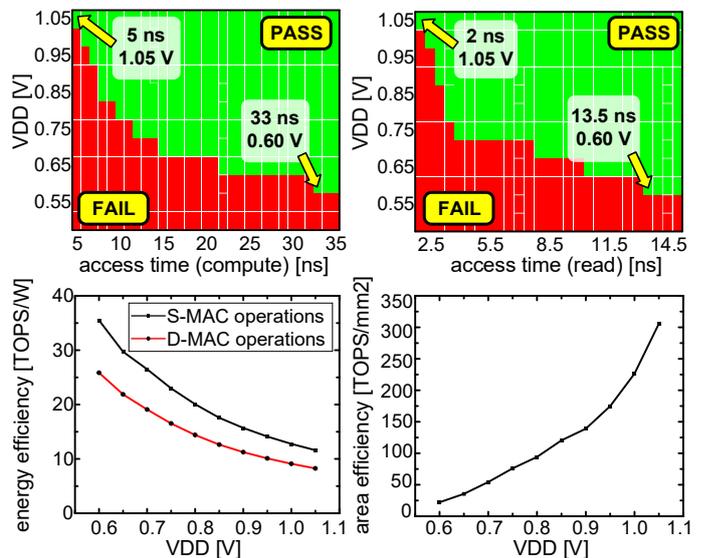


Fig. 9. Measured compute and read access time in SRAM and CIM mode (top), average energy and area efficiency at different  $V_{DD}$  (bottom).

architecture), the actual improvement of the proposed SRAM macro is even more pronounced.

The characterization of the periphery and the ADCs is shown in Fig. 10, where digital output value readouts are shown to be correctly disoverlapped and hence distinguished from each other at  $6\sigma$ , down to lowest 0.6-V supply voltage ( $\sigma$  found from Monte Carlo simulations).

From layer-level analysis (Fig. 11), the S-MAC (D-MAC) average energy efficiency in ViT transformer is 35.5 TOPS/W (25.9 TOPS/W), and 138.2 TOPS/W in ResNet-50. Compared with prior SRAM CIM designs (Table I), the proposed architecture uniquely enables S- and D-MAC unification with no interruption cycle, no load-store in other banks, and no re-training as opposed to [2]-[4], [12], [14].

### IV. CONCLUSION

A SRAM CIM macro uniquely featuring a dual-dataflow architecture is presented, addressing key limitations of prior

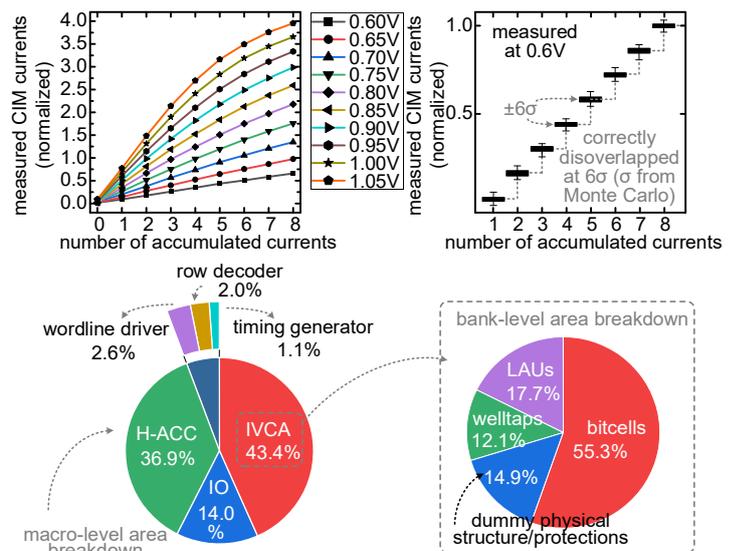


Fig. 10. Measured compute bitline accumulation currents at different supply voltages (top-left). The ADC transfer function shows correctly disoverlapped at  $\pm 6\sigma$  bands even at the lowest  $V_{DD}$  (top-right). Macro- and array-level area breakdown in the proposed architecture (bottom).

TABLE I. COMPARISON WITH STATE-OF-THE-ART SRAM CIMs

	this work	ISSCC'24 [3]	ISSCC'24 [4]	ISSCC'22 [2]	ISSCC'24 [7]	ISSCC'24 [11]	ISSCC'25 [12]	ISSCC'25 [13]	ISSCC'25 [14]
technology	28 nm	22 nm	65 nm	28 nm	28 nm	16 nm	28 nm	28 nm	28 nm
supply voltage (V)	0.6 – 1.05	0.6 – 0.9	0.6 – 1.1	0.6 – 1.0	0.7 – 0.95	0.4 – 0.8	0.55 – 0.9	0.55 – 0.9	0.6 – 0.9
bitcell reuse (no modification)	YES	YES	NO	NO	YES	NO	YES	YES	YES
CNNs and transformers	YES	YES	YES	NO	NO	NO	YES	NO	YES
unified S-MACs and D-MACs <sup>a</sup>	YES	NO	NO	NO	NO	NO	NO	NO	NO
compute domain	hybrid	hybrid	analog	digital	hybrid	digital	digital	digital	hybrid
full output precision	YES	YES	NO	YES	YES	YES	YES	YES	YES
average energy efficiency (TOPS/W) <sup>b</sup>	S-MAC	S-MAC							
	11.59 – 35.51	15 <sup>c</sup> – 46 <sup>c</sup>	–	12.5 – 20.5	22.7 – 50.5	43.2 – 58.1	25.4	17.5 – 50	–
	D-MAC	D-MAC							
8.25 – 25.85	–	–	–	–	–	–	–	–	–
peak energy efficiency (TOPS/W) <sup>b</sup>	S-MAC	S-MAC							
	47.2 – 138.2	–	108	–	50.1 – 111.1	74.1 – 96.3	90.1	36.5 – 104	21 – 67.8
	D-MAC	D-MAC							
9.7 – 30.5	–	21 <sup>d</sup>	–	–	–	–	–	–	–
concurrent write/compute	YES	NO	NO	NO	NO	YES	NO	NO	NO

<sup>a</sup> Support of both S-MAC and D-MAC operations without extra data loading/interruptions <sup>b</sup> Chip performance normalized to 28nm (scaling factors from public foundry announcements), 8-bit integer MAC <sup>c</sup> Approximate <sup>d</sup> Transformer operations executed by inefficient repurposing of S-MAC (necessary load-store energy also omitted)

CIMs via unification of static/dynamic MAC operations in CNNs and multi-modal transformers. Reset-less in-bitcell Boolean, analog-digital hybrid accumulation, and concurrent write/compute demonstrate state-of-the-art peak energy efficiency in both S-MACs and D-MACs for highly efficient and uninterrupted resource-constrained edge AI systems.

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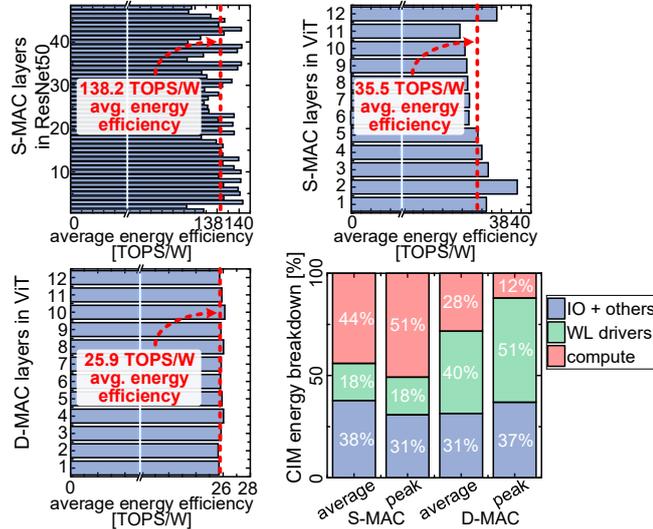


Fig. 11. Measured layer-level energy efficiency in ResNet-50 and ViT (top and bottom-right), average (peak) energy breakdown in S-MAC and D-MAC operations under 50% (90%) input/weight sparsity (bottom-right).

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