

# CMOS-Free Magnetic Domain Wall Leaky Integrate-and-Fire Neurons with Intrinsic Lateral Inhibition



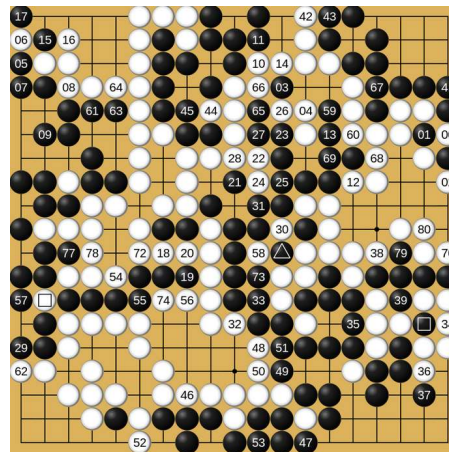
Naimul Hassan, Wesley. H. Brigner, Xuan Hu, Otitoaleke G. Akinola, Christopher H. Bennett, Matthew. J. Marinella, Felipe Garcia-Sanchez, Jean Anne C. Incorvia, Joseph S. Friedman

Electrical and Computer Engineering, University of Texas at Dallas  
Electrical and Computer Engineering, University of Texas at Austin  
Sandia National Laboratories  
Departamento de Fisica Aplicada, Universidad de Salamanca

2020 IEEE International Symposium on Circuits and Systems  
Virtual, October 10-21, 2020

# Automated Cognitive Reasoning

1 - 4



AlphaGo

Brain

$\sim 20 \text{ W}$

$\sim 10^{-3} \text{ m}^3$

Cluster

$> 10^5 \text{ W}$

$> 1 \text{ m}^3$

Credit: A. F. Vincent, IMS Bordeaux

# Presentation Overview

- I. Background
- II. LIF Neurons
- III. Lateral Inhibition
- IV. Fabrication Analysis
- V. Conclusions

# Presentation Overview

I. Background

II. LIF Neurons

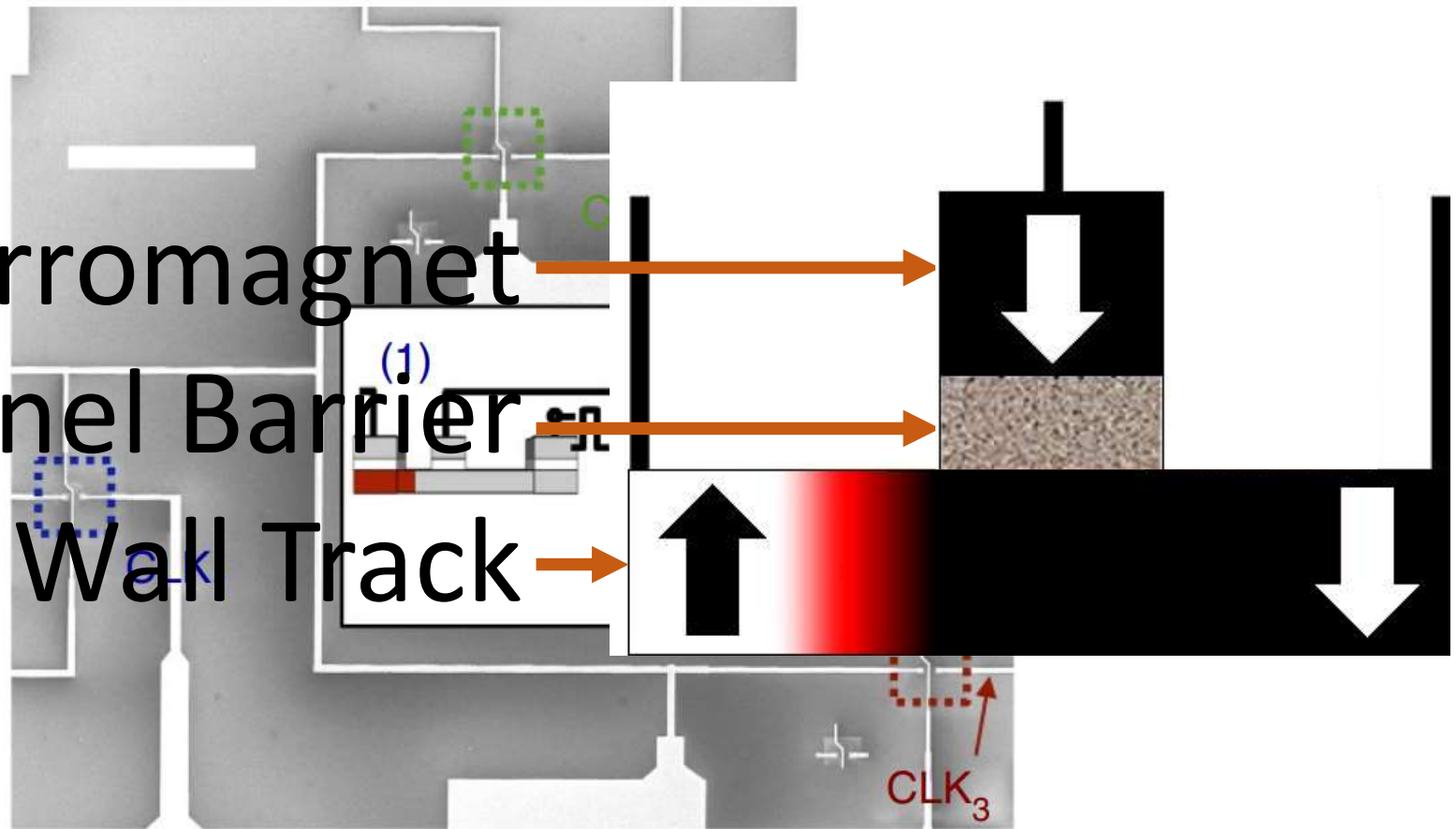
III. Lateral Inhibition

IV. Fabrication Analysis

V. Conclusions

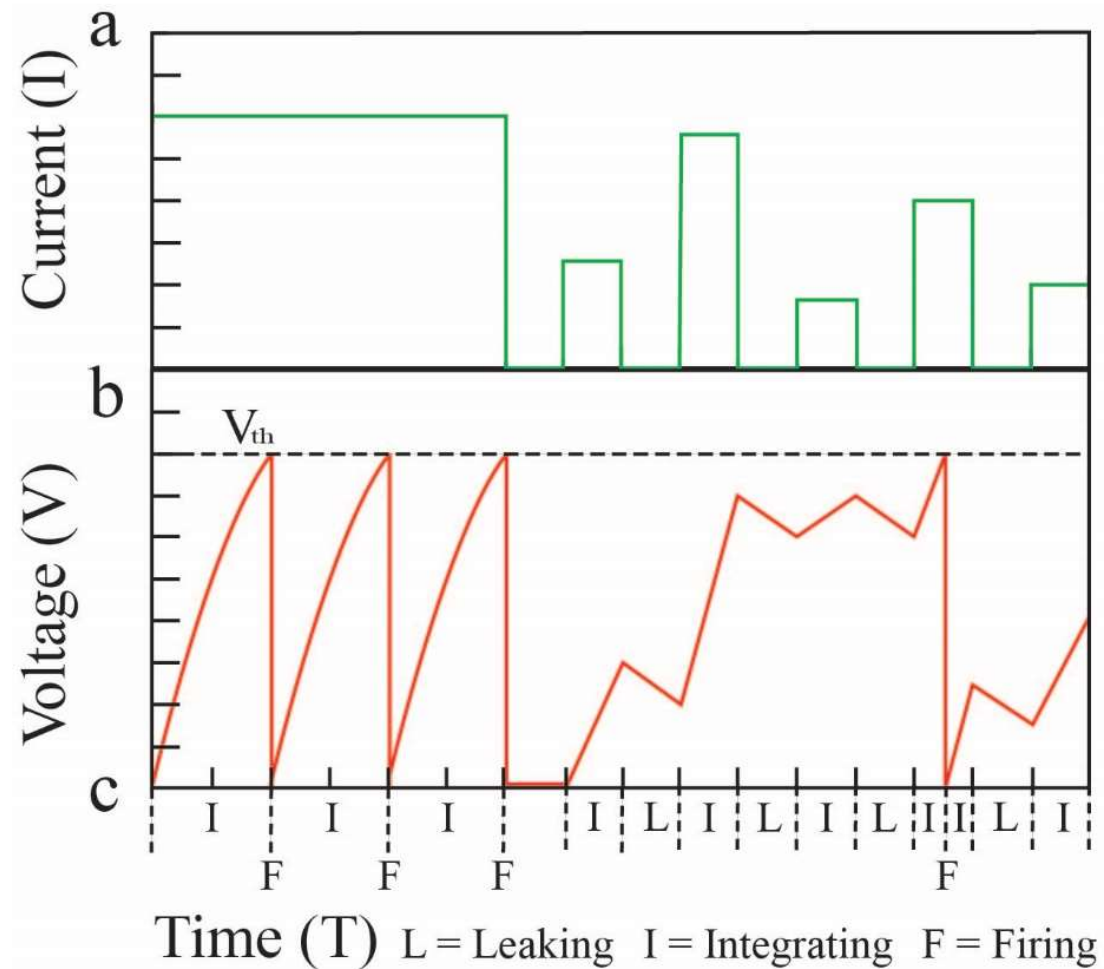
## Background: DW-MTJ Logic

Fixed Ferromagnet  
Tunnel Barrier  
Domain Wall Track

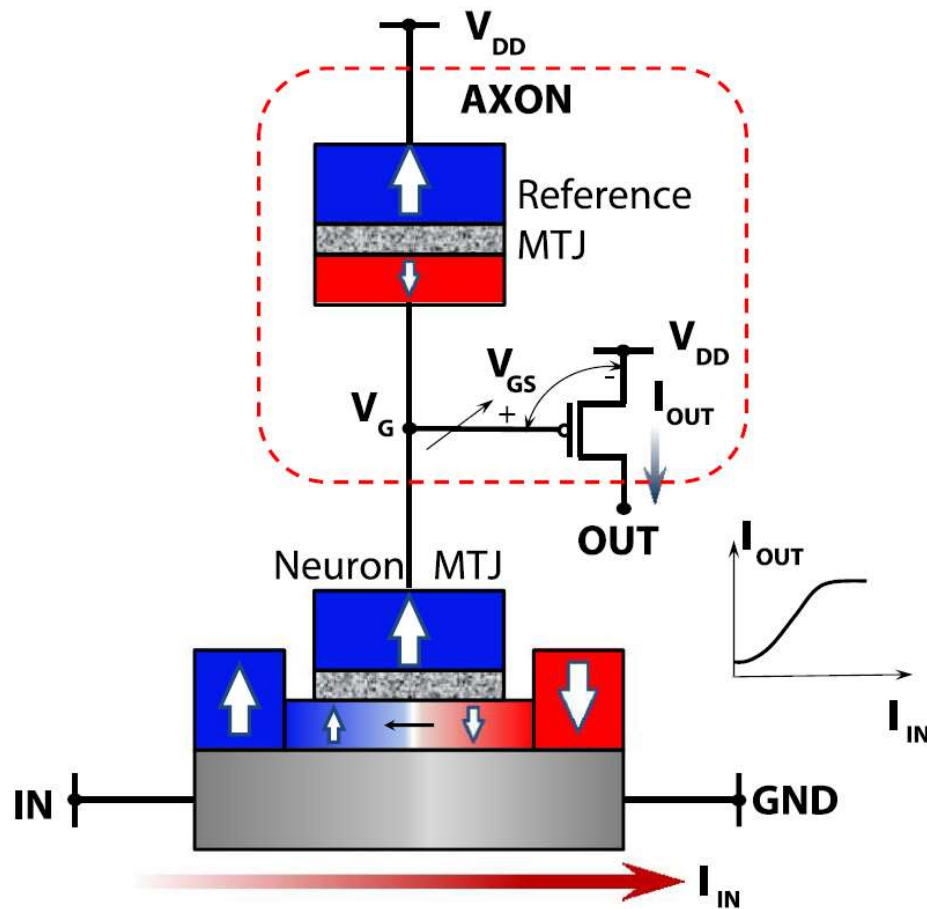


J. A. C. Incorvia, S. Siddiqui, S. Dutta, E. R. Evarts, J. Zhang, D. Bono, C. A. Ross, M. A. Baldo,  
*Nature Communications*, 2016

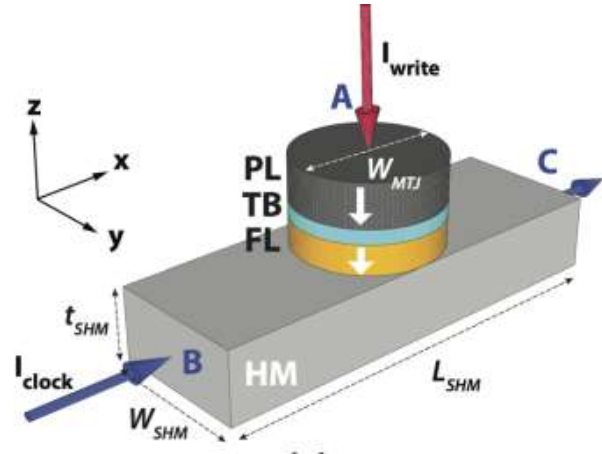
# Background: Leaky-Integrate & Fire Neuron



# Background: Previous Neuron Proposals



A. Sengupta, Y. Shim, K. Roy, *IEEE TBioCAS*, 2016



A. Sengupta, S. H. Choday, Y. Kim, and K. Roy, *Applied physics letters*, 2015

- Requires external circuitry for leaking and firing
- Extra layer for inhibition

# Presentation Overview

I. Background

**II. LIF Neurons**

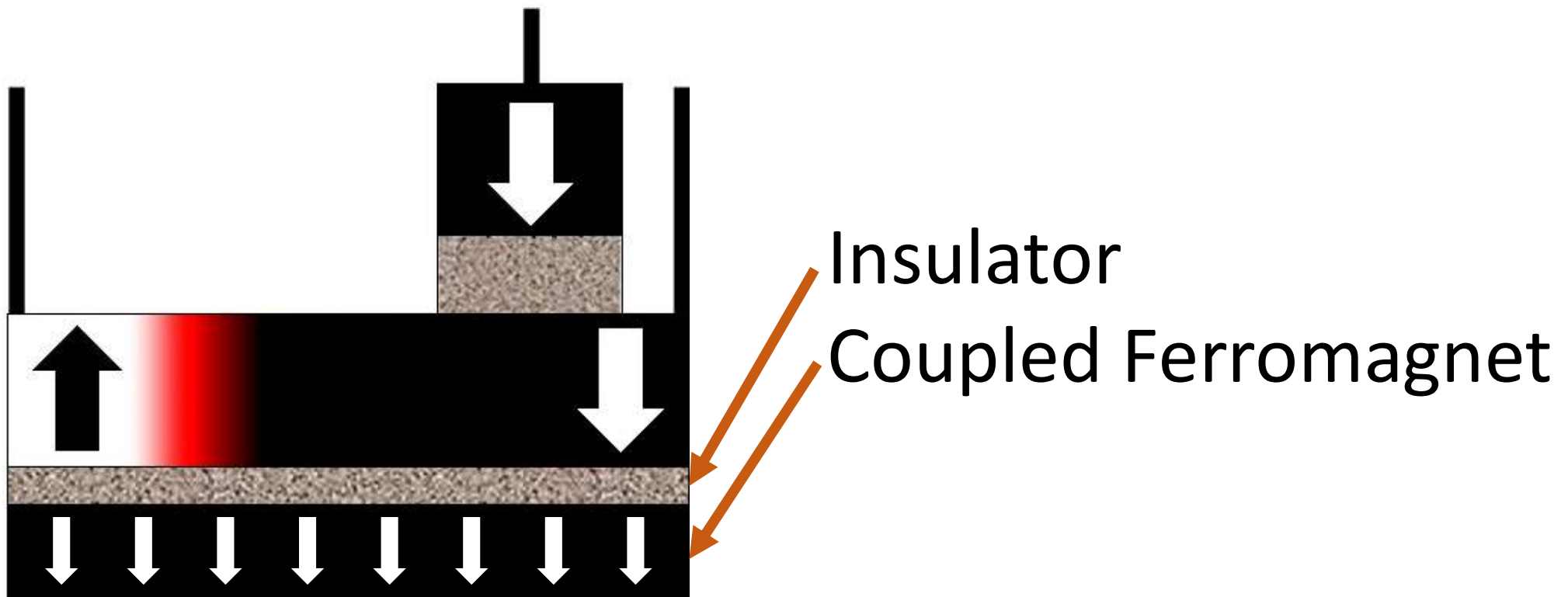
III. Lateral Inhibition

IV. Fabrication Analysis

V. Conclusions

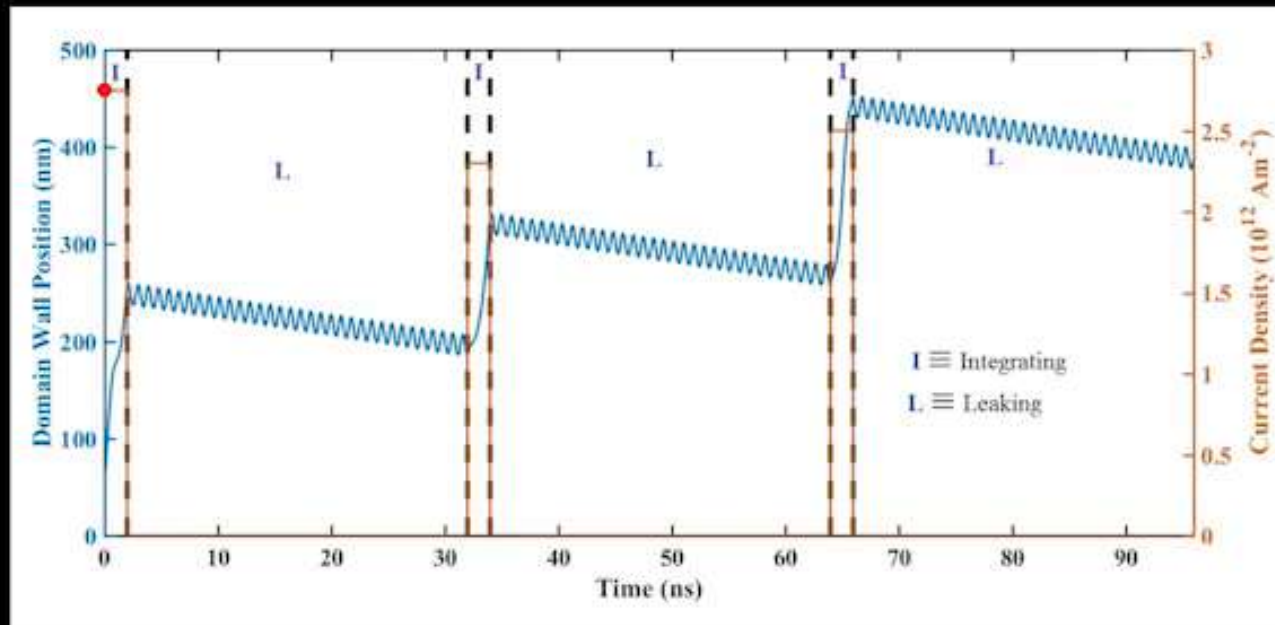


# Dipolar Coupling Field Neuron: Structure



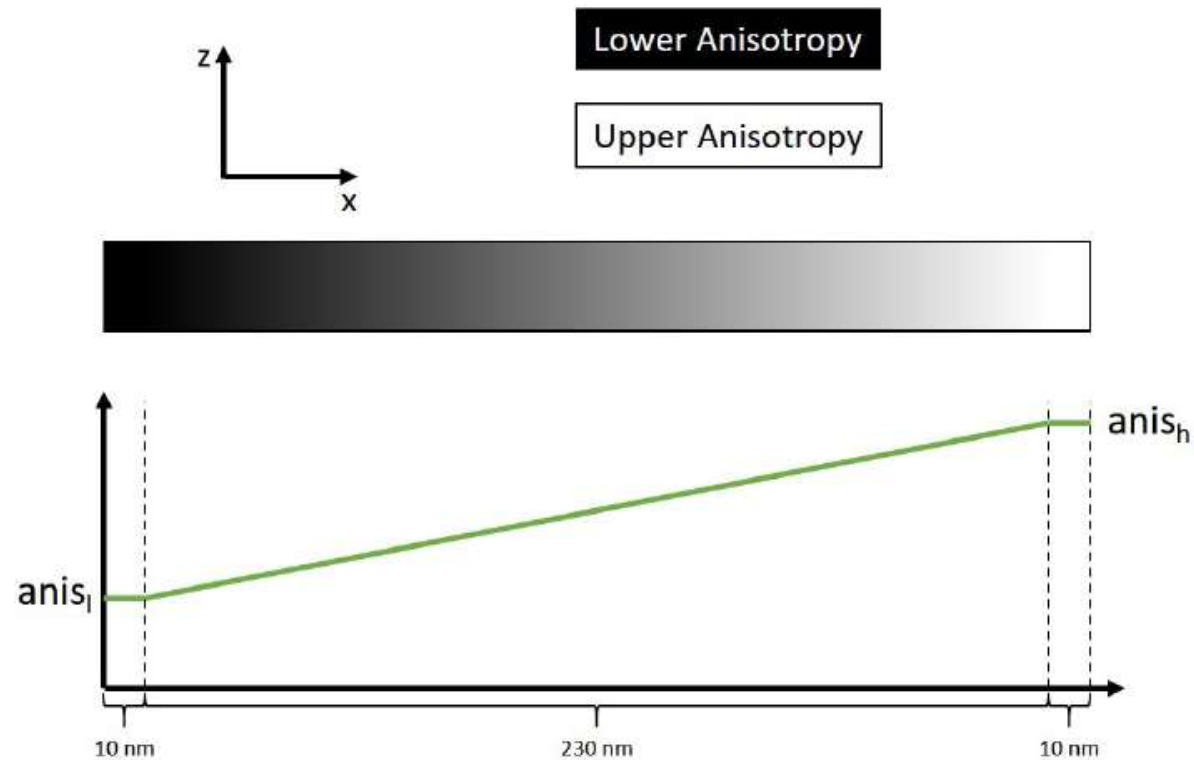
N. Hassan\*, X. Hu\*, L. Jiang-Wei, W. H. Brigner, O. G. Akinola, F. Garcia-Sanchez, M. Pasquale, C. H. Bennett, J. A. C. Incorvia, J. S. Friedman, *Journal of Applied Physics*, 2018

# Dipolar Coupling Field: Leaking & Integrating



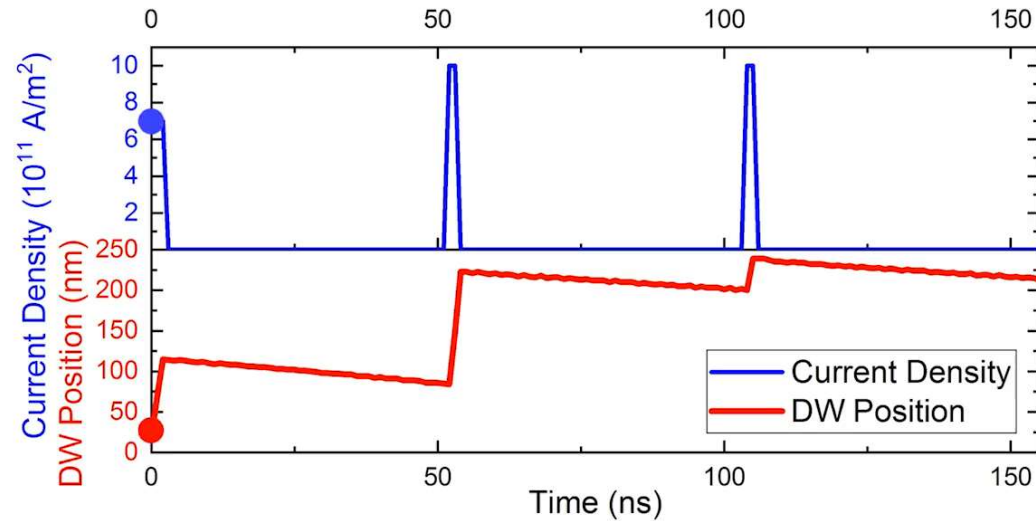
N. Hassan\*, X. Hu\*, L. Jiang-Wei, W. H. Brigner, O. G. Akinola, F. Garcia-Sanchez, M. Pasquale, C. H. Bennett, J. A. C. Incorvia, J. S. Friedman, *Journal of Applied Physics*, 2018

# Anisotropy Gradient Neuron: Structure



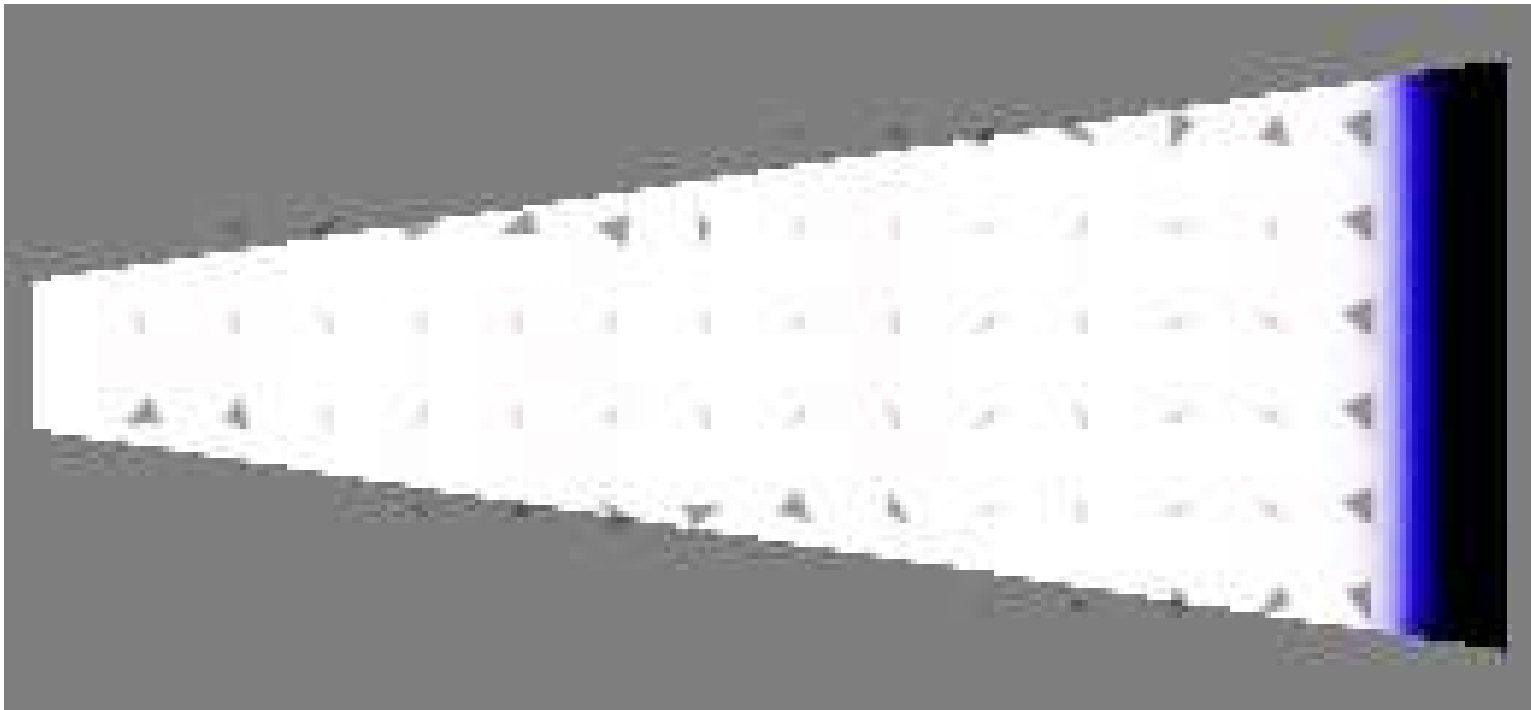
W. H. Brigner, X. Hu, N. Hassan, C. H. Bennett, J. A. C. Incorvia, F. Garcia-Sanchez, J. S. Friedman,  
*IEEE JxCDC*, 2019

# Anisotropy Gradient: Leaking & Integrating



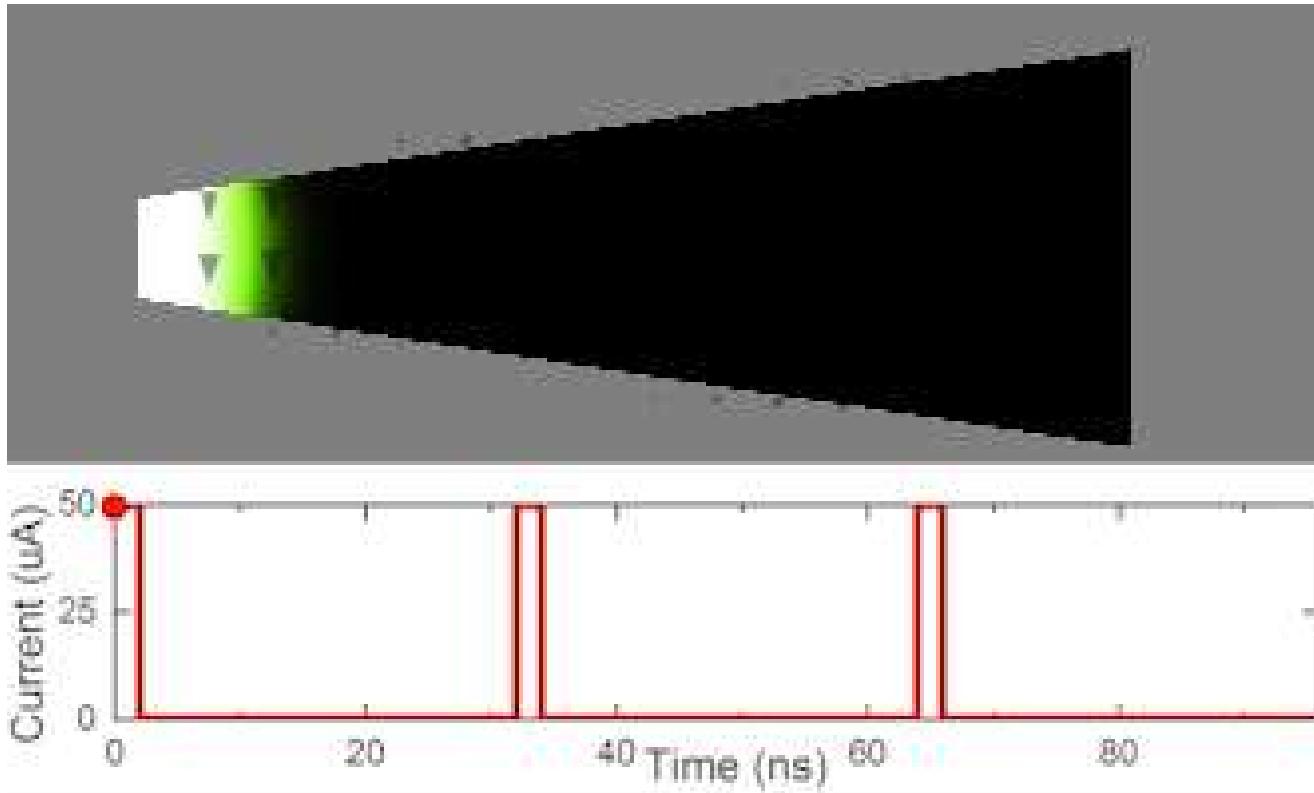
W. H. Brigner, X. Hu, N. Hassan, C. H. Bennett, J. A. C. Incorvia, F. Garcia-Sanchez, J. S. Friedman,  
*IEEE JxCDC*, 2019

# Shape Gradient: Leaking



W. H. Brigner, N. Hassan, L. Jiang-Wei, X. Hu, D. Saha, C. H. Bennett, M. J. Marinella, J. A. C. Incorvia, F. Garcia-Sanchez, J. S. Friedman, *IEEE Trans. Electron Devices* **66**:6, 2817-2821 (2019).

# Shape Gradient: Leaking & Integrating



W. H. Brigner, N. Hassan, L. Jiang-Wei, X. Hu, D. Saha, C. H. Bennett, M. J. Marinella, J. A. C. Incorvia, F. Garcia-Sanchez, J. S. Friedman, *IEEE Trans. Electron Devices* **66**:6, 2817-2821 (2019).

# Presentation Overview

I. Background

II. LIF Neurons

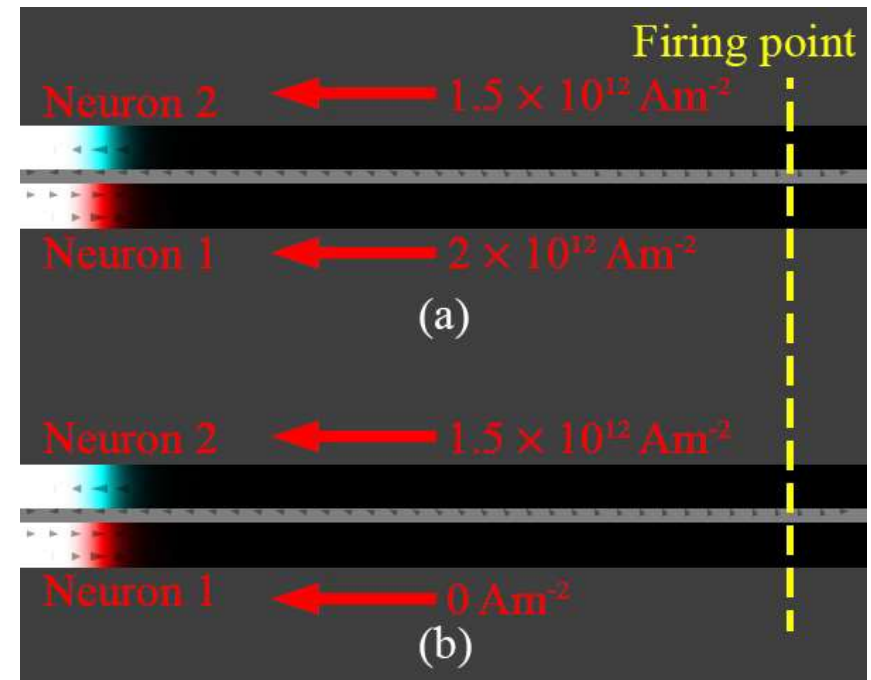
**III. Lateral Inhibition**

IV. Fabrication Analysis

V. Conclusions

# Lateral Inhibition

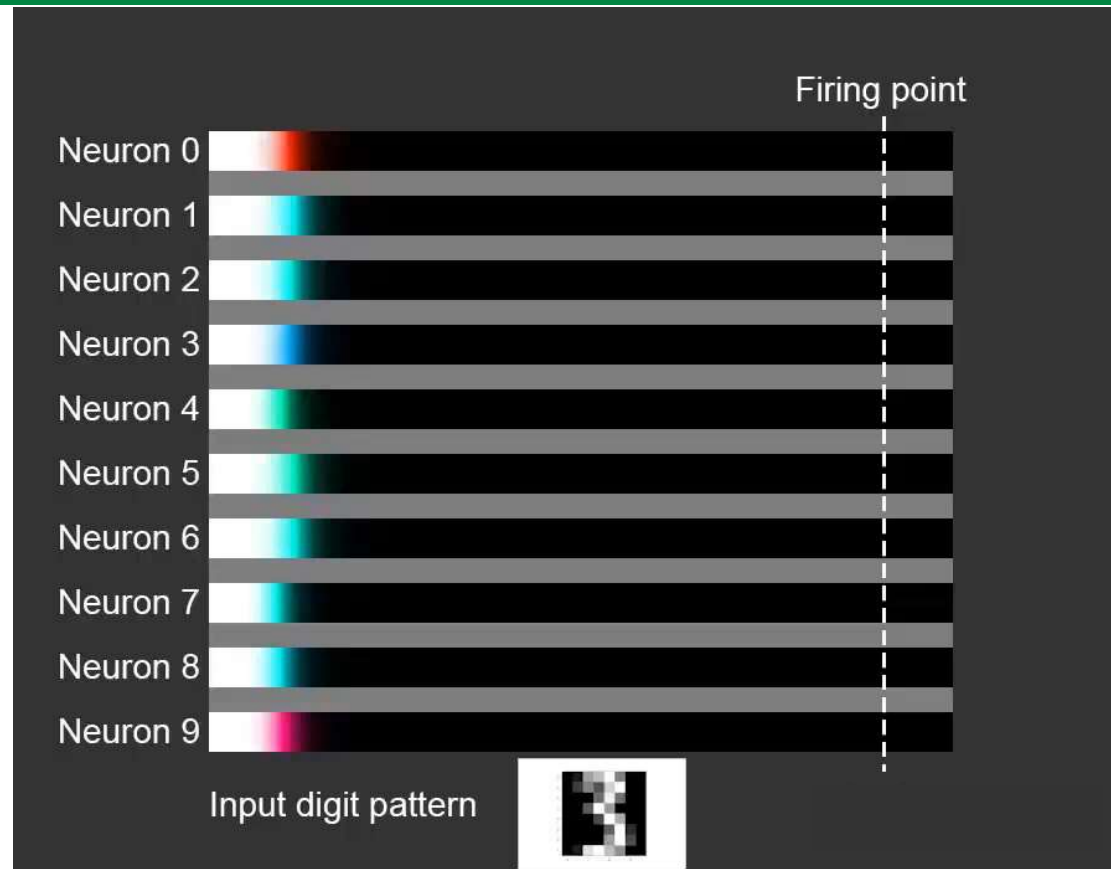
- DW tracks produce B-fields
  - Can therefore interact with nearby DW tracks
- Integration in one track produces effective leaking force in nearby tracks
  - More advanced integration results in larger effective leaking force



N. Hassan\*, X. Hu\*, L. Jiang-Wei, W. H. Brigner, O. G. Akinola, F. Garcia-Sanchez, M. Pasquale, C. H. Bennett, J. A. C. Incorvia, J. S. Friedman, *Journal of Applied Physics*, 2018



# Output Layer with Digit Recognition



N. Hassan\*, X. Hu\*, L. Jiang-Wei, W. H. Brigner, O. G. Akinola, F. Garcia-Sanchez, M. Pasquale, C. H. Bennett, J. A. C. Incorvia, J. S. Friedman, *Journal of Applied Physics*, 2018

# Presentation Overview

I. Background

II. LIF Neurons

III. Lateral Inhibition

**IV. Fabrication Analysis**

V. Conclusions

# Comparison of Fabrication Approaches

	Dipolar Field
<b>Fabrication Approach</b>	<b>Additional ferromagnet provides dipolar coupling field</b>
<b>Pros</b>	<b>Simple fabrication of each layer</b>
<b>Cons</b>	<b>Requires additional material layers</b>

# Presentation Overview

I. Background

II. LIF Neurons

III. Lateral Inhibition

IV. Fabrication Analysis

**V. Conclusions**

# Conclusions

- Demonstrated first spintronic neuron capable of leaking and integrating without any external circuitry
- Intrinsic lateral inhibition capabilities allow for improved biomimicry
- Use of spintronics will significantly reduce power consumption
- New devices will markedly decrease area overhead, which will, in turn, decrease fabrication complexity

# Thank You



Xuan Hu



Naimul Hassan



Joseph Friedman



CCF Awards

1910800

1910997



Graduate Research Fellowship  
Program (GRFP)

Award No. 1746053



McDermott Graduate Fellows

Award No. 202001



Jean Anne Incorvia



Otitoaleke Akinola



Sandia  
National  
Laboratories



Christopher Bennett



Matthew Marinella

VNIVERSIDAD  
D SALAMANCA



Felipe Garcia-Sanchez