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SRAM Dynamic Stability Verification by Reachability Analysis with Consideration of Threshold Voltage Variation

Yang Song¹, Hao Yu^{*2}, Sai Manoj² and Guoyong Shi¹

¹School of Microelectronics, Shanghai Jiao Tong University

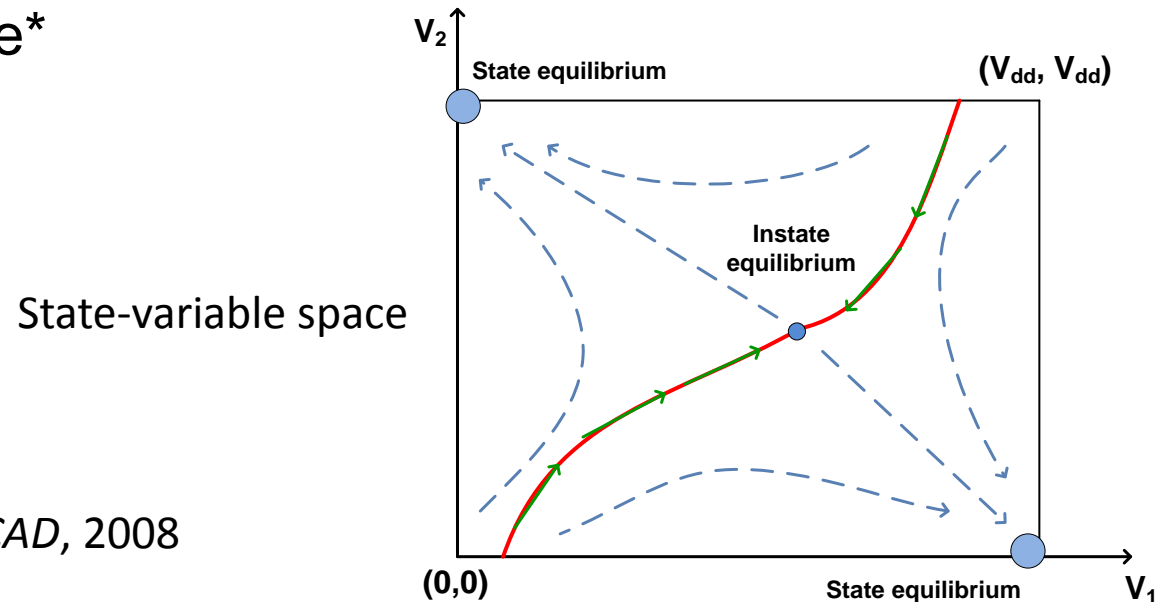
²School of Electrical and Electronic Engineering, Nanyang Technological University

Outline

- **SRAM failure analysis**
- **SRAM nonlinear dynamics**
- **Verification by reachability analysis**
- **Experimental results**
- **Summary**

SRAM Failure Analysis

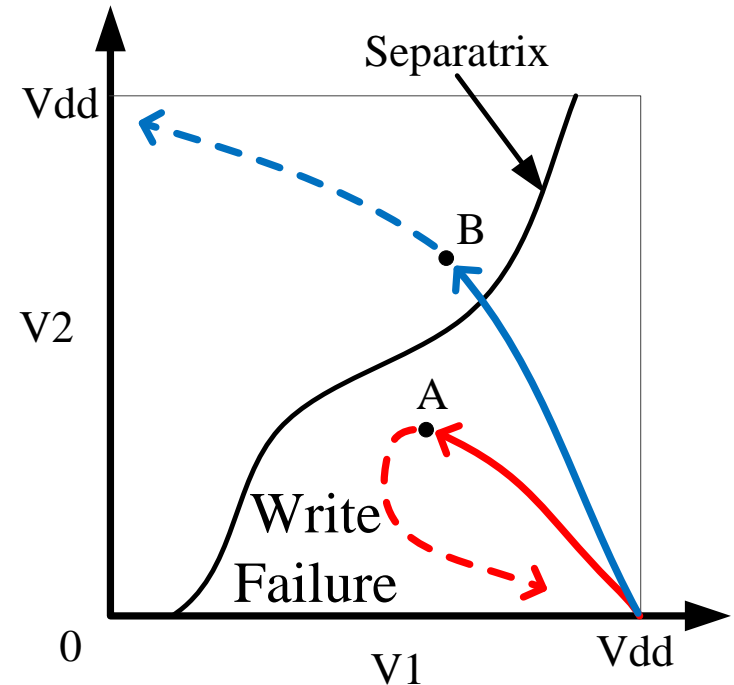
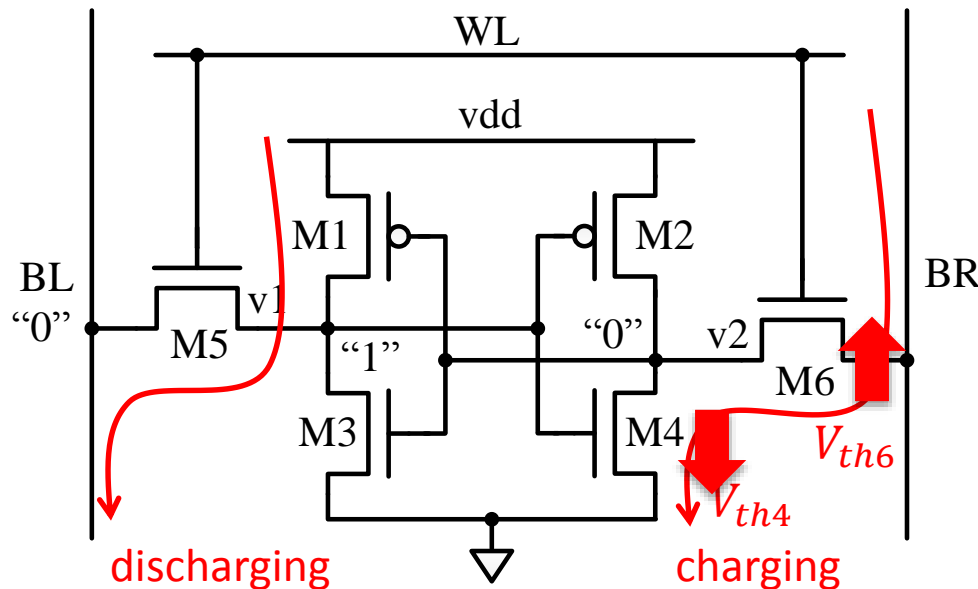
- Becomes difficult as technology scales down
 - Process variations, mismatch among transistors cause failures
- Nonlinear dynamics of SRAM
- Physical mechanisms of failures
 - Separatrix: boundary separating two stable regions in state-variable space*



* W. Dong and et.al. *ICCAD*, 2008

Write Failure Analysis

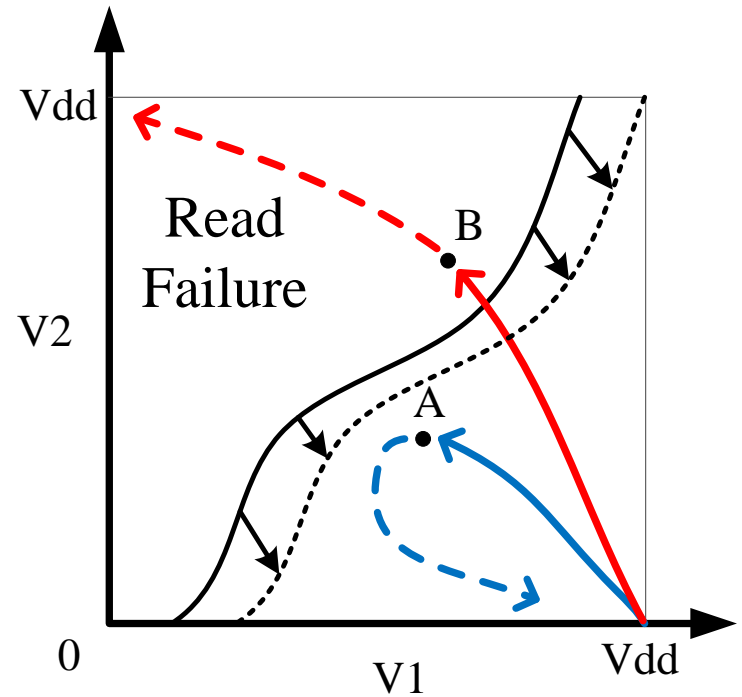
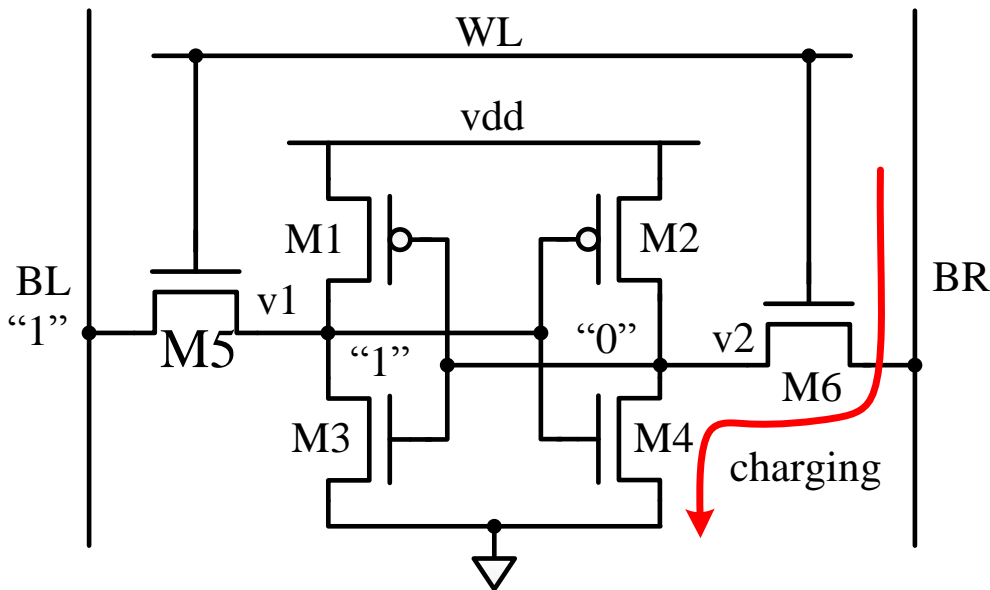
- Initial state $(v_1, v_2) = (v_{dd}, 0)$
- Target state $(v_1, v_2) = (0, v_{dd})$



- Threshold voltage variation causes difficulty to move state point to the target state.

Read Failure Analysis

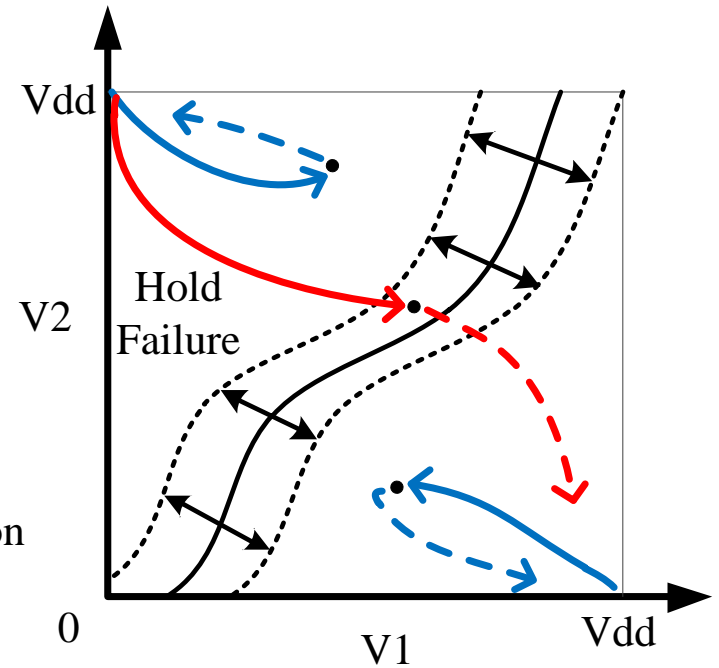
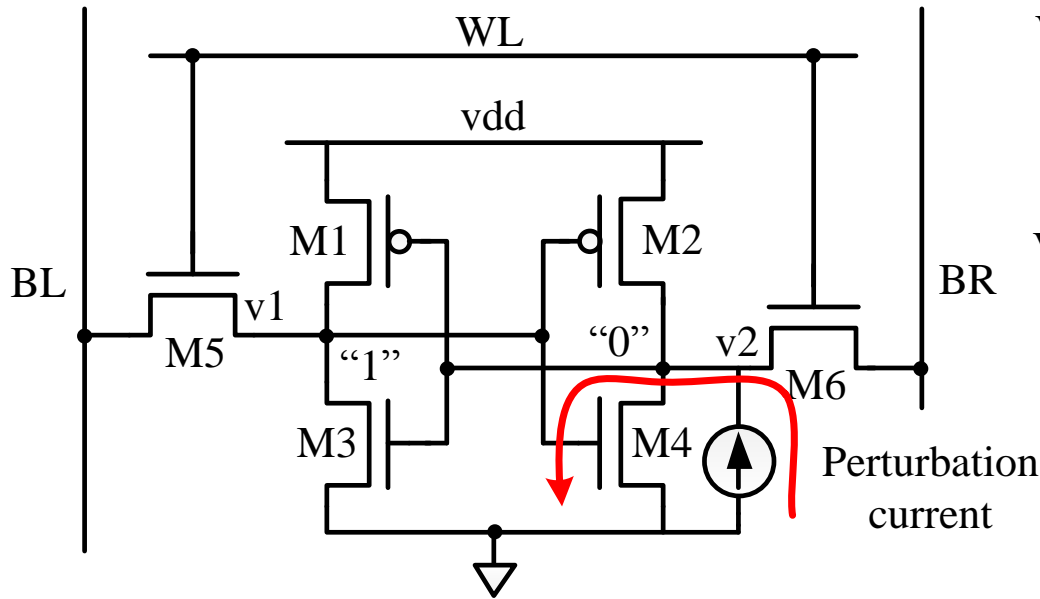
- Internal state is aimed to maintain regardless perturbation during read operation.



- Mismatch between M4 and M6
- Mismatch among M1-4

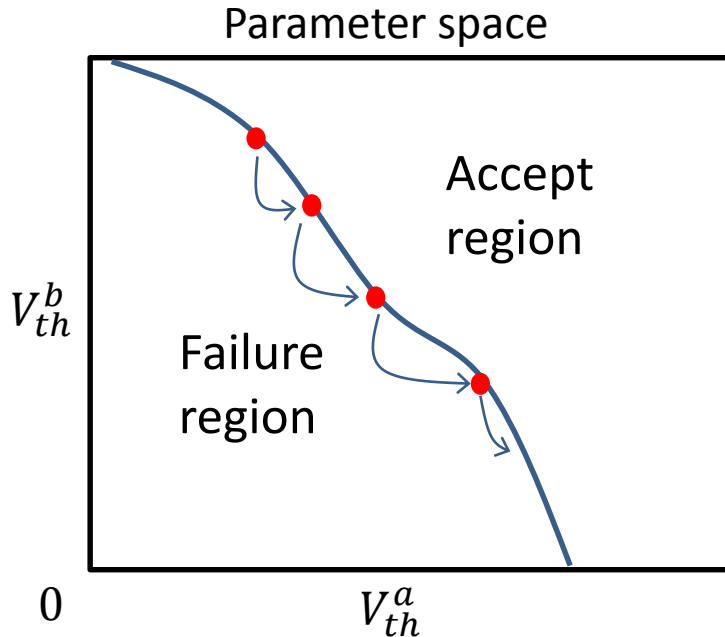
Hold Failure Analysis

- Hold failure happens when the SRAM fails to retain the stored data.



- Threshold variations in M1-4 affect the position of seperatrix.

Previous Work

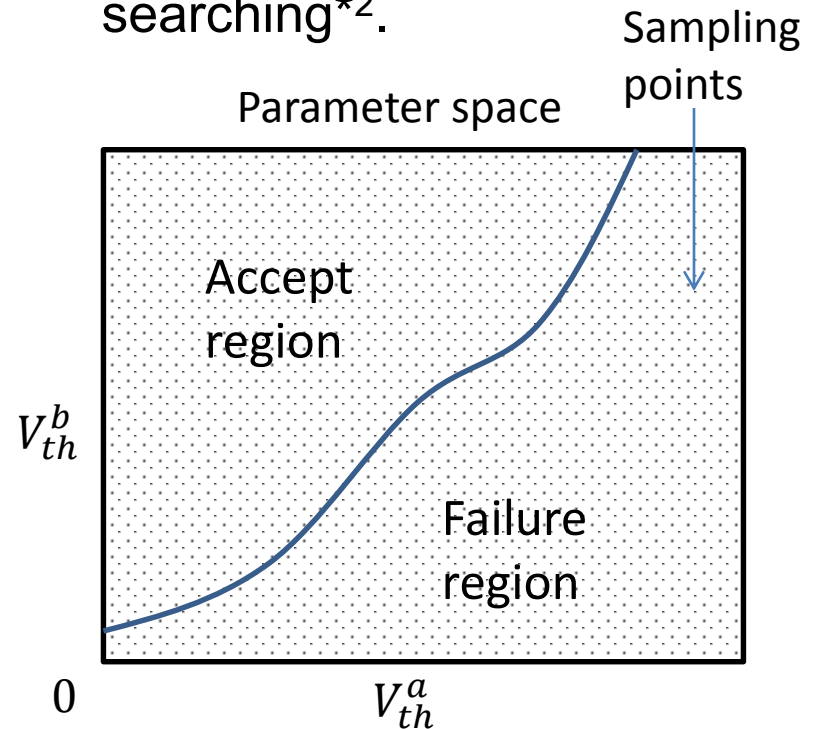


- Search for points on the boundary of failure region in the parameter space*1.
- Confined in 2-D space, i.e. only two parameters considered.

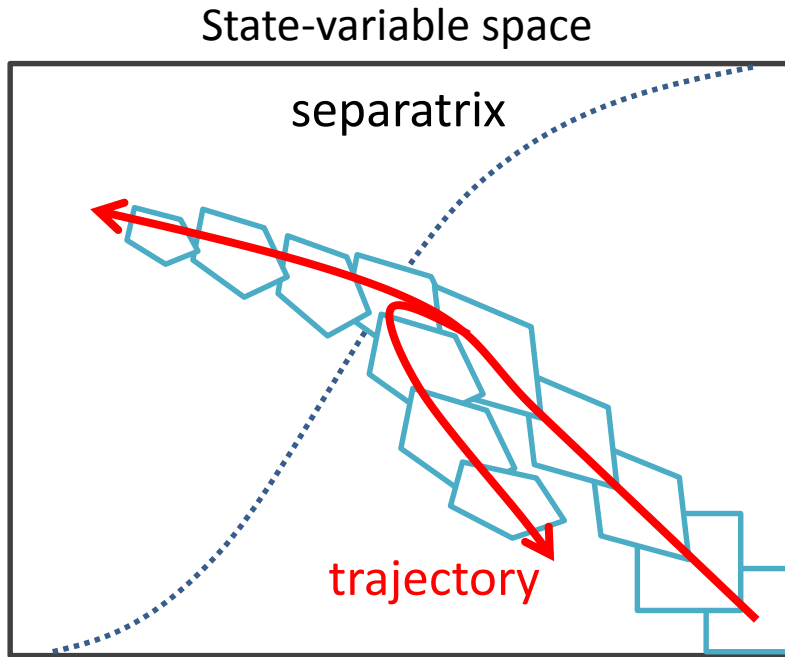
*1 W. Dong and et.al. *ICCAD*, 2008

*2 D. E. Khalil and et.al. *IEEE Tran. on VLSI*, Dec 2008

- Statistical method: sampling within the region for searching*2.



Motivation

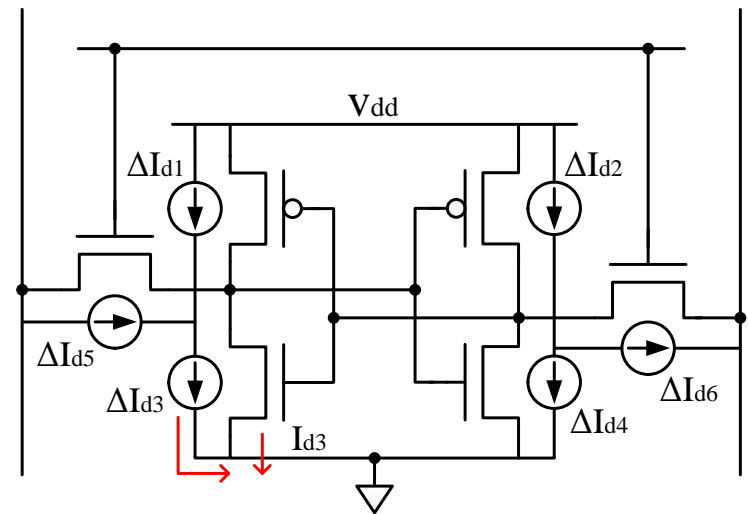


- Fast verification of SRAM nonlinear dynamics by reachability analysis
 - Variations from multiple sources considered at the same time

- Threshold variation is modeled as ad-hoc current source at input

$$I_d + \Delta I_d = \frac{1}{2} k \frac{W}{L} [V_{gs} - (V_{th} + \Delta V_{th})]^2$$

$$\Delta I_d \approx -k \frac{W}{L} (V_{gs} - V_{th}) \Delta V_{th}$$



SRAM Nonlinear Dynamics

- One nominal point on the trajectory:

$$\dot{x} = f(z(t)), \quad z^T(t) = [x^T, u^T].$$

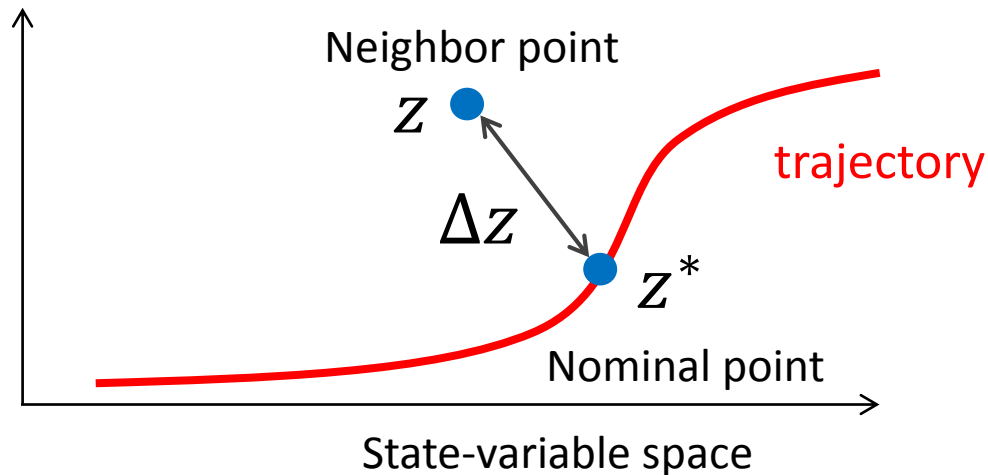
- One operating point in the neighborhood of the nominal point:

$$\dot{x} = f(z^*) + \frac{\partial f}{\partial z} \Big|_{z=z^*} (z - z^*) + \frac{1}{2} (z - z^*)^T \cdot \frac{\partial^2 f}{\partial z^2} \Big|_{z=\xi} \cdot (z - z^*),$$

1st order
Taylor term

2nd order
Residue

mean value
theorem



SRAM Nonlinear Dynamics (cnt'd)

$$\dot{x} = f(z^*) + \frac{\partial f}{\partial z} \Big|_{z=z^*} (z - z^*) + \frac{1}{2} (z - z^*)^T \cdot \frac{\partial^2 f}{\partial z^2} \Big|_{z=\xi} \cdot (z - z^*)$$

$$\dot{x} = f(x^*, u^*) + \frac{\partial f}{\partial x} \Big|_{x=x^*} (x - x^*) + \frac{\partial f}{\partial u} \Big|_{u=u^*} (u - u^*) + L$$

Linearization error L

$$\dot{x} = \underline{f(x^*, u^*)} + A(x - x^*) + B(u - u^*) + L$$

$$A = \frac{\partial f}{\partial x} \Big|_{x=x^*}$$

$$B = \frac{\partial f}{\partial u} \Big|_{u=u^*}$$

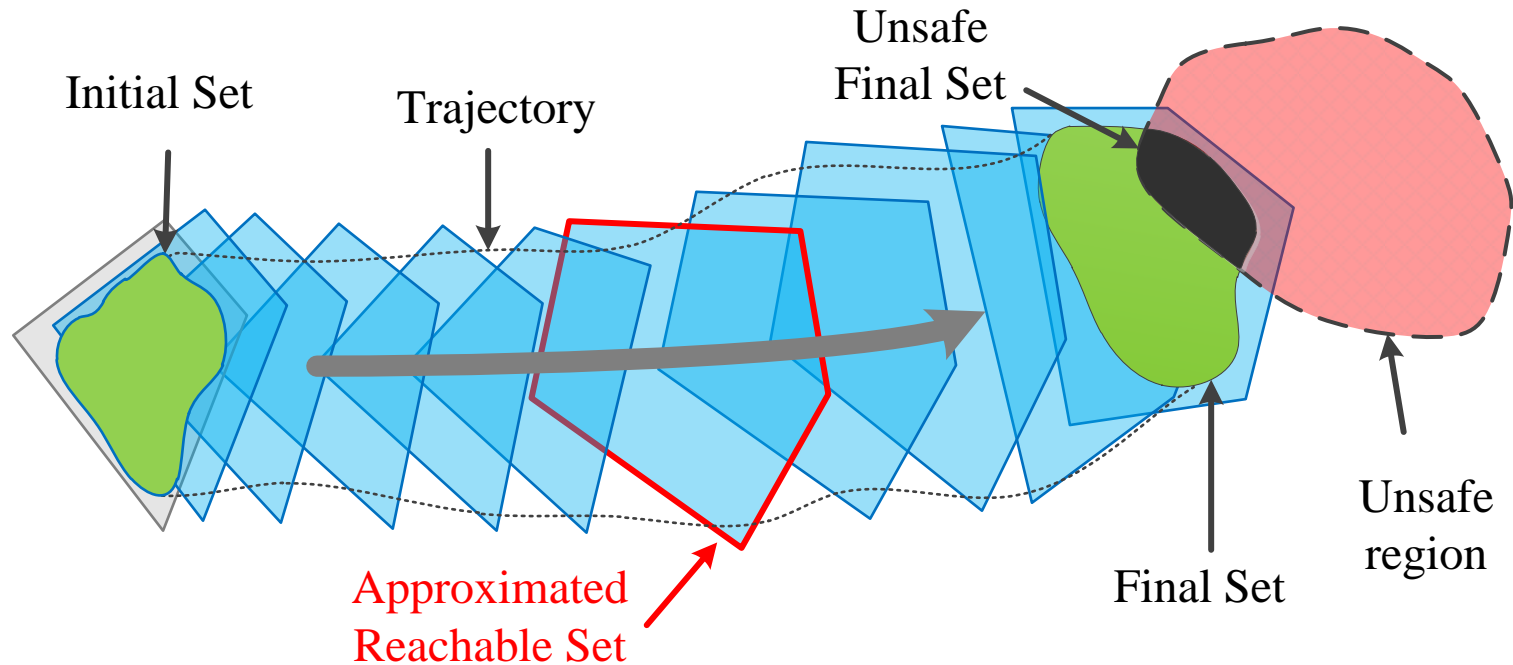
Nonlinear dynamics of nominal point

Nonlinear dynamics for nominal point

$$\begin{cases} \dot{x}^* = f(x^*, u^*) \\ (\dot{x} - \dot{x}^*) = A(x - x^*) + B(u - u^*) + L \end{cases}$$

Linear dynamics for distance from nominal point

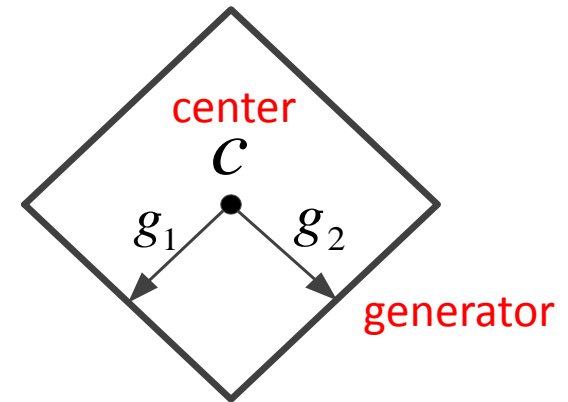
Reachability Analysis: Zonotope



Zonotope

Set of points in n -dimensional polygon with generator g_i

$$z = c + \sum_{i=1}^e \beta_i g_i, -1 \leq \beta_i \leq 1$$



Reachability Analysis: Linear Multi-Step

$$\dot{x}^* = f(x^*, u^*) \quad \text{Transient simulation}$$

$$(x - x^*) = A(x - x^*) + B(u - u^*) + L$$



Calculation of generators

$$\dot{G} = AG \oplus BU \oplus L,$$

$$G = [g_1, g_2, \dots, g_n]$$

Generator matrix



Backward Euler with h time-step

$$\dot{G}_k = \underbrace{(I - hA)^{-1} G_{k-1}}_{\text{Initial state solution}} \oplus \underbrace{hBU_k}_{\text{Input solution}} \oplus \underbrace{hL_k}_{\text{Linearization error}}$$

Initial state solution

Input
solution

Linearization
error

$$x = x^* + \sum_{i=1}^n \beta_i g_i, \quad -1 \leq \beta_i \leq 1$$

Zonotope for state vector

$$u = u^* + \sum_{i=1}^m \alpha_i \overrightarrow{\Delta I_d^i}, \quad -1 \leq \alpha_i \leq 1$$

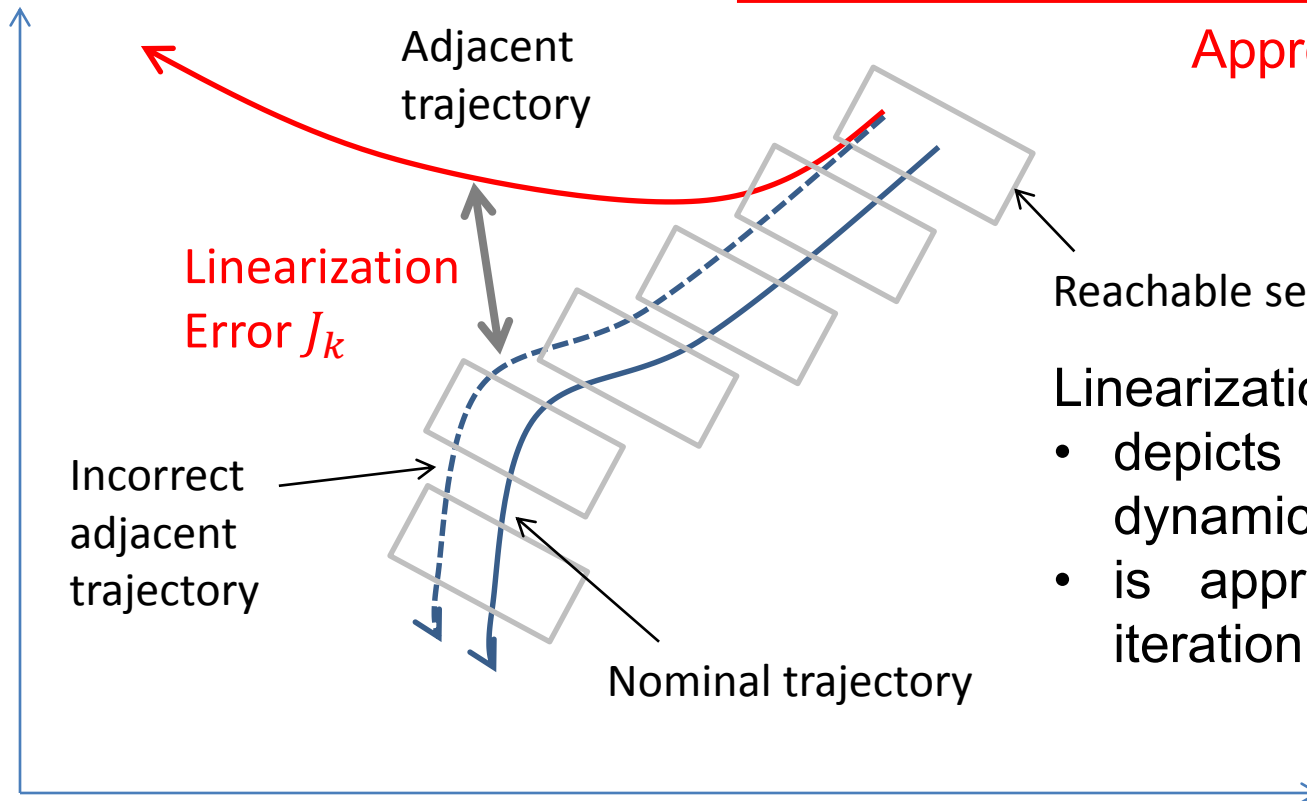
Zonotope for noise current
vector with given variation
range

Linearization Error

$$J_k = \frac{1}{2} (z - z^*)^T \cdot \frac{\partial^2 f_k}{\partial z^2} \Big|_{z=\xi} \cdot (z - z^*)$$

$$L_k = \frac{1}{2} \max |z - z^*|^T \cdot \max \left| \frac{\partial^2 f_k}{\partial z^2} \Big|_{z=\xi} \right| \cdot \max |z - z^*|$$

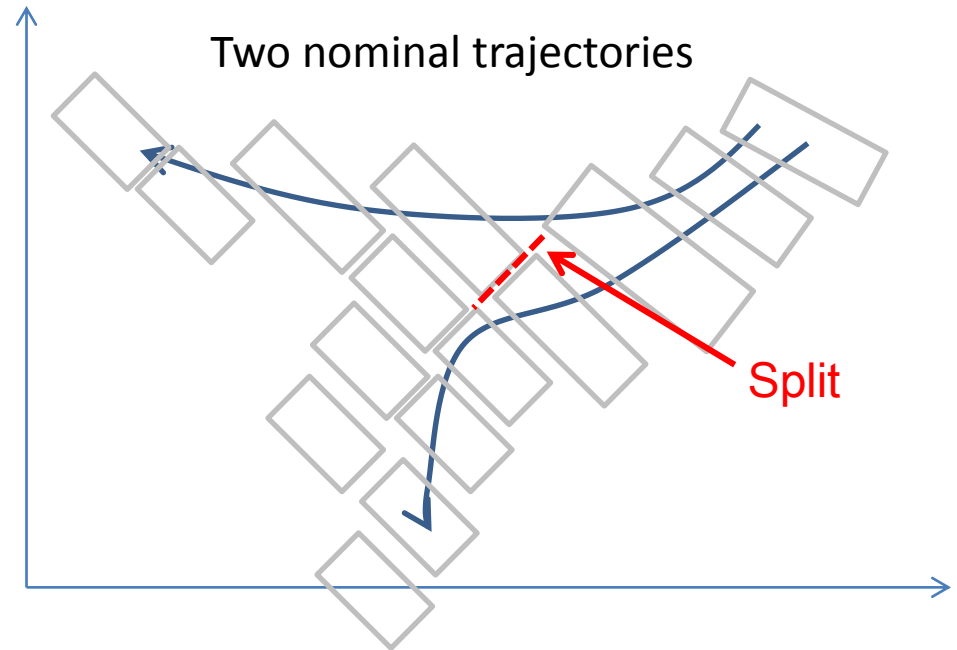
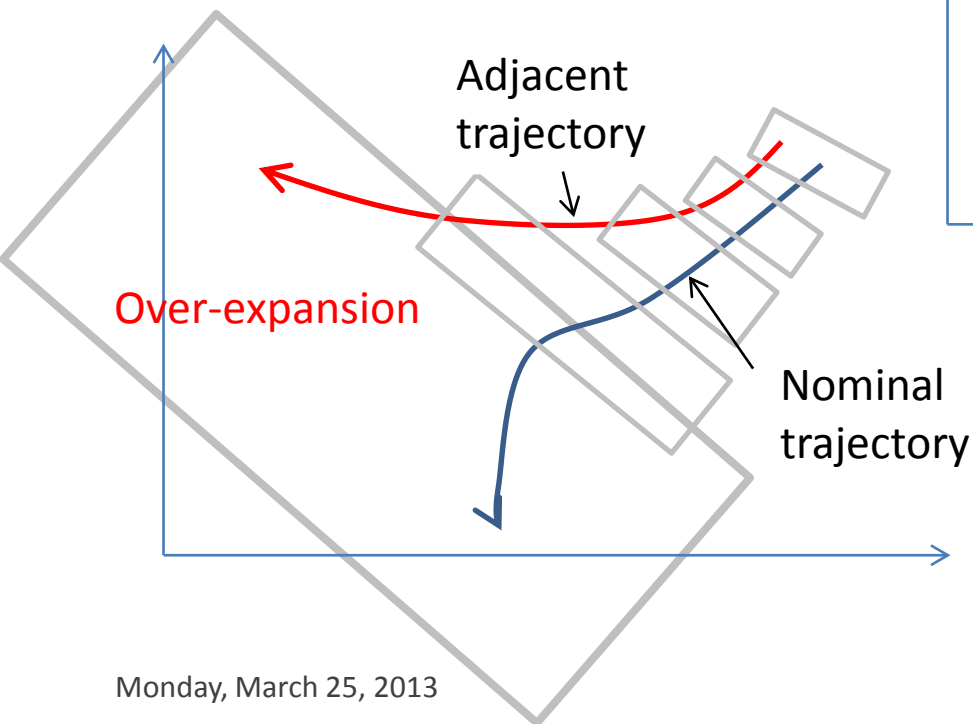
Approximation



- Linearization error
- depicts the nonlinear dynamics.
 - is approximated at each iteration step.

Reachable Set Refinement

- Reachable set is over-expanded without refinement.
- Zonotope is split into smaller ones confine linearization error in each set.



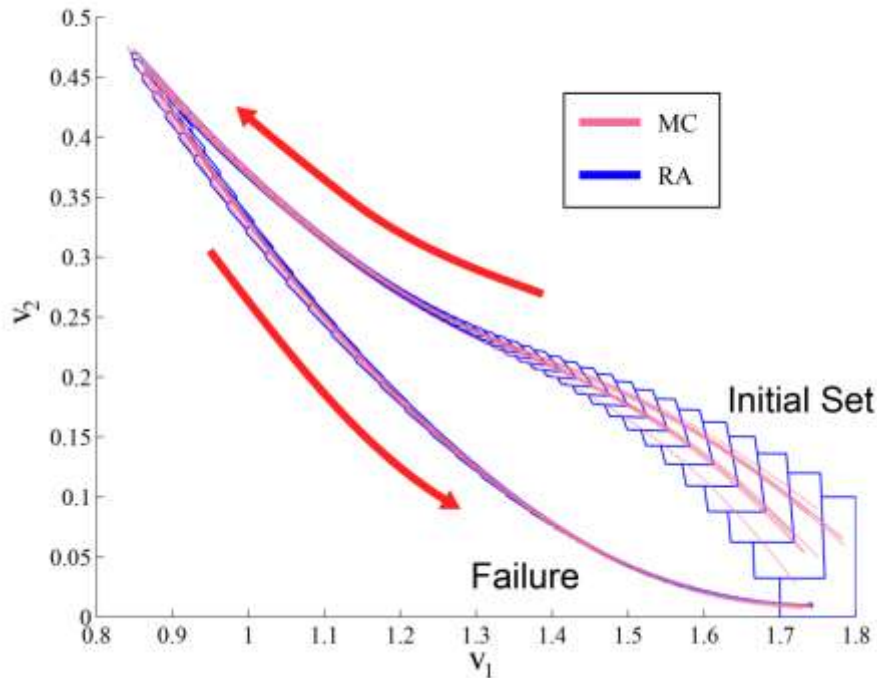
$$\text{if } \mathbf{IH}(hL_k) \notin [-\varepsilon, \varepsilon], \\ \Rightarrow \textit{split set}$$

- A new trajectory is created.

Experimental Results

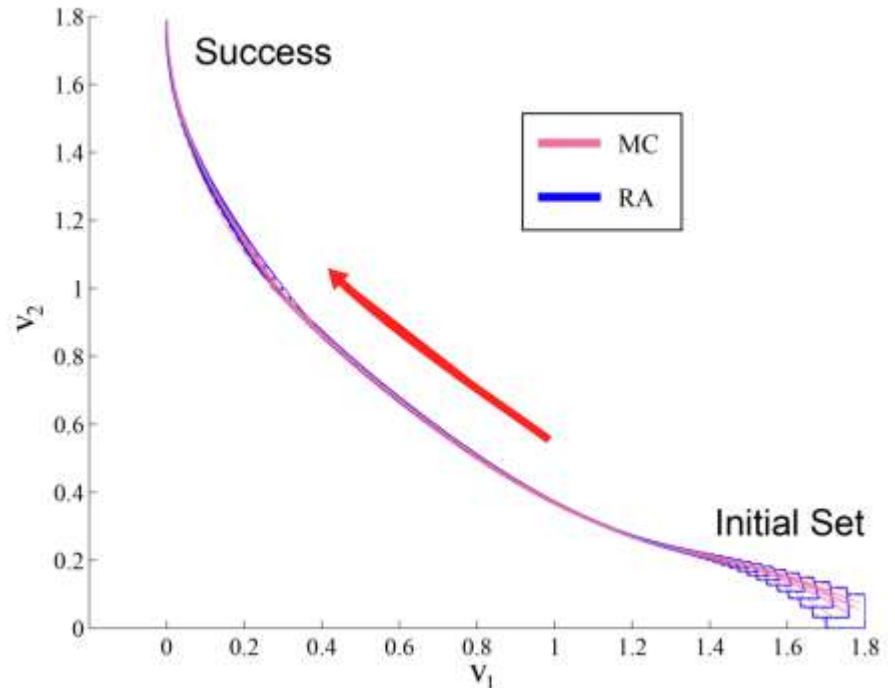
- Implemented in Matlab 7.12 and C
- Platform
 - Core i5 3.2GHz processor
 - 8GB memory
- Simulation parameters of SRAM
 - Initial state $v_1 \in [1.7, 1.8], v_2 \in [0, 0.1]$
 - Variation range $\Delta I_d = \delta k \frac{W}{L} (V_{gs} - V_{th}) V_{th}, \delta = 1\%, 5\%, 10\%$

Write Operation



- Write pulse is set as 50ns with relative threshold variation of 5% in each transistor.
- Write operation fails.

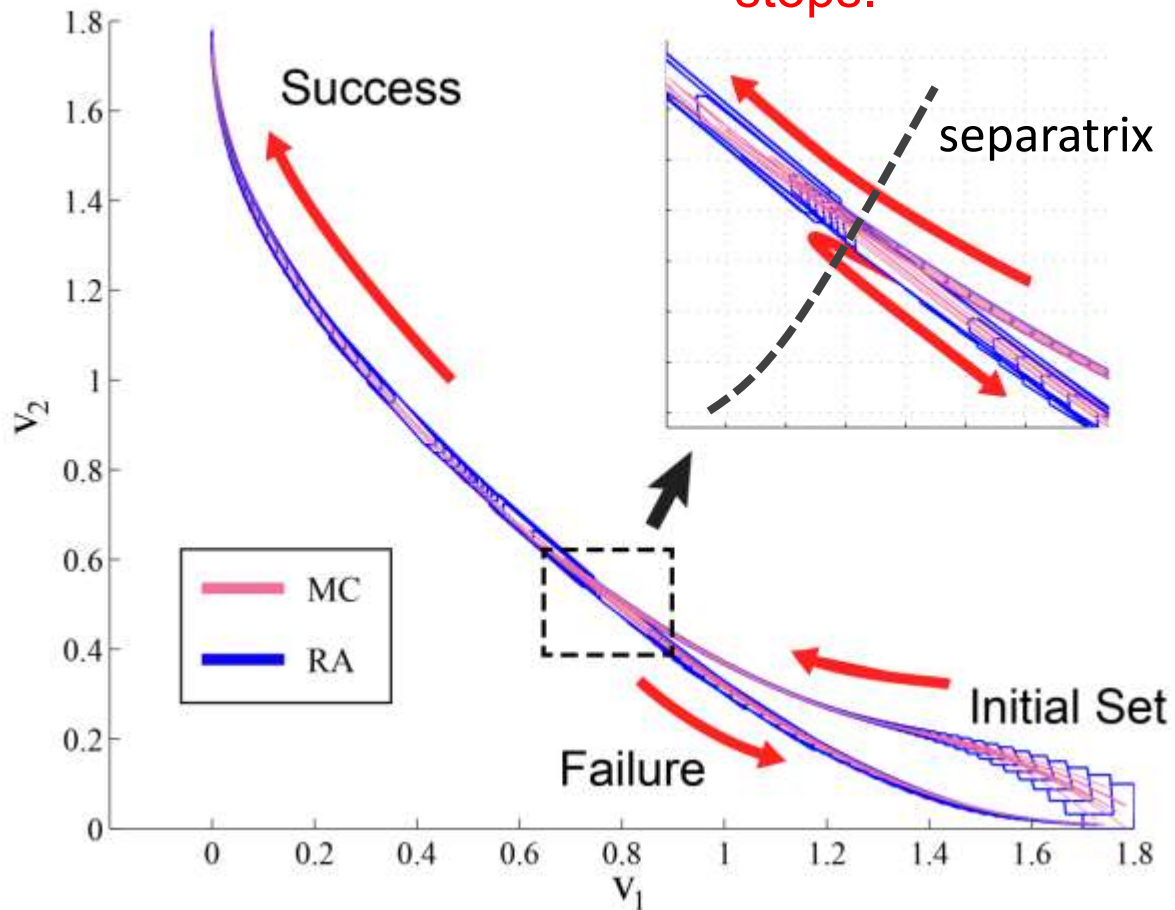
- Write pulse is set as 70ns.
- Write operation succeeds.



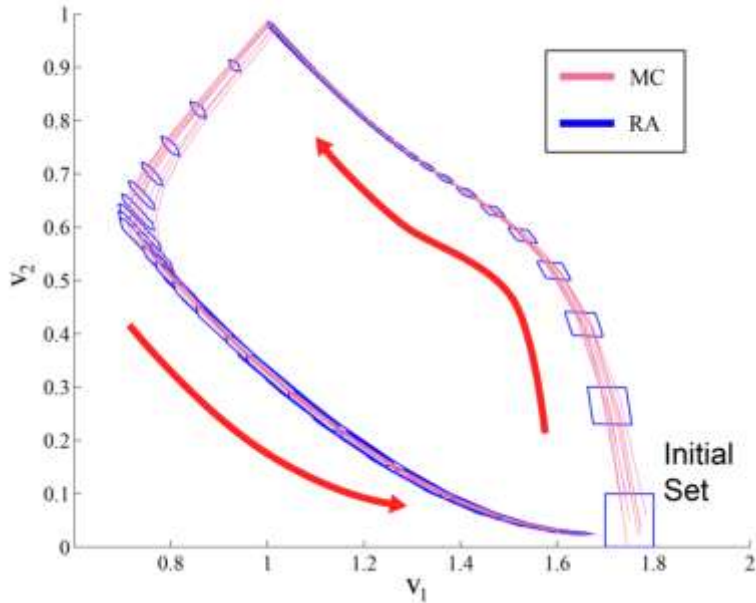
Write Operation

- Write pulse is set as 60ns.
- Write operation fails.

Trajectory splits near separatrix after write pulse stops.

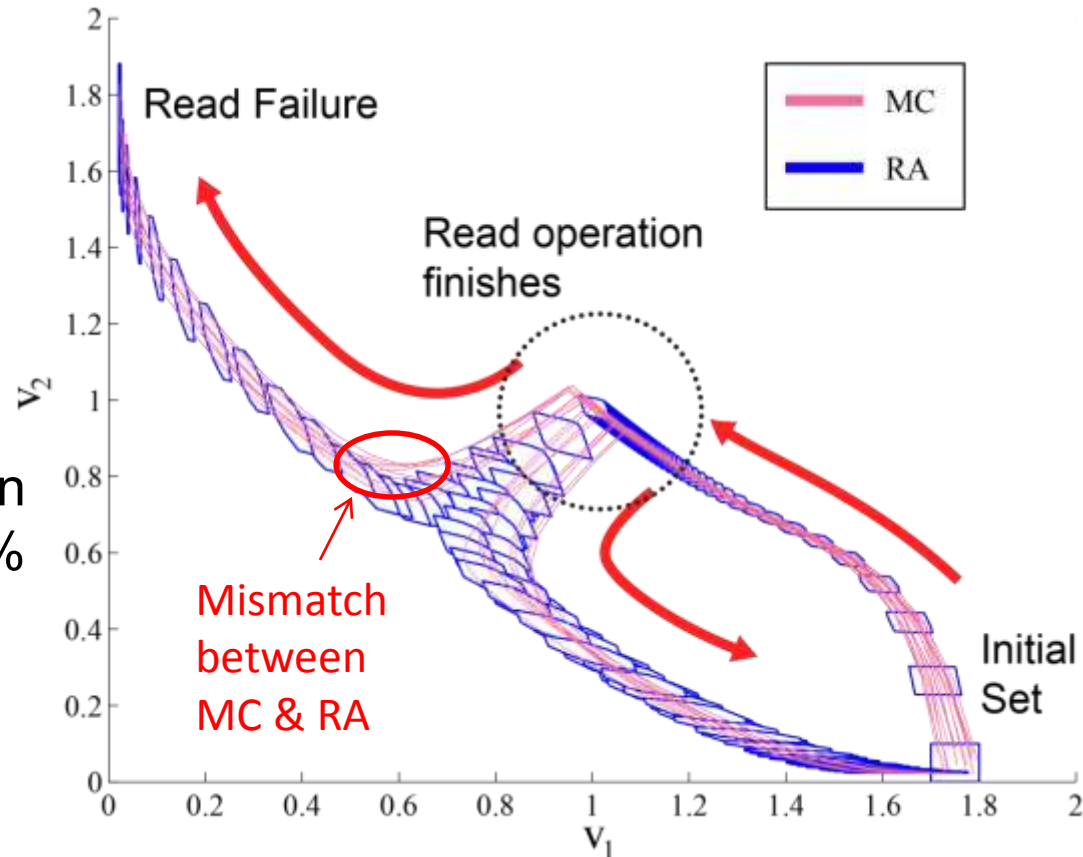


Read Operation



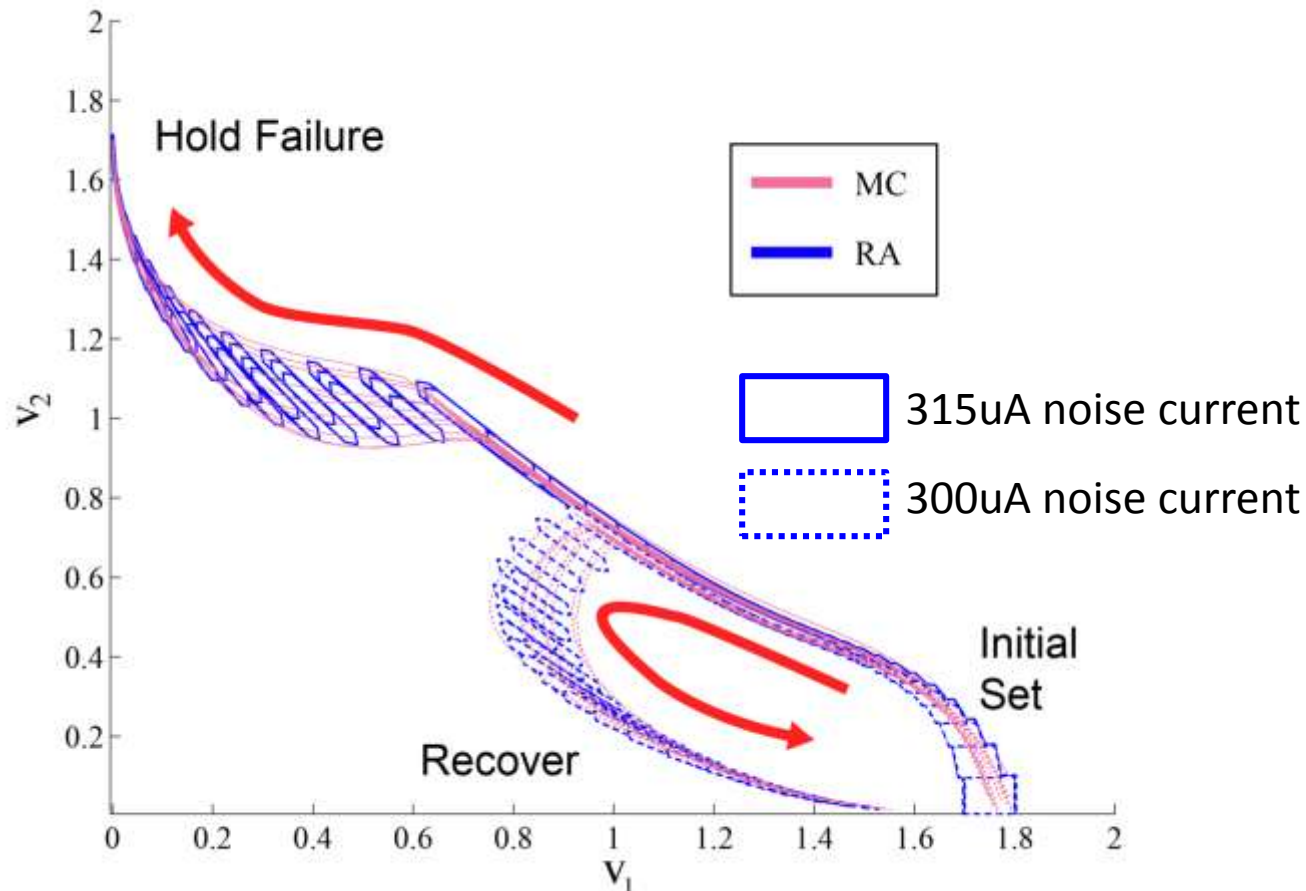
- Relative threshold variation in each transistor is set as 1% with 50ns read pulse.
- Read operation succeeds.

- Relative threshold variation in each transistor is set as 5%.
- Read operation fails.



Hold Operation

- Injected noise current lasts 12.5ns.
- Relative threshold variation in each transistor is set as 5%



Performance

Pulse(ns)	Threshold Variation	Reachability Analysis (s)	Monte Carlo (s)	Speedup
50	1%	12.71	5635.57	443.38X
	5%	13.13	5817.71	443.01X
	10%	12.63	6078.68	481.24X
60	1%	52.70	6224.09	118.09X
	5%	52.58	6535.35	124.29X
	10%	52.68	6387.28	121.25X
70	1%	13.72	5931.76	432.32X
	5%	14.43	6245.45	432.73X
	10%	13.21	6348.54	480.45X

Monte- Carlo setup with 500 samples are considered

Summary

- **Introduced SRAM failure mechanisms in the state space.**
- **Presented reachability analysis for nonlinear continuous systems.**
- **Proposed reachability-based verification for SRAMs with consideration of threshold voltage variations.**
- **Reachability verification for SRAMs achieved good speed and precision, and can be extended for optimization**

Thank you!



Please send comments to haoyu@ntu.edu.sg
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