

# Test of Supply Noise for Emerging Non-Volatile Memory

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**Abstract**—Emerging Non-Volatile Memories (NVMs) suffer from high read/write current which can result in supply noise such as voltage droop and ground bounce. The magnitude of supply noise depends on the old data and the new data that is being written (for a write operation) or the stored data (for a read operation). In prior work, it has been shown that the noise generated by one access can affect another parallel access. Therefore, parallel read/write operation should be tested considering the supply noise. However, testing for read/write failure with supply noise considerations can take significant test time. In this work, we show that test time can be reduced by 410.82X for RRAM-based NVM Last Level Cache (LLC) by using Design for Test (DFT) circuits such as wordline overdrive and ending write operation early. We also show that the proposed test can save 79.875J of energy compared to the baseline test method.

**Keywords**- Non-Volatile Memory, Supply Noise, Test, Test Time Reduction, Wordline Overdrive

## I. INTRODUCTION

At the end of silicon roadmap, keeping the leakage power in tolerable limit has become one of the biggest challenges. Several promising Non-Volatile Memories (NVMs) are being investigated by the scientific community to address this issue. Emerging NVM technologies e.g., Spin-Transfer Torque RAM (STTRAM), Magnetic RAM (MRAM), Resistive RAM (RRAM), Phase Change Memory (PCM) and Ferroelectric RAM (FRAM) have drawn significant attention due to low (static) power operation, high density/speed and the inherent non-volatility [1-5]. Some of them have already entered the mainstream computing. Examples include MRAM by Everspin [6], CBRAM (a variant of RRAM) by Adesto Tech [7], PCM by Intel [8] and FRAM by Cypress [9]. However, their unique characteristics introduce new test challenges and call for designing new test methods and/or repurposing existing SRAM and Dynamic RAM (DRAM)/Embedded DRAM (eDRAM) test flows [10-15]. A well-defined test methodology will facilitate a broad adoption of these promising memory technologies in a variety of systems and applications.

Fig. 1(a) presents test flow for conventional memories.

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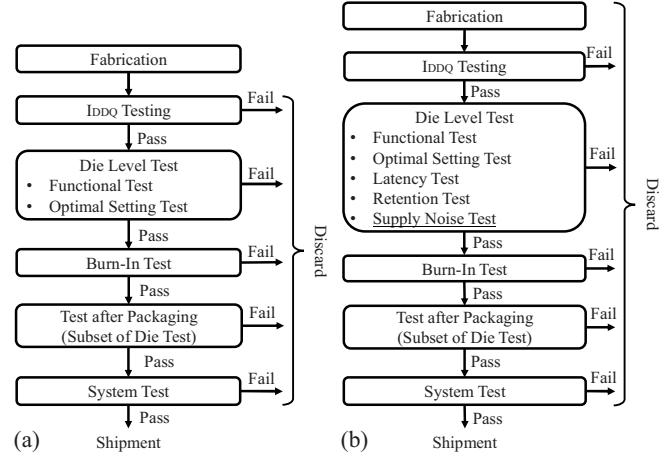


Fig. 1 Test flow: (a) conventional memory; (b) proposed for NVMs.

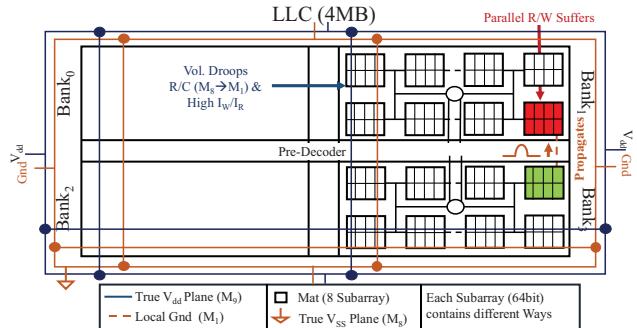


Fig. 2 1T1R-based 4MB LLC containing 4 banks showing supply noise. Each bank contains 8 Mats and each Mat contains 8 subarrays each producing 64bits. Each subarray has 8 Ways. Parallel read/write in Bank1 (red) suffers due to propagation of droop/bounce from Bank3 (green) (or vice versa).

Various March tests are performed to characterize read/write operations, address decoding and identify failures e.g., the coupling between neighboring cells. Tests to search for optimal setting identify optimal values of read/write assist techniques e.g., word-line over/under drive, supply voltage collapse [16] and negative bit-line [17]. For DRAM/eDRAM data retention is also characterized [18]. However, a similar retention test technique increases NVM test time significantly as NVMs can have a retention time of several years. In [10-12], weak-write-

based retention test time compression technique is proposed for NVMs. In [13-14], external-magnetic-field-based retention test time compression technique is proposed for spintronics. In [19], a sneak-path-based testing is proposed to detect different faults such as stuck at faults or coupling faults. However, supply noise test for NVMs has not been presented before. The issue is described below:

**Supply Noise [21]:** Fig. 2 shows an overview of 4MB 1T1R-based Last Level Cache (LLC). Extremely high current (50-100mA assuming  $\sim 100\mu\text{A}/\text{bit}$ ) is drawn from the supply for a full cache line (512-1024bit) write. This creates two issues [20-23]:

- *Supply voltage droop:* On-chip voltage regulator or power supply keeps the supply voltage constant. However, the supply voltage (distributed in higher metal layers such as  $M_9$ ) reaches the memory bitcell (implemented in metal-1,  $M_1$ ) via power-grid RC network. The interconnect resistance causes a significant voltage droop at the bitcell due to high current [20]. Voltage droop results in lower headroom for the bitcell and increases the write latency or decreases the sense margin for read. It can eventually lead to read/write failure [20-23].

- *Local ground bounce:* Similar to supply voltage, the true ground is routed on upper metal layer (e.g.  $M_8$ ) and connects to the transistors in  $M_1$ . Therefore, the local ground rail bounces when the charge (due to high write/read current) is dumped.

Interestingly, the magnitude of combined supply noise (due to both droop and bounce) depends on the present state of the memory bit as well as the new data being written since  $I_{\text{write}}$  for  $0 \rightarrow 0$ ,  $0 \rightarrow 1$ ,  $1 \rightarrow 0$  and  $1 \rightarrow 1$  is different (for write operation), and on the stored data (for read operation) [20-23]. Read/write operation can be affected due to both self-inflicted and parallel read/write-inflicted combined supply noise. Therefore, bits should be tested and optimal  $V_{\text{dd}}/T_{\text{clock}}$  should be selected for successful read/write. However, traditional test approach fails to validate memory functionality for all possible corner cases (details in Section III).

The long write and read latency of emerging NVMs worsen the supply noise issue due to bank-level parallelism (i.e., read/write on independent banks in parallel) that is employed in LLC to achieve high bandwidth. Parallel access in emerging draw more current that can worsen the supply noise resulting in read/write failures. In summary, read/ write failure due to combined supply noise should be tested. However, exhaustive test for all possible read/write polarities and noise can degrade the test time significantly. Therefore, DFT circuits and test methodologies are required.

In this work, we describe the above NVM test challenges and propose new test methods and test patterns with associated Design-for-Test (DFT) circuits to solve these challenges. Fig. 1(b) presents a representative test flow for NVMs. Proposed new test method for NVMs is underlined in Fig. 1(b). For the sake of brevity, we restrict the discussion to one flavor of NVM namely, RRAM. *To best of our knowledge, this is the first attempt to study NVM-specific supply noise test challenges and corresponding solutions.*

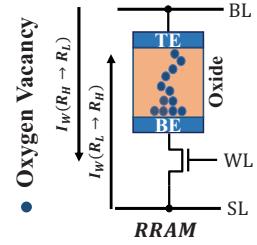


Fig. 3 Schematic of RRAM bitcell.

TABLE I: PARAMETERS USED FOR THE RRAM SIMULATION

Parameter	Value
Access Transistor W/L/V <sub>T</sub>	130nm/65nm/0.423V
RRAM Oxide Gap for R <sub>L</sub> /R <sub>H</sub>	0.53nm/1.368nm
Cell Size	12F <sup>2</sup>
Clock Frequency/V <sub>dd</sub>	2GHz/2.2V
Read/Write Latency	0.5ns(1cycle)/10ns(20cycle)

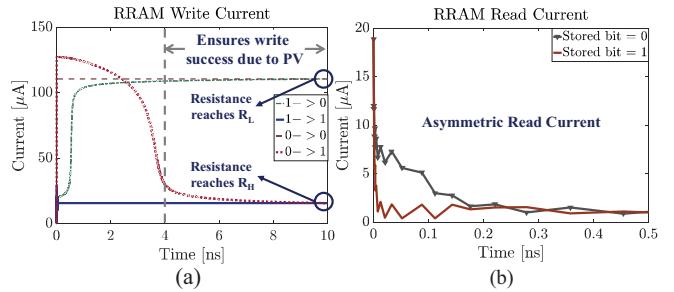


Fig. 4 RRAM high (a) write current; and (b) read current.

We make following contributions in this paper. We

- (a) present new test challenges introduced by NVMs;
- (b) summarize supply noise modeling from [21] due to NVM read/write operation and its impact on the parallel accesses;
- (c) propose DFT techniques to reduce test time for the supply noise.

The paper is organized as follows: Section II presents the basics of NVMs. Sections III describes the background of supply noise for NVM. Sections IV describes test challenges associated with NVM under supply noise and propose techniques to address them. Section V presents discussion and Section VI draws conclusions.

## II. BASICS OF NVM

In this section, we present the basics of NVM. We restrict our discussion to RRAM for the sake of brevity.

### A. Basics of RRAM

RRAM contains an oxide material between Top/Bottom Electrode (TE/BE) (Fig. 3). RRAM resistive switching is due to oxide breakdown and re-oxidation which modifies a Conduction Filament (CF). Conduction through the CF is primarily due to transportation of electrons in the oxygen vacancies. These vacancies are created under the influence of

electric field due to the applied voltage. The two states of the RRAM are termed as Low Resistance State (LRS) and High Resistance State (HRS) and denoted by  $R_L/R_H$  respectively. The process of switching the state to LRS (HRS) is known as SET (RESET). We have used ASU RRAM Verilog-A model (bipolar  $HfO_x$  based resistive switching memory) [24] along with 65nm nMOS as an access transistor for simulation and analysis. All the model parameters are shown in Table I.

### B. High Read/Write Current and Long Write Latency

RRAM suffers from long write latency (Fig. 4(a),  $\sim 10$ ns) since the current needed to switch the state is high ( $\sim 100\mu\text{A}/\text{bit}$ ). Read current for RRAM ( $\sim 5.54\mu\text{A}/\text{bit}$ ) (Fig. 4(b)) is also high compared to conventional memories.

### C. Asymmetric Read/Write Current and Short Read Latency

Total read/write current for a full cache line is a function of data pattern due to asymmetric read/write current [25]. Therefore, the generated supply noise depends on the write/read data pattern. RRAM read latency can be optimized to less than 1ns (Fig. 4(b), ~0.5ns). Therefore, many reads can be initiated between one write to increase throughput (details in Section III).

### III. BACKGROUND OF SUPPLY NOISE

#### A. Modeling of Voltage Droop/Ground Bounce [21]

Fig. 2 shows 4MB 1T1R LLC organization. It is a 4-way set associated cache. All the Ways of each Mat are accessed simultaneously and buffered at the edge of each Mat, resulting in a total of 512bit accesses. The figure also shows the upper layer metal plan.  $V_{dd}$  plane is in  $M_9$  and  $V_{ss}$  plane is in  $M_8$ . Both  $V_{dd}$  and  $V_{ss}$  are implemented from  $M_7$  to  $M_1$  where  $M_7$ ,  $M_5$ ,  $M_3$ , and  $M_1$  are horizontal and  $M_6$ ,  $M_4$ ,  $M_2$  are vertical. The total area of the chip is  $4970\lambda \times 3950\lambda$  where each bank occupies  $2046\lambda \times 1536\lambda$ , and the remaining is occupied by the peripheral circuitry (e.g. pre-decoder, sense amp etc.). Note that  $\lambda$  is the feature size.

**Ground Bounce:** Fig. 5 shows the circuit used for ground bounce modeling. The total read/write current is dumped to the local ground implemented in  $M_1$ . Ground bounce propagates to nearest banks through metal  $M_1$  via metal  $M_2$ , and then down to  $M_1$  again. We modeled the resistance of path  $M_1$  to  $M_8$  by  $R_1$ . Fig. 6 shows the connection of true ground ( $M_8$ ) with the local ground ( $M_1$ ) of a Mat. We modeled the equivalent resistance

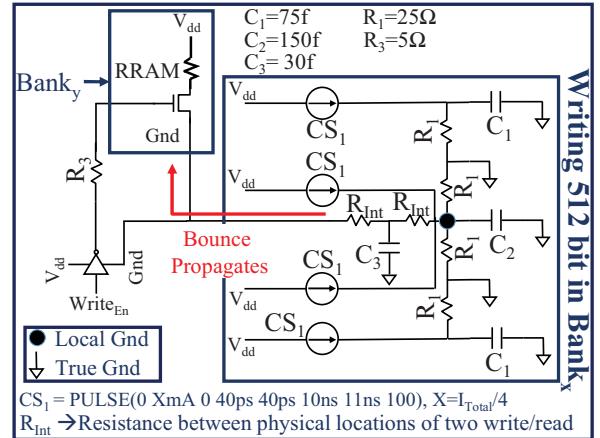


Fig. 5 Equivalent circuit for modeling ground ( $V_{SS}$ ) bounce [21].

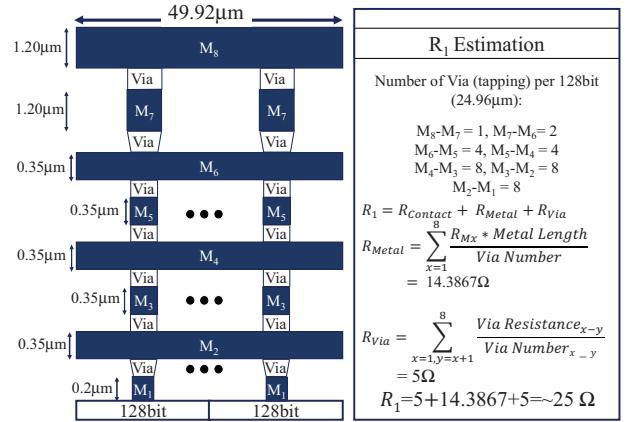


Fig. 6 Estimation of  $R_1$  of Fig. 5 for ground bounce modeling [21].

using 65nm layout parameters (Table II) [26-27]. We divided 512bits into 4 groups (only two of them shown in Fig. 6) for simplicity. Each metal layer R/C and via between metal layers are also given in Table II. Our estimation shows that  $R_1$  is equivalent to  $\sim 25\Omega$  (Fig. 6). Fig. 7(a) shows that as  $R_1$  increases, ground noise increases. Capacitance calculation is omitted for the sake of brevity.

The impact of write current (per bit) and the width of write data on ground noise are shown in Fig. 7(b) and Fig. 7(c) respectively. Fig. 7(b) shows that as write current (per bit) increases, ground noise increases. Typically, NVM write

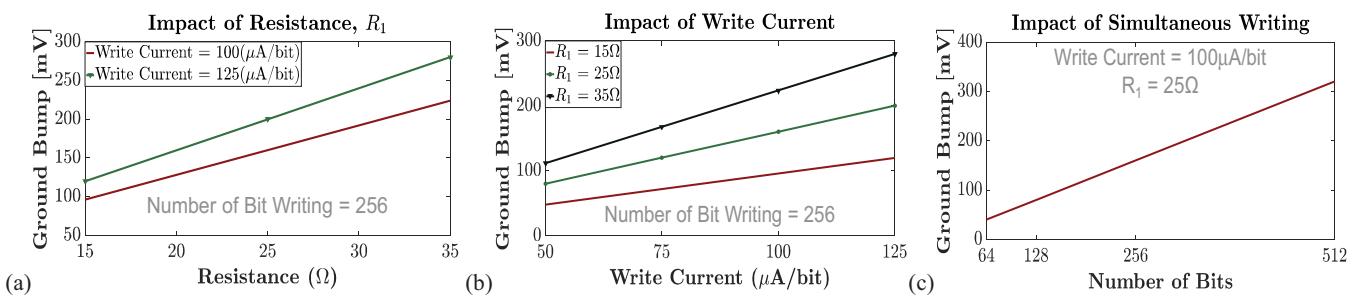


Fig. 7: (a) Impact of resistance ( $R_1$ ) of Fig. 5 on the local ground bounce [23]; (b) impact of write current (per bit) on the local ground bounce [23]; and, (c) impact of number of bits writing on the local ground bounce [23].

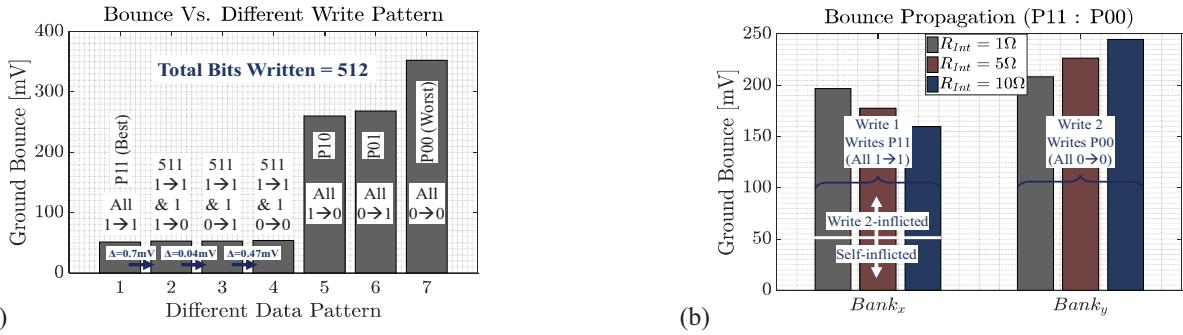


Fig. 8 (a) Ground bounce vs write data pattern [21]; and, (b) impact of  $R_{int}$  on bounce when Write-1/Write-2 writes P11/P00 pattern in Bank<sub>x</sub>/Bank<sub>y</sub> respectively [21]. Write-1 observes higher bounce as  $R_{int}$  reduces, even though Write-1 generates only  $\sim 51.42$ mV of self-bounce.

TABLE II: PARAMETERS USED FOR GROUND BOUNCE MODELING

Parameter	Value
Resistance ( $\Omega/\mu\text{m}$ ) M <sub>1</sub> /M <sub>2</sub> /M <sub>3</sub> /M <sub>4</sub> /M <sub>5</sub> /M <sub>6</sub> /M <sub>7</sub> /M <sub>8</sub>	0.91/0.41/0.41/0.41/0.41 /0.41/0.04/0.04 [26-27]
Cap ( $\text{fF}/\mu\text{m}$ ) M <sub>1</sub> /M <sub>2</sub> /M <sub>3</sub> /M <sub>4</sub> /M <sub>5</sub> /M <sub>6</sub> /M <sub>7</sub> /M <sub>8</sub>	0.13/0.17/0.17/0.17/0.17 /0.17/0.19/0.19 [26-27]
Miller Coupling Factor (MCF)	1.5
Via Resistance ( $\Omega$ ) M <sub>1-2</sub> /M <sub>2-3</sub> /M <sub>3-4</sub> /M <sub>4-5</sub> /M <sub>5-6</sub> /M <sub>6-7</sub> /M <sub>7-8</sub>	6/5/5/3/3/1/1 (CVD Tungsten-based) [28]
Di-electric Constant for Cap. Calculation ( $C_{plate}/C_{side}$ )	2.2/2.79 [27]
Resistance between M <sub>1</sub> to Source/Drain Contact, $R_{Contact}$ ( $\Omega$ )	$\sim 5$ [29]

current varies from  $50\mu\text{A}$  to  $125\mu\text{A}$ . Fig. 7(c) shows that the ground noise increases as the width of write data in a memory array increases.

We also model the resistance  $R_{int}$  which represents the equivalent resistance between the local ground of one address of a bank to another address of another bank. Our estimation shows that lowest (closest two addresses of two banks)/highest (furthest two addresses of two banks)  $R_{int}$  is  $1.63\Omega/185.12\Omega$ . Average read/write current for a full cache line is divided into four constant Current Sources (CS). Therefore, current magnitude of CS,  $XmA$  is equal to  $I_{Total}/4$  (for example, 512bit of RRAM  $0\rightarrow 0$  writing,  $I_{Total}=56.32\text{mA}$  and  $X=14.08\text{mA}$ ) and each one presents read/write current for 128bit.

Fig. 8(a) shows the bounce generated by a full cache line write of RRAM employed in this work for various data patterns.

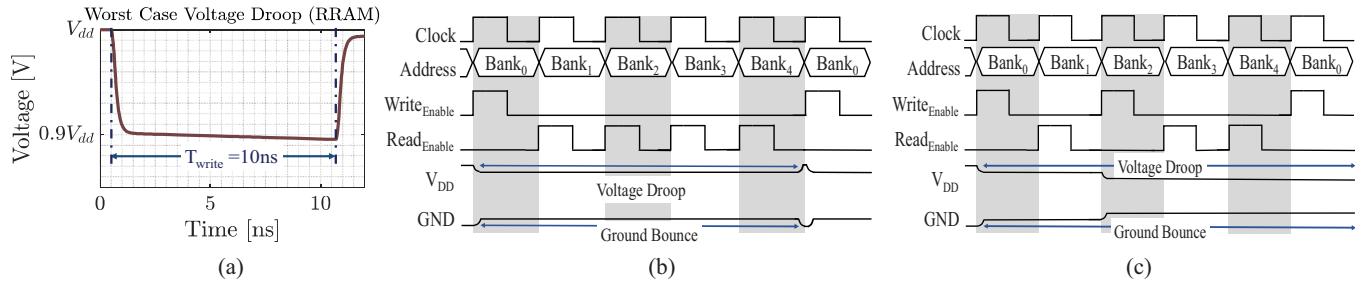


Fig. 9 (a) Worst-case (P00) voltage droop when writing all the bits to one MAT of Bank<sub>3</sub> (Fig. 2) [21]; (b) four reads are initiated between two writes. We call it 1X mode [21]; (c) three reads and one write are initiated between two writes. We call it 2X mode [21].

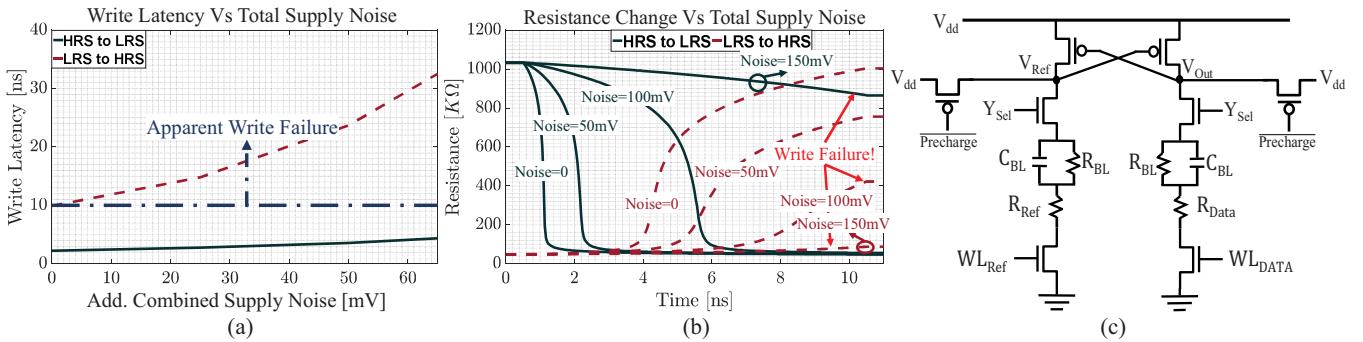


Fig. 10 (a) RRAM write latency increases as additional supply noise increases [21]; (b) RRAM resistance variation with additional supply noise [21]; and, (c) single ended read circuitry used in this work [30]. We considered  $R_{BL} = 25\Omega$ ,  $R_{Ref} = 500K\Omega$  and  $C_{BL} = 25fF$  [21].

system throughput. Parallel access can take following forms:

**1X Write:** Read can be initiated in the next 4 cycles in other banks (Fig. 9(b)) when one write has been initiated in one bank. These data are processed in the pipeline to maintain high throughput. Read operations initiated in cycles 2, 3, 4 and 5 will experience failure (due to supply noise propagation to those banks) owing to, (a) poor sense margin at a lower voltage; (b) higher access transistor resistance at lower wordline voltage. We call this write/read scheme 1X write.

**nX Write:** Multiple (n) writes can be initiated with read. For example, one write along with 3 consecutive reads can be initiated in the next four clock cycles in other banks (Fig. 9(c)) when write has been initiated in one bank. The second write will draw additional current from the supply which might add to the existing noise. Furthermore, the local ground will bounce due to the second write along with multiple reads and propagate to the first write (or vice versa) location and cause write failure. We call this write/read scheme 2X write.

In this work, we have ignored additional droop (due to insignificant magnitude) and considered only the ground bounce caused by a read operation. However, both ground bounce and droop are considered as the noise components generated by a write operation.

#### C. Parallel Write Failure Due to Supply Noise [21]

We simulate RRAM write operation with additional supply noise (excluding self-inflicted noise). It is evident from Fig.

10(a) that as supply noise increases, write latency for both LRS to HRS and HRS to LRS increases. However, the former increases very rapidly compared to the latter. At this point, we can consider that even with 10mV of voltage loss, LRS to HRS write fails as the corresponding write latency is around 12ns (>10ns). However, for better understanding, let's consider Fig. 10(b) which shows the RRAM resistance changing during write operation with respect to supply noise. Note that HRS to LRS write operation can sustain up to 100mV (accurately ~120mV) supply noise. On the contrary, the final resistance of LRS to HRS does not reach the full  $R_H$  (=1000KΩ) value for even 50mV (reaches till 760KΩ). However, we can still consider this as successful write since sufficient sense margin will be generated during read operation of this bit (using read circuitry of Fig. 10(c)). This is true since the final resistance is greater than  $R_{Ref}$  (=500KΩ). Additional voltage loss beyond 50mV and less than 120mV will cause LRS to HRS write failure but still can write HRS to LRS successfully. Therefore, write operation is:

- i) successful, if the write incurs an additional supply noise < 50mV from parallel read/write operation;
- ii) partially successful i.e., only HRS to LRS ( $1 \rightarrow 0$ ) is successful if the write operation incurs an additional supply noise > 50mV but < 120mV from parallel read/write operation;
- iii) unsuccessful, if the write operation incurs an additional supply noise > 120mV from parallel read/write operation.

Now, we analyze write failure due to supply noise from

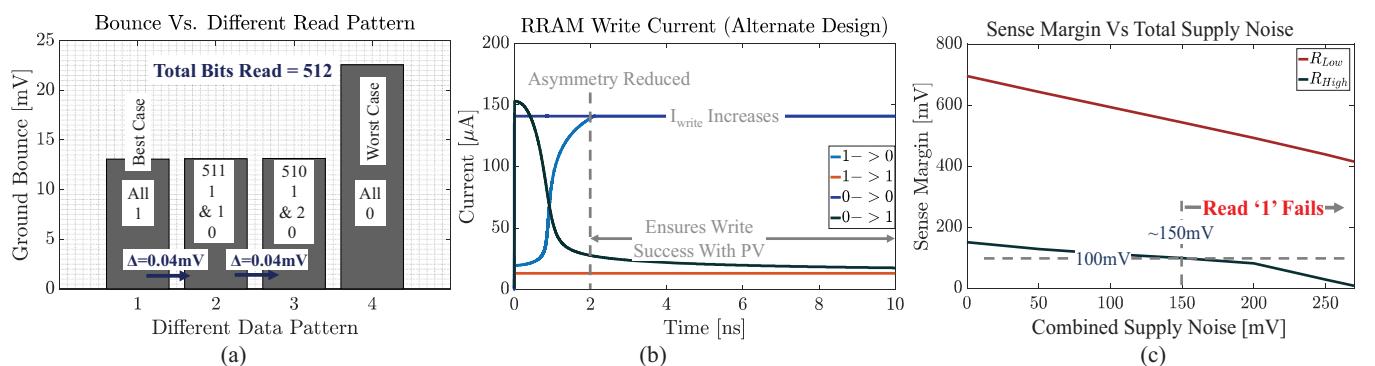


Fig. 11 (a) Bounce generation vs different read data pattern [21]; (b) RRAM current profile for alternate design (symmetric) [21]; and, (c) sense margin with additional supply noise [21]. Sense margin for data 1 suffers more, and failure is observed above 150mV of additional supply noise.

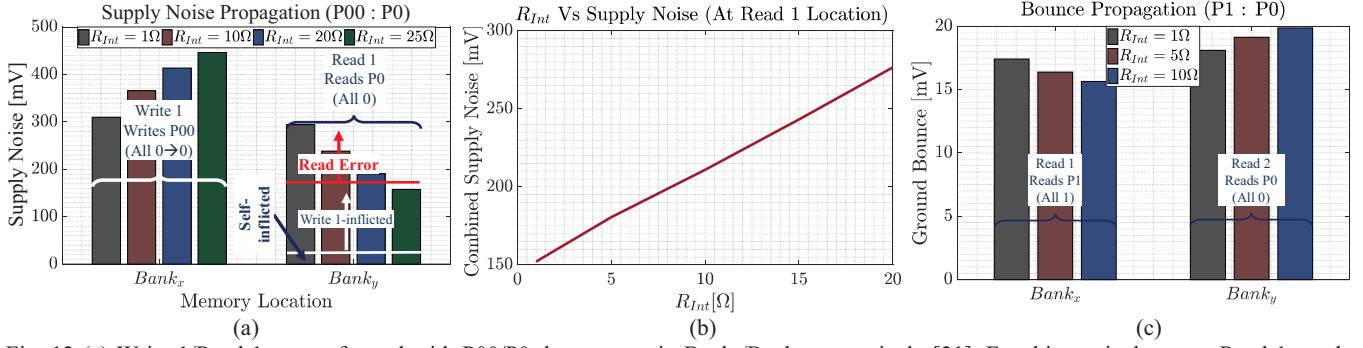


Fig. 12 (a) Write-1/Read-1 are performed with P00/P0 data pattern in Bank<sub>x</sub>/Bank<sub>y</sub> respectively [21]. For this particular case, Read-1 can be affected by Write-1 if  $R_{int}$  between the parallel access is  $< 23\Omega$ ; (b)  $R_{int}$  vs supply noise generated by Write-1 that causes Read-1 failure [21]; and, (c) Read-1/Read-2 are performed in Bank<sub>x</sub>/Bank<sub>y</sub> with P1/P0 read pattern respectively [21]. Parallel reads does not affect each other.

parallel read/write operation:

**Write Failure Due to Parallel Write:** Result indicates that if Write-1/Write-2 writes P00/P11 pattern respectively, both polarity write operation fails if  $R_{int}$  between them is  $0 < R_{int} < 22\Omega$ . Furthermore, only one type of polarity write operation fails ( $0 \rightarrow 1$ ) if  $R_{int}$  between them is  $22\Omega < R_{int} < 37\Omega$ . It should be noted that for this example, Write-1 and Write-2 are generating the lowest and the highest self-inflicted supply noise respectively. However, if Write-1 generates more self-supply noise, the write operation failure happens for larger  $R_{int}$ .

**Write Failure Due to Parallel Read:** Fig. 11(a) shows the ground bounce generation by read operation as a function of read data pattern. The figure shows that the maximum bounce generated by the read operation is  $\sim 23\text{mV}$ . Therefore, it is evident that write failure by the parallel read is not possible even if their physical location is right next to one another.

The RRAM employed in this work takes longer latency for writing  $0 \rightarrow 1$ . Therefore, only  $0 \rightarrow 1$  write operation fails if it incurs a certain range of supply noise ( $22\Omega < R_{int} < 37\Omega$ ). However, we further analyzed another type of RRAM design which eliminates the asymmetric write current by using asymmetric doped transistor [31]. Fig. 11(b) shows the current profile for all four cases for such alternate designs.  $I_{write}$  for  $1 \rightarrow 0$  and  $0 \rightarrow 0$  increases (more supply noise) although asymmetry is almost eliminated (by reversing TE/BE of RRAM cell, reducing access transistor  $V_T$  by 100mV and using separate write voltages for  $V_{1 \rightarrow 0} = 2\text{V}$  and  $V_{0 \rightarrow 1} = 1.8\text{V}$ ). We still kept the write time 10ns to successfully write even with process variation. We performed a similar investigation on this circuit for write failure. We observe that (for this symmetric design) if the write operation incurs 132mV of noise with a period of 1ns, and the noise continues for the entire write operation (10ns), only  $1 \rightarrow 0$  write is successful. Furthermore, if the write operation incurs 116mV of noise with a period of 10ns, only  $0 \rightarrow 1$  write is successful. Therefore, symmetric designs could be worse as both polarity write failure is possible based on different supply noise condition. Note that 1ns-wide supply noise can be generated by a read operation (along with write for higher magnitude) while 10ns-wide supply noise can be generated by a write operation.

#### D. Parallel Read Failure Due to Supply Noise [21]

**Read circuitry:** Fig. 10(c) presents the single-ended read circuitry [30] used in this work.  $V_{ref}$  and  $V_{out}$  are both kept at  $V_{dd}$  by pre-charging through p-MOS  $M_3/M_4$ , and thereby p-MOS  $M_1, M_2$  are both OFF.  $R_{BL} (= 25\Omega)$  and  $C_{BL} (= 25\text{fF})$  are bitline resistance and capacitance respectively.  $Y_{sel}$ ,  $WL_{Ref}$ , and  $WL_{DATA}$  are enabled during a read operation. If  $R_{Data}$  is greater than  $R_{Ref}$  ( $= 500\text{K}\Omega$ ),  $V_{out}$  remains at  $V_{dd}$  while  $V_{ref}$  discharges to zero. However, if  $R_{Data}$  is less than  $R_{Ref}$  ( $= 500\text{K}\Omega$ ),  $V_{out}$  discharges to zero while  $V_{ref}$  remains at  $V_{dd}$ .

We analyzed the sense margin generated by the read circuitry shown in Fig. 10(c) for both data 0 and 1. Fig. 11(c) shows that the sense margin reduces with the increment of supply noise. However, ground bounce affects more compared to  $V_{dd}$  droop as it, i) reduces the discharge current, and ii) reduces  $V_{GS}$  of access transistor (resulting increment of  $R_{Transistor}$ ) while voltage droop only reduces discharge current. Note that if the read operation in a bank incurs additional supply noise  $> 150\text{mV}$  from a parallel read/write in another bank, the operation reads 1 incorrectly (Fig. 11(c)). However, sense margin for data 0 is above 150mV even with 350mV of supply noise. Therefore, read 0 does not fail even for the worst possible additional supply noise caused by another parallel read/write.

**Read Failure Due to Parallel Write:** We analyzed read failure in one bank due to parallel write operation in another bank. Fig. 12(a) shows that Write-1 is performed in Bank<sub>x</sub> with P00 write pattern and Read-1 is performed in Bank<sub>y</sub> with P0 read pattern (P0 means all the bits stored in that address contain data 0). Results indicate that read fails in Bank<sub>y</sub> by Write-1 in Bank<sub>x</sub> if  $R_{int}$  between Write-1 and Read-1 is  $< 23\Omega$ . This observation is true if Write-1 generates worst-case supply noise (caused by P00 write pattern). However, if Write-1 is of different data pattern which generates lower supply noise compared to the worst-case,  $R_{int}$  range for possible read failure will be lowered. This means that Write-1 in Bank<sub>x</sub> affects Read-1 in Bank<sub>y</sub> for a lesser memory area. Fig. 12(b) shows  $R_{int}$  vs supply noise generated by Write-1 that causes Read-1 failure.

**Read Failure Due to Parallel Read:** We analyzed read failure in one bank due to parallel read operation in another bank. Fig. 12(c) shows that Read-1 is performed in Bank<sub>x</sub> and Read-2 is performed in Bank<sub>y</sub> with P1/P0 read pattern

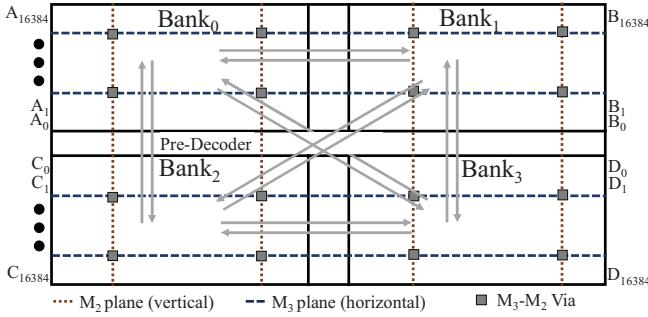


Fig. 13 4MB LLC diagram showing addresses of Bank<sub>0</sub>/Bank<sub>1</sub>/Bank<sub>2</sub>/Bank<sub>3</sub> as A/B/C/D from 0 to 16K. The grey arrows show different cases for testing the impact of supply noise.

respectively. It can be concluded that parallel read operations in Bank<sub>x</sub> and Bank<sub>y</sub> does not affect each other for any value of  $R_{int}$ .

#### IV. NVM TEST WITH SUPPLY NOISE

In this section, we present the challenges of NVM test in the presence of high supply noise and propose techniques to test supply noise-induced read/write failure.

##### A. Test Data Patterns & Test Cases

**Data Pattern for Write Test:** The worst-case for supply noise-induced write/read failure depends on the physical implementation of the memory. The data pattern (especially for write) is also another factor that determines the supply noise. Therefore, we need to select data pattern in a way that generates maximum supply noise while detecting failures. For example, writing 0→0 generates the highest supply noise. However, write failure cannot be detected as old data and new data are the same. Therefore, we propose to write data pattern in a way that only one bit of the address incurs 0→1 writing and rest of the bits incurs 0→0 writing. For example, test data pattern can be 0x00000000→ 0x00000001 for a 32-bit cache line for testing write failure. Note that the test pattern mentioned above only tests the LSB bit of that address. The test should be repeated 31 times with appropriate test data pattern to test the rest of the 31-bits of the same address.

**Data Pattern for Read Test:** We need to detect read failure for the stored-data = 1. If all the bits of an address are 1, all bits can be tested at once. However, the supply noise will be reduced by 19mV from the worst-case (when all bits of the address are 0) for a 512bit cache line. Therefore, we can test a few 1's in the data when the rest of the bits are 0's. For example, the read-test-data pattern can be 0x00110011 for a 32-bit cache line. This data pattern tests 4 bits of the address. The same address needs to be tested 7 more times to test the rest of the 28bits with appropriate data patterns (stored data in the bits of interest = 1). However, write failure occurs for only 50mV of supply noise whereas read failure occurs for 150mV. Therefore, reads are robust against supply noise compared to write and we can test only the write failures to minimize the test time.

Fig. 13 shows the physical location of the addresses of different banks Bank<sub>0</sub>/Bank<sub>1</sub>/Bank<sub>2</sub>/Bank<sub>3</sub> named as A/B/C/D

respectively from 0 to 16K. Note that this banking architecture is for illustrative purpose. We assume that only two concurrent writes and many reads are possible in independent banks. Therefore, all the banks can be accessed in parallel with 2 reads and 2 writes or with 4 reads. Grey arrow of Fig. 13 depicts various cases for testing the impact of supply noise. We summarize all the possible test cases below:

**Case-1 (Accesses in adjacent banks):** This case includes the impact of writing in one bank (e.g. Bank<sub>0</sub>) and writing to the adjacent bank (e.g. Bank<sub>1</sub>). Another adjacent bank pair is Bank<sub>2</sub>-Bank<sub>3</sub>. Write failure should be tested by writing to the address pairs (A<sub>0</sub>-B<sub>0</sub>, A<sub>1</sub>-B<sub>1</sub>, ..., A<sub>16384</sub>-B<sub>16384</sub>, C<sub>0</sub>-D<sub>0</sub>, C<sub>1</sub>-D<sub>1</sub>, ..., C<sub>16384</sub>-D<sub>16384</sub>) simultaneously and detecting write failure in both addresses. Note that the abovementioned test can be done on diagonal addresses on these bank pair (for e.g. A<sub>0</sub>-B<sub>1</sub>, A<sub>0</sub>-B<sub>2</sub>, ..., A<sub>0</sub>-B<sub>16384</sub>, A<sub>1</sub>-B<sub>0</sub>, A<sub>1</sub>-B<sub>2</sub>, ..., A<sub>1</sub>-B<sub>16384</sub>, ... etc.). However, diagonal addresses will experience less noise due to a higher  $R_{int}$  and will not be the worst-case. Therefore, we can skip their test and focus on the worst-case addresses.

Case-1 may seem like the worst-case supply noise. However, the bounce generated at metal layer M<sub>1</sub> needs to go to M<sub>2</sub>, then M<sub>3</sub>, then propagate through M<sub>3</sub> and going down to M<sub>1</sub> via M<sub>2</sub>. Therefore,  $R_{int}$ , in this case, is higher for the same physical distance.

**Case-2 (Accesses in physically confronting banks):** This case includes the impact of writing in one bank (e.g. Bank<sub>0</sub>) and writing to the bank on top or bottom (e.g. Bank<sub>2</sub>). Another confronting bank pair is Bank<sub>1</sub>-Bank<sub>3</sub>. Write failure should be tested by writing to the address pairs (A<sub>0</sub>-C<sub>0</sub>, A<sub>0</sub>-C<sub>1</sub>, ..., A<sub>0</sub>-C<sub>X</sub>, A<sub>1</sub>-C<sub>0</sub>, A<sub>1</sub>-C<sub>1</sub>, ..., A<sub>1</sub>-C<sub>X-1</sub>, ..., A<sub>X-1</sub>-C<sub>0</sub> and similarly for Bank<sub>1</sub>-Bank<sub>3</sub>) simultaneously and detecting write failure in the both addresses. It should be noted that A<sub>X</sub>-C<sub>X</sub>/B<sub>X</sub>-D<sub>X</sub> represents the furthest addresses that can affect each other.

**Case-3 (Accesses in diagonal banks):** This case captures the impact of writing in one bank (e.g. Bank<sub>0</sub>) and writing to the diagonal bank (e.g. Bank<sub>3</sub>). Another diagonal bank pair is Bank<sub>1</sub>-Bank<sub>2</sub>. Write failure should be tested by writing to the address pairs (A<sub>0</sub>-D<sub>0</sub>, A<sub>0</sub>-D<sub>1</sub>, ..., A<sub>0</sub>-D<sub>X</sub>, A<sub>1</sub>-D<sub>0</sub>, A<sub>1</sub>-D<sub>1</sub>, ..., A<sub>1</sub>-D<sub>X-1</sub>, ..., A<sub>X-1</sub>-D<sub>0</sub> and similarly for Bank<sub>1</sub>-Bank<sub>2</sub>) simultaneously and detecting write failure in both addresses. Note that A<sub>X</sub>-B<sub>Y</sub>/C<sub>Y</sub>-D<sub>Y</sub> represents the furthest addresses that can affect each other.

Case-3 incurs highest  $R_{int}$  (addresses are physically distant) and the bounce needs to propagate through metal layer M<sub>3</sub> like Case-1. We call two addresses of two banks corresponding to Case-1/Case-2/Case-3 as address-pairs as the impact of supply noise needs to be tested on them during parallel accesses to them.

##### C. Proposed Test Time Compression Technique & Algorithm

Testing all possible cases requires significant test time which is not acceptable for mass production. Therefore, techniques for test time compression are required. It should be noted that the main reason for high test time is the long write latency. Therefore, we propose the following techniques to

reduce the write latency during testing:

*i) Wordline Overdrive (WL OV):* This technique is implemented by increasing the wordline voltage during write in test mode. WL OV reduces the access transistor resistance. Therefore, the bits may draw more current with the same bitline and sourceline voltage. Higher  $I_{\text{write}}$  may change the supply noise profile and test mode might not match with the operation mode. Fig. 14(a) shows RRAM I-V curve with 500mV of WL OV for both  $0 \rightarrow 1$  and  $1 \rightarrow 0$  compared to the case of Fig. 4(a). Write latency reduces (4ns from 10ns) and write current increases for both writes.

We mentioned earlier that we need  $0 \rightarrow 1$  transition to test a bit and we need to test each bit of all addresses. This means that a single address needs to be tested 512 times (for 512bit cache line) with appropriate test pattern. We call this number  $N_{\text{repeat}}$ . WL OV can help to reduce this number. Average write current for  $1 \rightarrow 0$ ,  $0 \rightarrow 0$  and  $0 \rightarrow 1$  increases to  $118.16\mu\text{A}$ ,  $126.72\mu\text{A}$  and  $90.57\mu\text{A}$  from  $80.08\mu\text{A}$ ,  $110.01\mu\text{A}$  and  $84.34\mu\text{A}$  respectively. Therefore, test pattern with combination of the  $0 \rightarrow 0$ ,  $0 \rightarrow 1$  and  $1 \rightarrow 0$  write patterns can be selected to maintain the same worst-case write current as 512-writes of  $0 \rightarrow 0$  as normal mode (without WL OV). This approach reduces  $N_{\text{repeat}}$ . A rough estimation shows that each  $0 \rightarrow 1$  reduces total  $I_{\text{write}}$  (from worst-case) by  $26\mu\text{A}$  whereas one  $0 \rightarrow 0$  and one  $0 \rightarrow 1$  increases total  $I_{\text{write}}$  by  $(8+16.7)\mu\text{A}=24.7\mu\text{A}$ . This means that 170 writes of  $0 \rightarrow 1$ , 172 writes of  $0 \rightarrow 0$  and 170 writes of  $1 \rightarrow 0$  (in a 512bit data) yield almost the same total  $I_{\text{write}}$  as 512-writes of  $0 \rightarrow 0$ . Therefore, one address can be tested 3 times ( $N_{\text{repeat}} = 3$ ) where

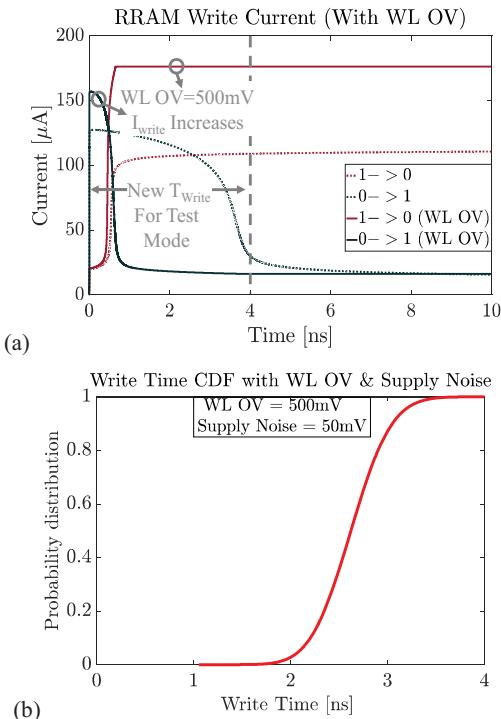


Fig. 14 (a) RRAM I-V curve with 500mV of WL OV for both  $0 \rightarrow 1$  and  $1 \rightarrow 0$ . Write latency reduces and write current increases for both writes; and, (b) write time CDF with 500mV of WL OV and 50mV of additional supply noise. All the bits pass with write time = 4ns.

170, 171 and 171 bits can be tested each time.

*ii) Ending write operation early:* We observe that the main part of the write operation is completed in first 4ns/2ns for the RRAM shown in Fig. 4(a)/Fig. 11(b) respectively. The write time is still kept as 10ns for two reasons: i) the resistance value reaches the target HIGH state (for writing  $0 \rightarrow 1$ ); and, ii) weakest bit (due to process variation) gets written. We have mentioned earlier that the resistance of the cell is not required to reach the target HIGH state (Fig. 10(b)) during  $0 \rightarrow 1$  writing. If the resistance crosses the resistance of the reference cell by a margin (we considered the margin as  $75\text{K}\Omega$ ), the bit can still be read correctly within the target read latency (0.5ns in our case). Furthermore, write time variation can be tightened by WL OV. Therefore, the memory bits can be written successfully with a shorter time by WL OV and by ending the write operation early.

We implemented 500mV of WL OV and 50mV of additional supply noise and did a 300-point Monte-Carlo analysis on write operation with  $3\sigma$  of 5% of oxide gap for  $R_L$  with a mean of gap =  $0.530\text{n}$ . The result shows that all bits pass write operation successfully with 4ns of write time (Fig. 14(b)). If the supply noise is increased, the write time needs to be increased to achieve the desired final resistance ( $75\text{K}\Omega$  of margin over reference resistance) for a successful read operation. Therefore, WL OV during test mode can reduce the write time to 4ns and still model the supply noise generated during normal operation mode.

It can be noted that architectural choices can also reduce supply noise impact and reduce test time significantly. For example, parallel accesses can be allowed in a way that Case-2 never needs to be tested. This can be achieved by disabling parallel accesses in Bank<sub>0</sub>-Bank<sub>2</sub>, Bank<sub>1</sub>-Bank<sub>3</sub> pairs.

**Proposed test algorithm:** Let's call the required old data as  $\text{Init}_1/\text{Init}_2/\text{Init}_3$  and new data as  $\text{TP}_1/\text{TP}_2/\text{TP}_3$  to test 170/171/171 bits respectively in a 512bit cache line. For example, for an 8bit cache line one possible choice can be  $\text{Init}_1=0b00111000$ ,  $\text{Init}_2=0b00000111$ ,  $\text{Init}_3=0b00111111$  and  $\text{TP}_1=0b00000111$ ,  $\text{TP}_2=0b00111000$  and  $\text{TP}_3=0b11000000$ . This will test 3bits/3bits/2bits respectively while  $\text{Init} \rightarrow \text{TP}$  writing in all cases are almost similar to a worst-case total write current (8bits of  $0 \rightarrow 0$  in normal operation mode). Note that the bold digits indicate the bits of interest during each test. The steps (each one is performed sequentially) to test write failure due to supply noise from parallel writes are:

1. Write  $\text{Init}_1$  to one address of an address-pair (let's say  $A_0$ );
2. Write  $\text{Init}_1$  to the other address of address-pair (let's say  $B_0$ );
3. Write  $\text{Init}_1$  to one address of second address-pair from another bank-pair (let's say  $C_0$ );
4. Write  $\text{Init}_1$  to the other address of second address-pair from another bank-pair (let's say  $D_0$ );
5. Read  $A_0/B_0/C_0/D_0$  simultaneously to verify write success of  $\text{Init}_1$  (write success of Step 1, 2, 3 and 4);
6. Write  $\text{TP}_1$  to 1<sup>st</sup> address-pair simultaneously ( $A_0-B_0$ );

7. Write  $TP_1$  to 2<sup>nd</sup> address-pair simultaneously ( $C_0$ - $D_0$ );
8. Read  $A_0$ / $B_0$ / $C_0$ / $D_0$  simultaneously to verify write success of  $TP_1$  (write success of Step 6 and 7);
9. Repeat steps 1 to 8 with  $Init_2$ - $TP_2$  and then,  $Init_3$ - $TP_3$  patterns for  $A_0$ - $B_0$  and  $C_0$ - $D_0$  address-pairs;
10. Repeat steps 1 to 9 for all address-pairs of Case-1;
11. Repeat step 10 for Case-2 and then Case-3.

Step-6/7 tests both addresses  $A_0$  and  $B_0$  /  $C_0$  and  $D_0$  at the same time for supply noise-induced write failure. Step 5/8 minimizes the test time by sharing read for all the banks. Supply Noise Test Algorithm shows Case-1 testing which can also be used for Case-2/Case-3 by replacing N with X/Y respectively. The symbol (:) means the operations are performed in parallel. The proposed algorithm is given below:

#### Supply Noise Test Algorithm

##### Case-1

```

for(i=0, i<=N, i++)
{
    for(j=1, i<=3, j++)
    {
        (wInitj)Ai; (wInitj)Bi; (wInitj)Ci; (wInitj)Di;
        (rZ1)Ai; (rZ2)Bi; (rZ3)Ci; (rZ4)Di;
        If (Z1, Z2, Z3, Z4 ≠ Initj) exit();
        (wTPj)Ai : (wTPj)Bi;
        (wTPj)Ci : (wTPj)Di;
        (rZ1)Ai : (rZ2)Bi : (rZ3)Ci : (rZ4)Di;
        If (Z1, Z2, Z3, Z4 ≠ TPj) exit();
    }
}

```

#### D. Test Time Analysis

The value of X and Y for testing Case-2 and 3 depends on the memory implementation. We estimate  $X = 4916$  and  $Y = 4096$  for our implementation. Total number of addresses in a bank is N (= 16K in our case). The number of Bank-pairs in all cases is  $N_{pair}$  (= 2 in our case) and  $N_{repeat}$  is 3 (512 without the proposed compression technique).

The total test time for testing supply noise impact can be formulated as below:

$$T_{Total} = T_{Case-1} + T_{Case-2} + T_{Case-3}$$

$$T_{Case-1} = N_{repeat} * 2 * N_{pair} * N * T_{write} + N_{repeat} * N_{pair} * N * T_{write} + 2 * N * N_{repeat} * T_{read}$$

The first term of  $T_{Case-1}$  is for writing Initial data pattern to both addresses of address-pair (Step1, 2, 3, 4), the second term is for parallel writing with test pattern (Step 6, 7) and the third term is for write success validation (Step 5,8). We have ignored the read time for the last address-pair (= 0.5ns) and read time for checking the initial data pattern write success (=  $N * N_{repeat} * 0.5$ ns).  $T_{Case-2}$  and  $T_{Case-3}$  can be formulated similarly

by replacing N with  $\frac{X(X+1)}{2}$  and  $\frac{Y(Y+1)}{2}$ . We estimate that  $T_{Case-1}$ ,  $T_{Case-2}$  and  $T_{Case-3}$  are 0.511s, 383.657s and 262.057s in base-case (without compression) which totals to 646.225s. Typically, total target test time for a chip is 2-3sec [32]. Therefore, the base-case test time is not acceptable. However,  $T_{Case-1}$ ,  $T_{Case-2}$  and  $T_{Case-3}$  reduces to 1.229ms, 0.9427s and 0.6293s which totals to 1.573s if write time is reduced using the proposed technique. Therefore, 410.82X test time compression can be achieved with the proposed technique.

*Test energy:* In the proposed test method, we incur almost the same total write current with same bitline/sourceline voltage (different wordline voltage is not an issue as gate current increment is insignificant) and incurs lower test time due to lower write time. Therefore, the proposed method saves a total energy of

$$\begin{aligned}
 & V_{dd} * I_{write} * \Delta T_{Test} \cdot Time_{compression} \\
 & = 2.2V * 56.32mA * 644.652s \\
 & = 79.875J
 \end{aligned}$$

#### V. DISCUSSION

##### A. Design Techniques to Mitigate Supply Noise [21]:

Following design techniques can prevent or alleviate the supply noise impact on parallel read/write operation:

i) *Sequential read/write access:* A naïve solution is to implement non-pipelined access only. However, this hurts the system throughput as several clock cycles will be required to execute one read/write operation.

ii) *Intelligent architecture:* Parallel-operations of different processes can be initiated to addresses with highest possible  $R_{int}$ . However, this will alleviate the issue to some extent only.

iii) *Good quality  $V_{dd}/V_{ss}$  grid:* A good  $V_{dd}/V_{ss}$  grid reduces  $R_1$  (in Fig. 5) which in turn reduces supply noise. However, as the technology is scaled down,  $R_1$  might increase eventually. Therefore, this technique cannot eliminate the issue.

iv) *Power rail separation for each bank:* Separation of supply and gnd rails between parallel accessed banks will prevent propagation of supply noise. However, this will incur significant area/design overhead (power regulators and separate metal grids needed). Furthermore, separating the rail reduces the rail capacitance which is not desirable (high power rail capacitance is desired for supply noise cancellation).

v) *Slowing system clock:* Higher  $T_{Clock}$  gives more time to read/write at lower headroom voltage to fix latency failures. However,  $T_{clock}$  must be at least twice (2X throughput loss) to prevent write failure for just 80mV of noise (result extended from Fig. 10(b)).

Above techniques can alleviate supply noise. However, the issue might still persist as NVMs incur high process variation. Therefore, there might be some weak bits which will still be

vulnerable to parallel-access-inflicted supply noise.

### B. Consideration to other NVMs:

Although the study on supply noise impact is carried out for RRAM LLC, we believe that a broad range of NVMs is going to face this issue. Therefore, NVMs should be tested for supply noise-induced error. Note that the proposed test technique can be implemented for other NVMs.

## VI. CONCLUSION

In this work, we summarize that high write current of NVM can lead to supply noise which propagates to the neighboring banks and can affect parallel read/write. Therefore, NVMs should be tested for supply noise-inflicted errors. We propose test techniques to maximize and catch supply noise induced failures. Our analysis indicate that test time and energy could prohibitively high to validate all possible test cases. Therefore, we propose test compression techniques such as, wordline overdrive and early write termination to reduce supply noise test time. We also suggested design techniques to minimize supply noise.

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