

# A Tutorial on Reliability Physics for Post-Moore Era Electronics: An Integrated Material, Devices, and Packaged Systems

Muhammad A. Alam ([alam@purdue.edu](mailto:alam@purdue.edu))

Jai N. Gupta Endowed Chair Professor

School of Electrical and Computer Engineering

West Lafayette, IN

Acknowledgment: B. Mahajan, Y. Chen, W. Ahn, S.-H. Shin, A. Wahab, A. Jain, S. Palit, H. Kufluoglu



# The Endless Frontier of Moore's Law!



- Moore's law is dead, long-live Moore's law
- Self-heated FEOL transistors: An enduring challenge
- BEOL-integrated transistors: The next-frontier?
- Rethinking the reliability of power-transistors
- Reliability of 3D Heterogeneously Integrated Package
- Looking ahead: A zero-trust world, active packaging

Computing



Transport



Agriculture



Energy



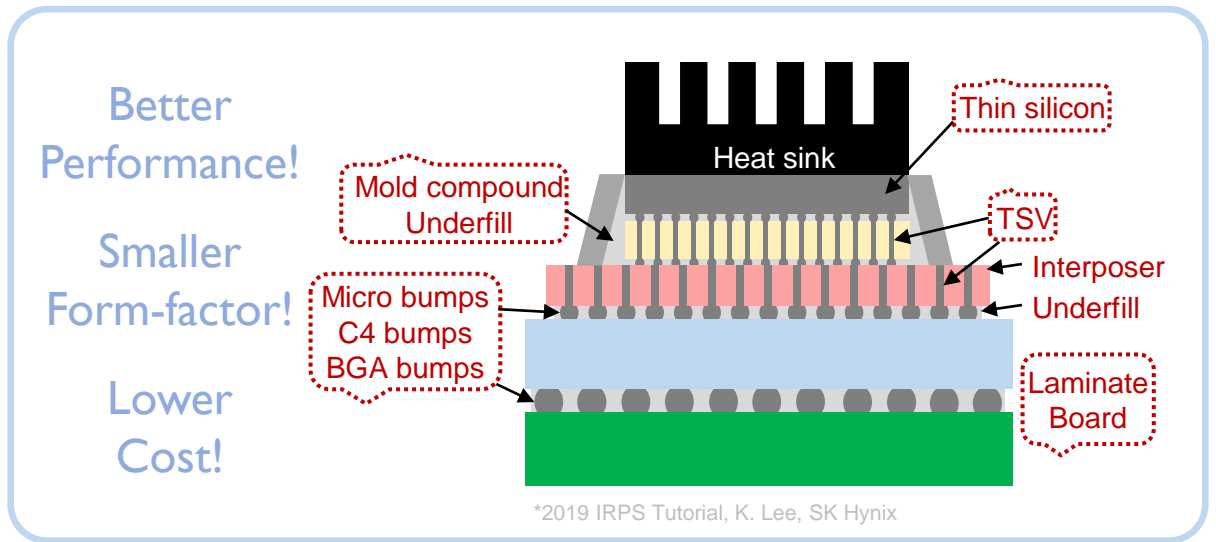
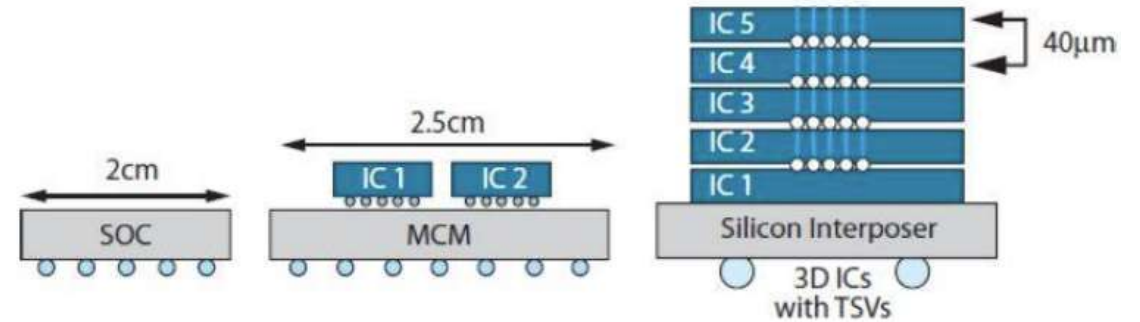
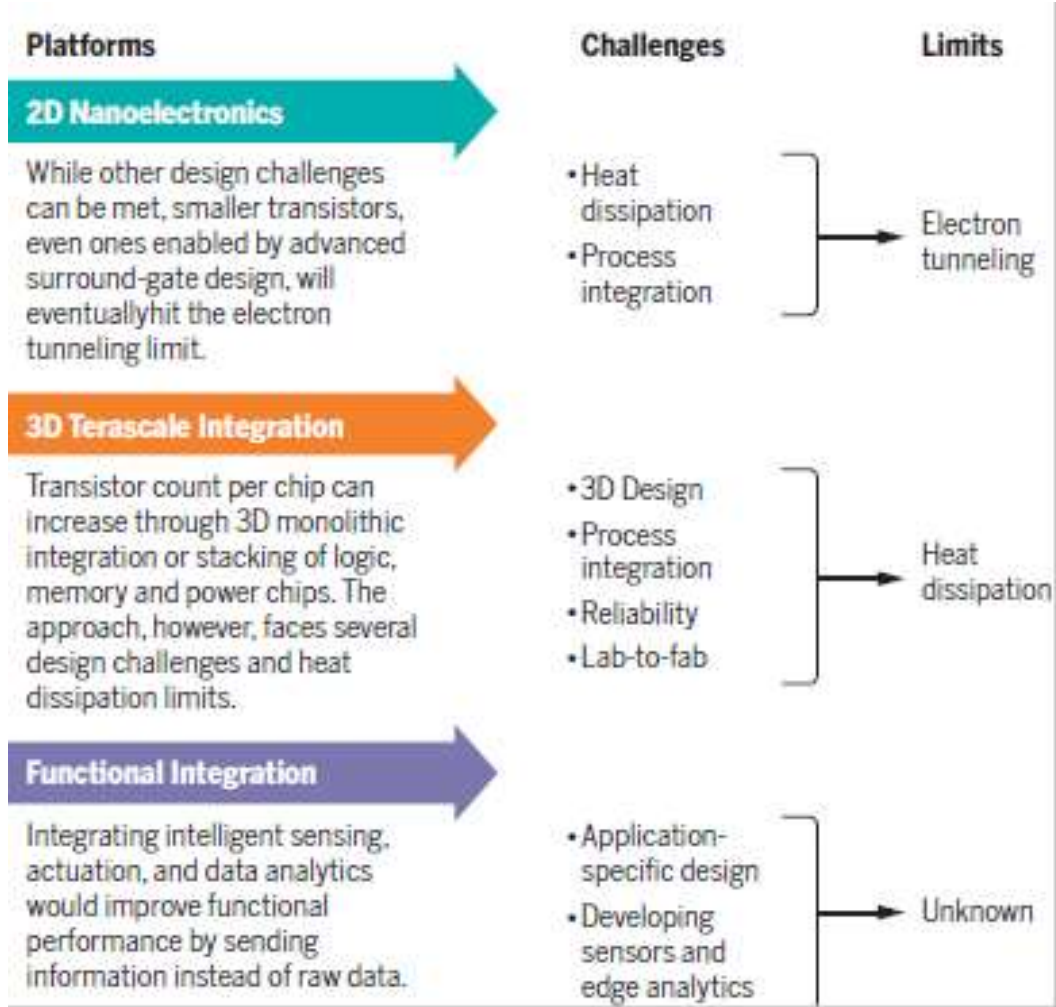
Healthcare



Zero-trust reliability



# Why SISC will always remain relevant!

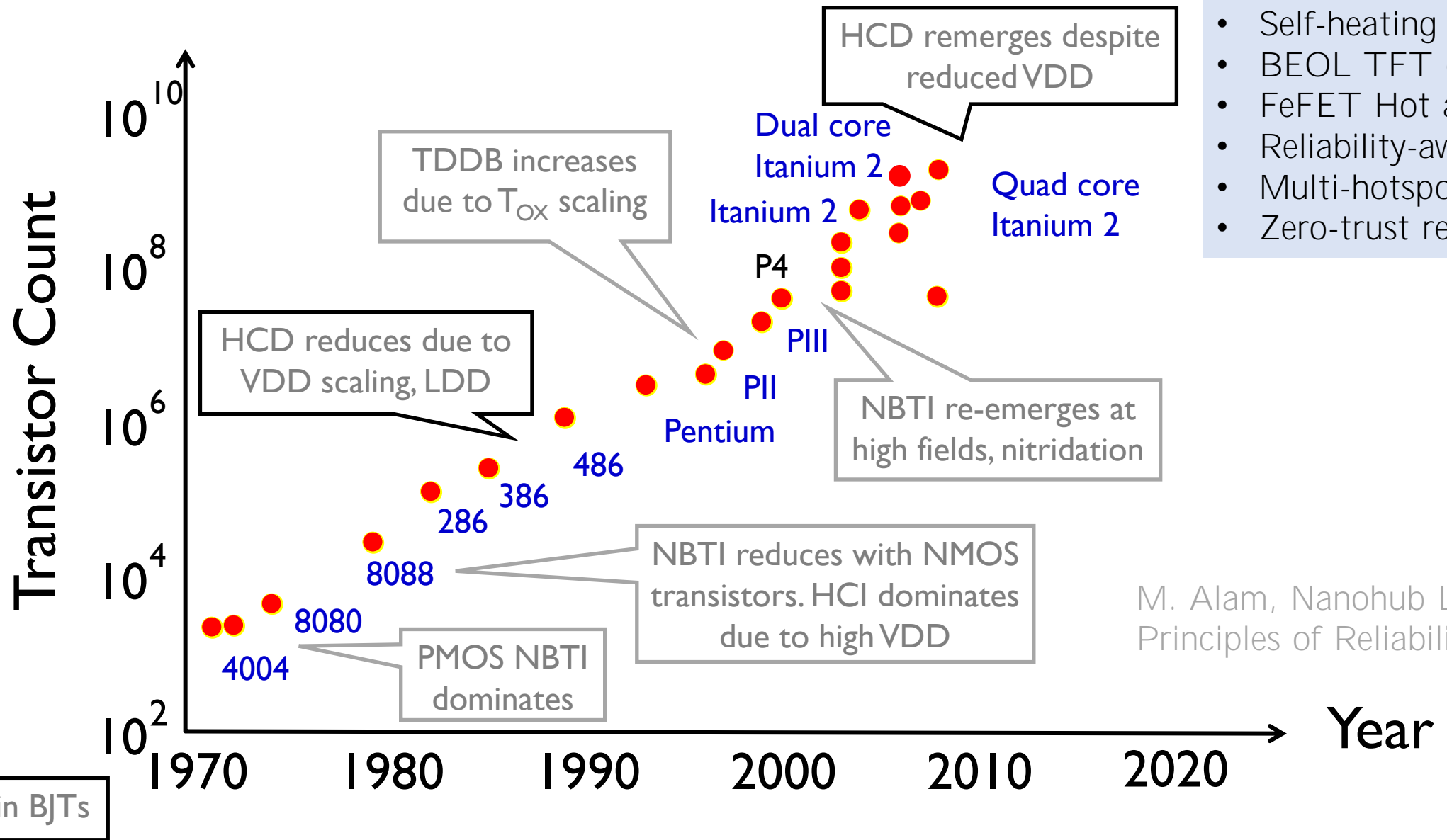


# Outline

- Moore's law is dead, long-live Moore's law
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# A short history of reliability physics ...



- Self-heating
- BEOL TFT degradation
- FeFET Hot atom damage
- Reliability-aware SOA
- Multi-hotspot HCD
- Zero-trust reliability

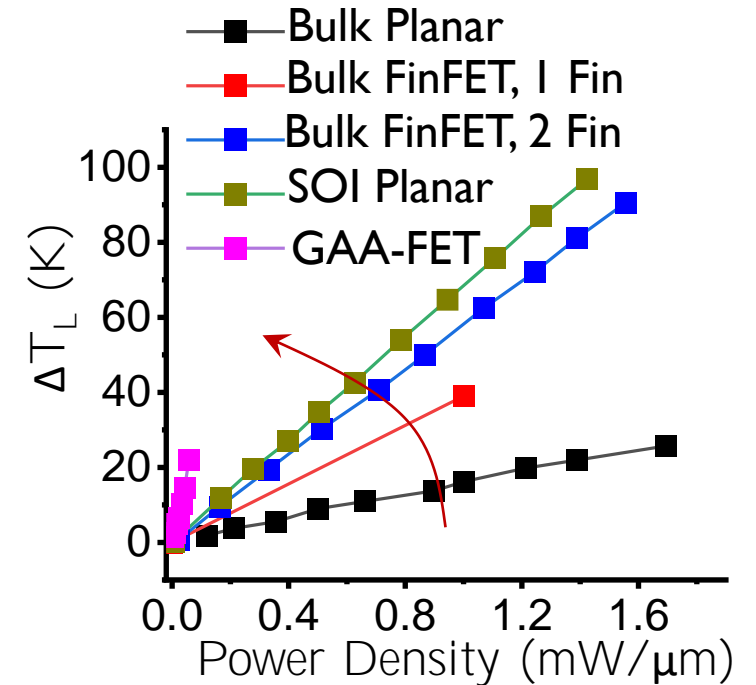
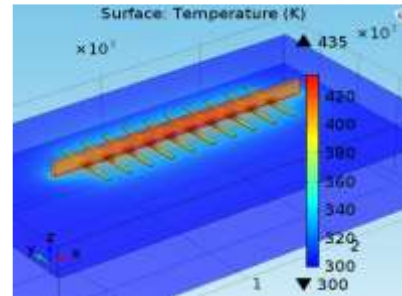
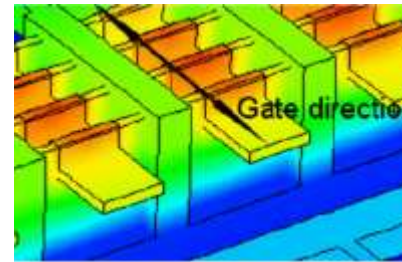
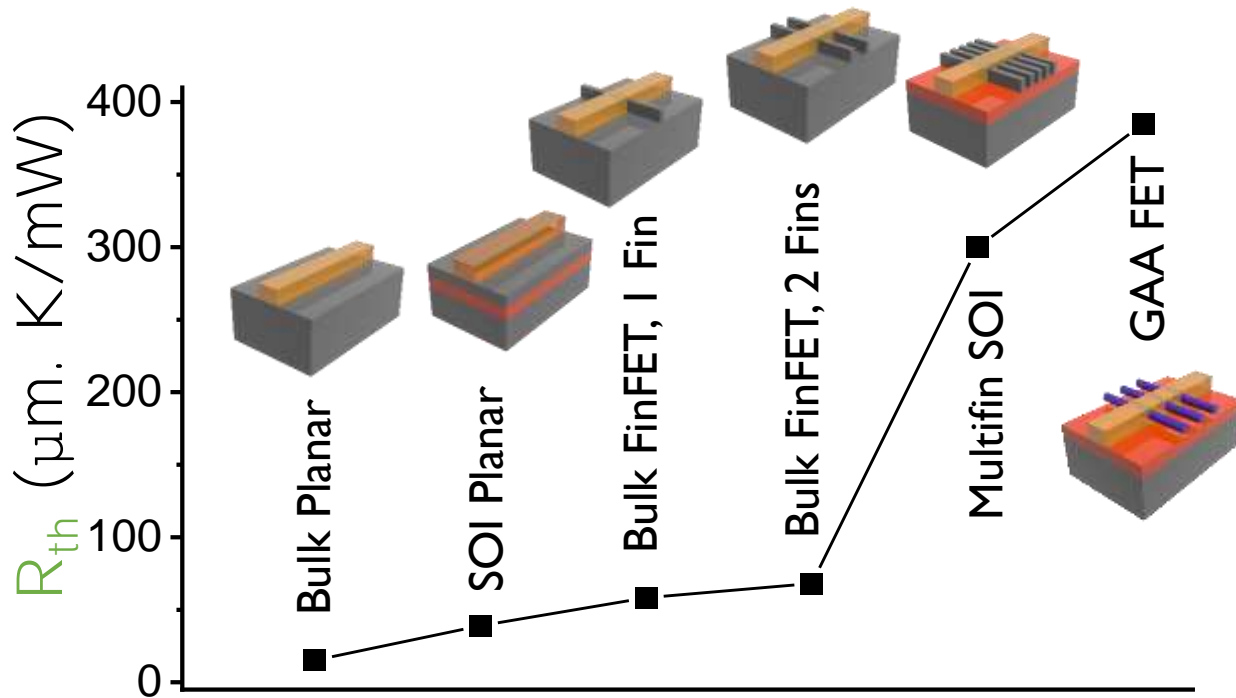
M. Alam, Nanohub Lecture Series  
Principles of Reliability Physics

# Self-heated transistors: an enduring challenge

$$T_L = T_A + P R_{th}$$

Johnson-Keyes limit (1972)

$$T_L = T_A + P_0 \times \sqrt{A} \times (\beta/\kappa)$$

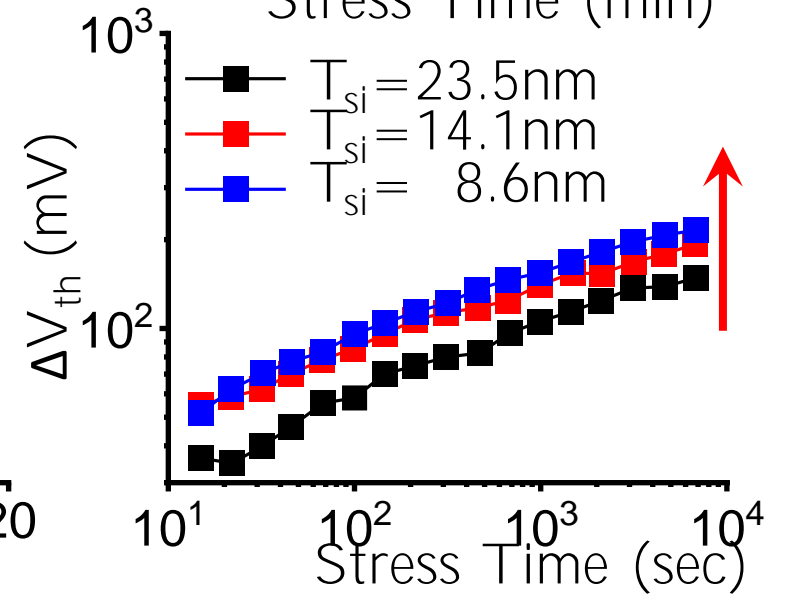
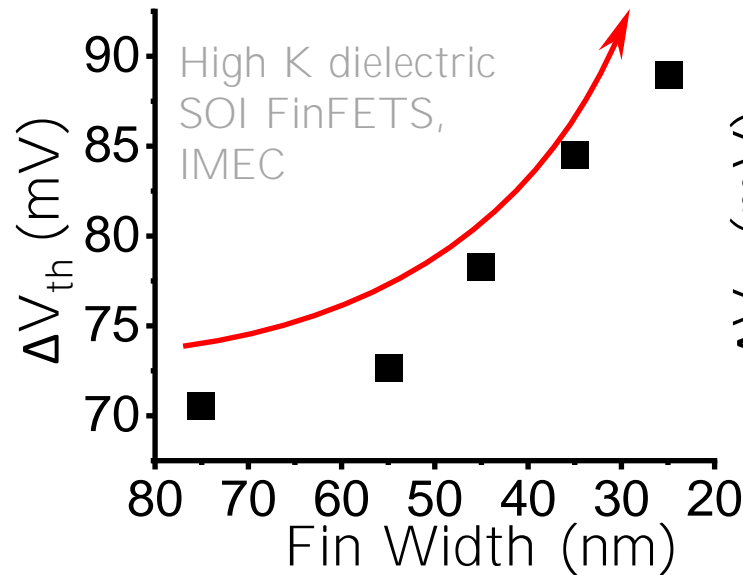
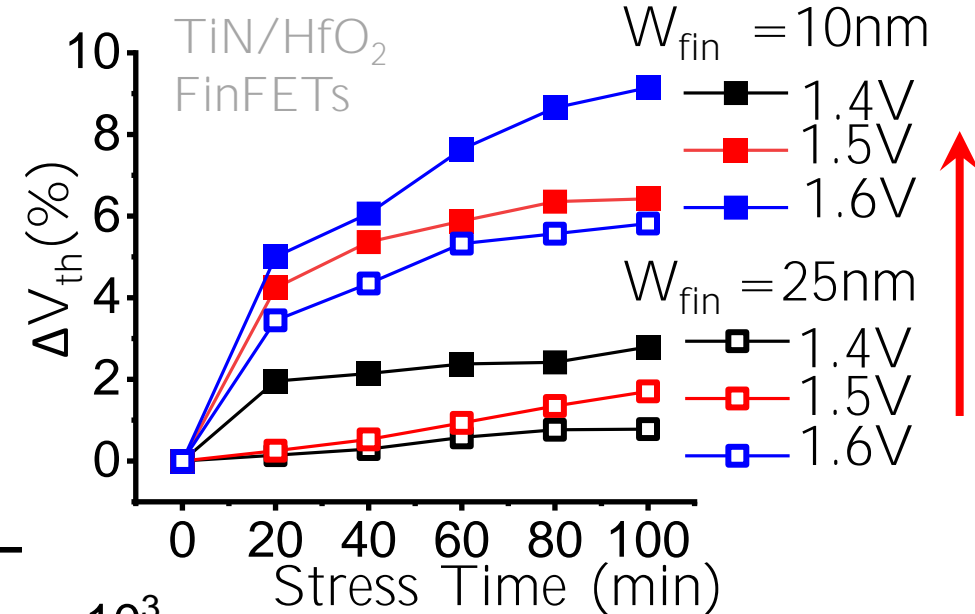
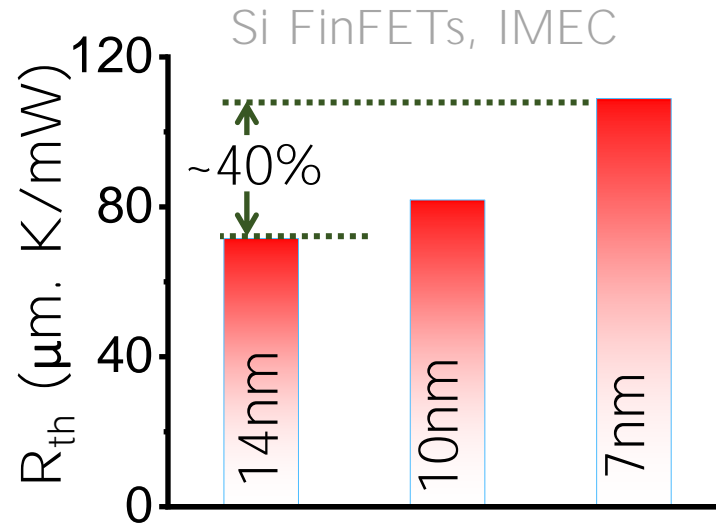
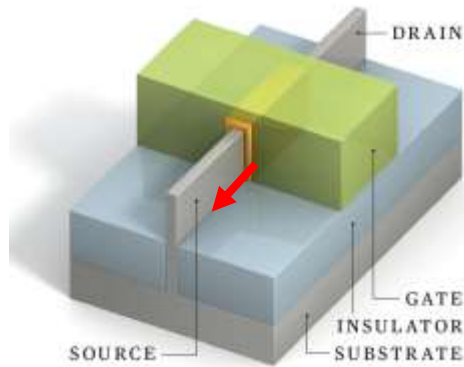


S. H. Shin, et. al., IEDM Tech. Dig., Dec. 2016, pp. 15.7.1–15.7.4.

M. A. Alam, et. al., IEEE TED, 66, 11, 2019.

M. Cho, et. al., in HCD in Semiconductor Devices, 2015, pp. 287–307

# Self-Heating redefines FinFET HCD



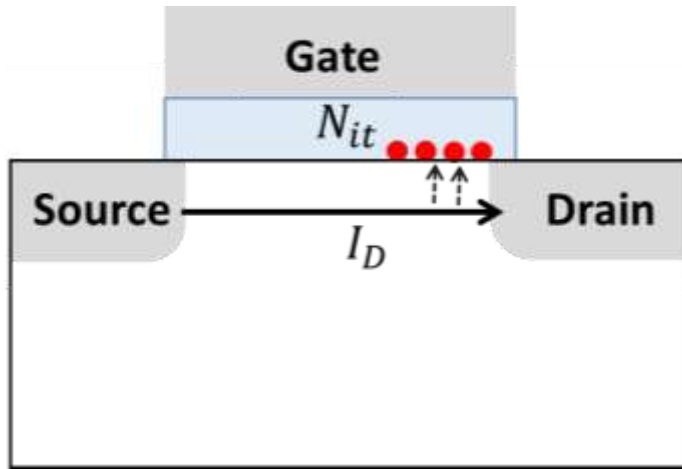
$$R_{th} \sim 1/W_{fin}$$

$$T_L = T_A + P R_{th}$$

$$R_B \sim e^{-\frac{E_B}{k_B T_L}}$$

- D. Jang et al., IEDM Tech. Dig., 2015.
- W. T. Chang et al., IEEE TDMR, 15, 1, 2015.
- Chabukswar et. al., Microele. Eng., 87, 10, 2010
- S. H. Shin et al., IEDM Tech. Dig., 2015

# HCD is a complex phenomenon ...

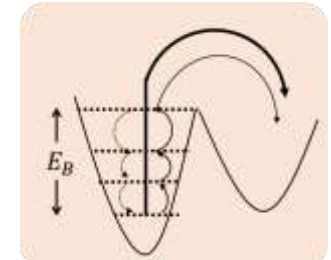
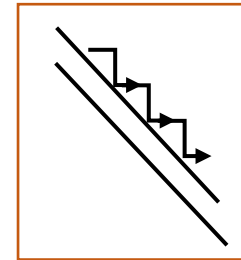
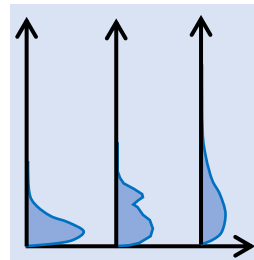
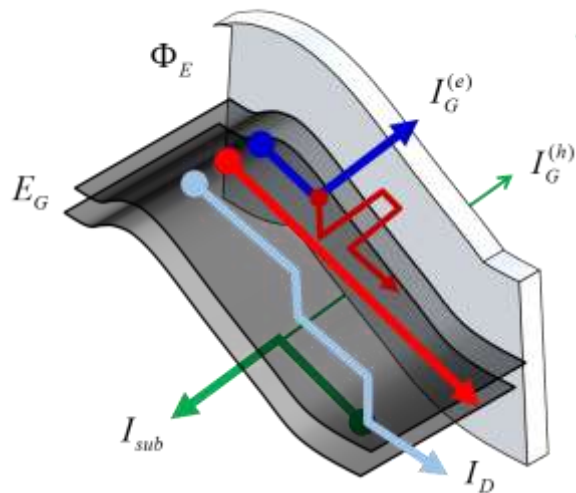


$$\frac{dN_{it}}{dt} = k_f(E_B, T_e, T_L)(N_0 - N_{it})$$

$$R_e \sim e^{-\frac{E}{kT_e}}$$

$$R_{II} \sim e^{+\frac{E_g}{k_B T_L}}$$

$$R_B \sim e^{-\frac{E_B}{k_B T_L}}$$

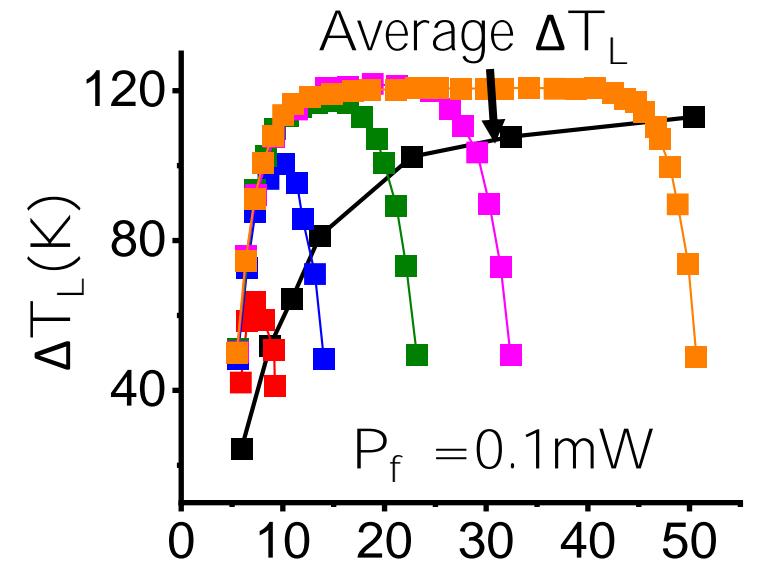
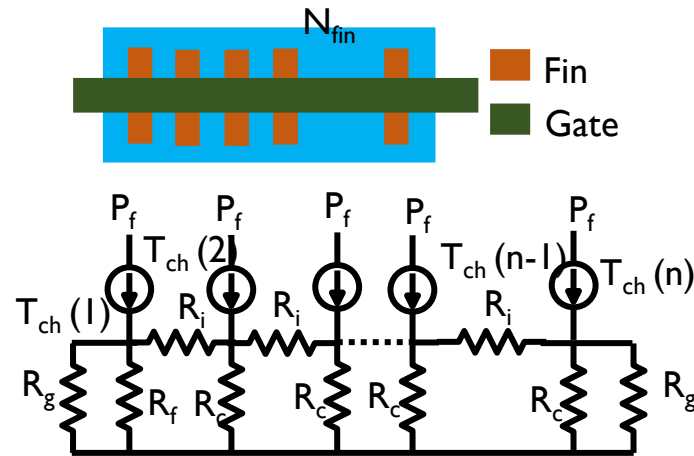
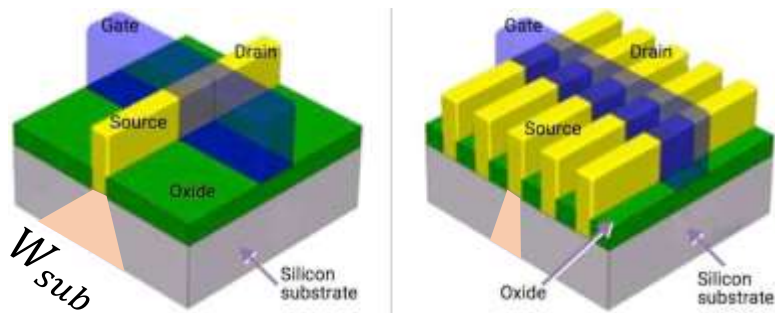


Historically ...

Now...



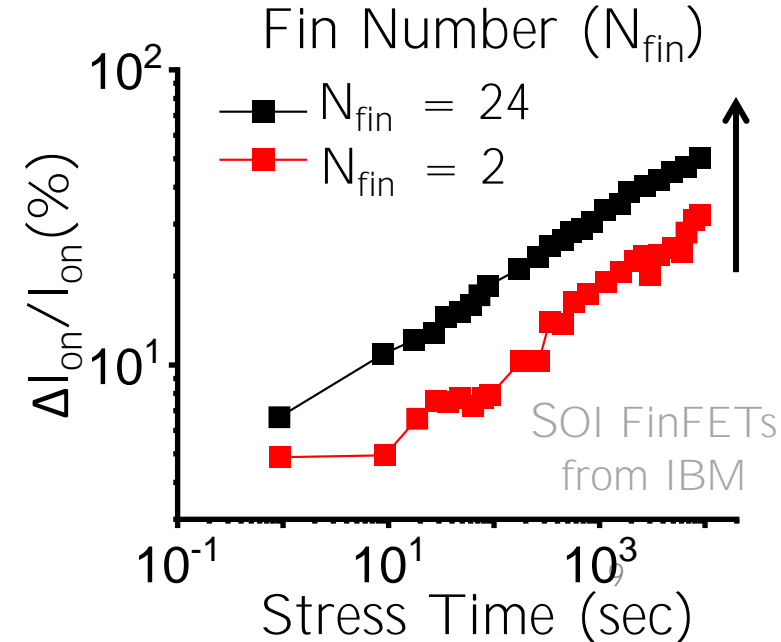
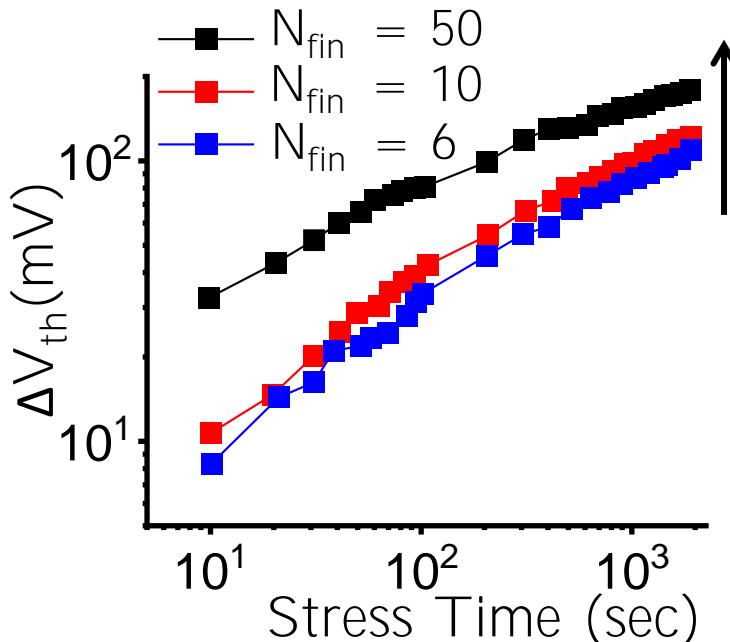
# HCD increases with Fin-Number



$$R_{th} \sim N_{fin} \sim W_{sub}^{-1}$$

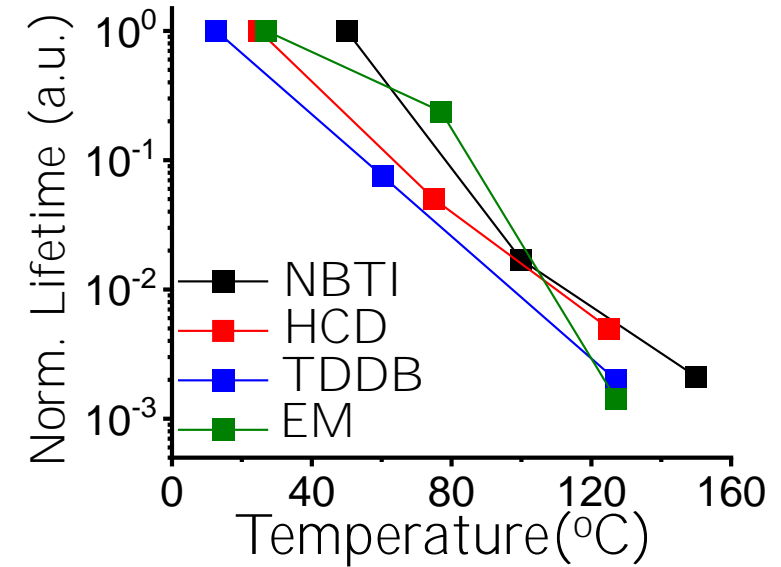
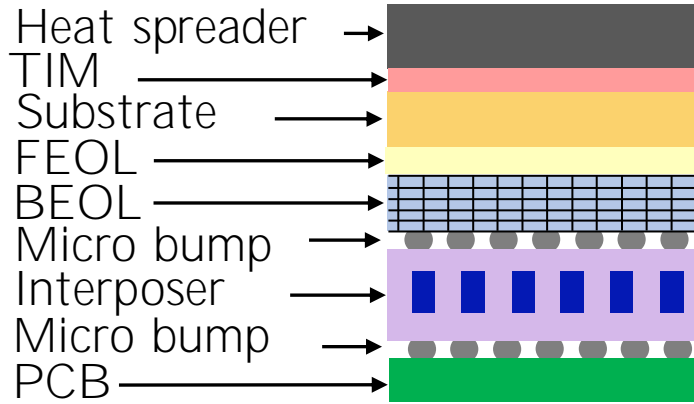
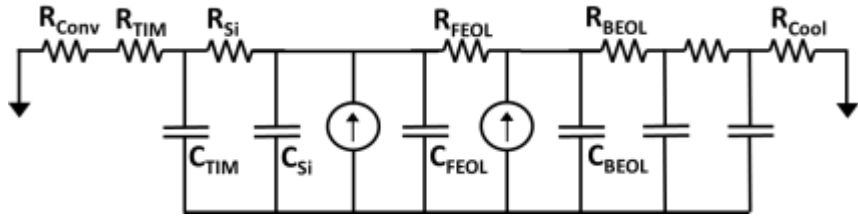
$$T_L = T_A + \frac{P R_{th}}{E_B}$$

$$R_B \sim e^{-\frac{E_B}{k_B T_L}}$$



- H. Jiang, et. al., Proc. IEEE IRPS, 2016.
- H. Jiang, et. al., IEEE EDL, 36, 12, 2016.
- A. Gupta, et. al., IEEE TED, 66, 5, 2019.

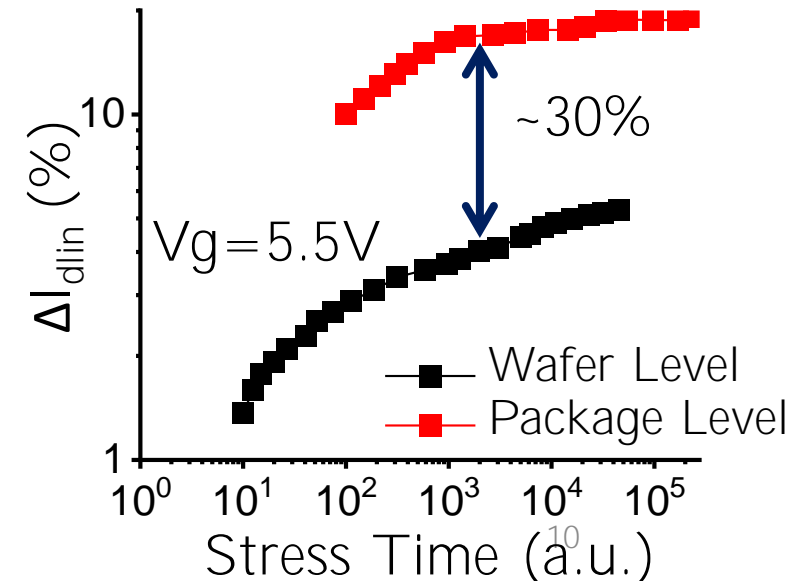
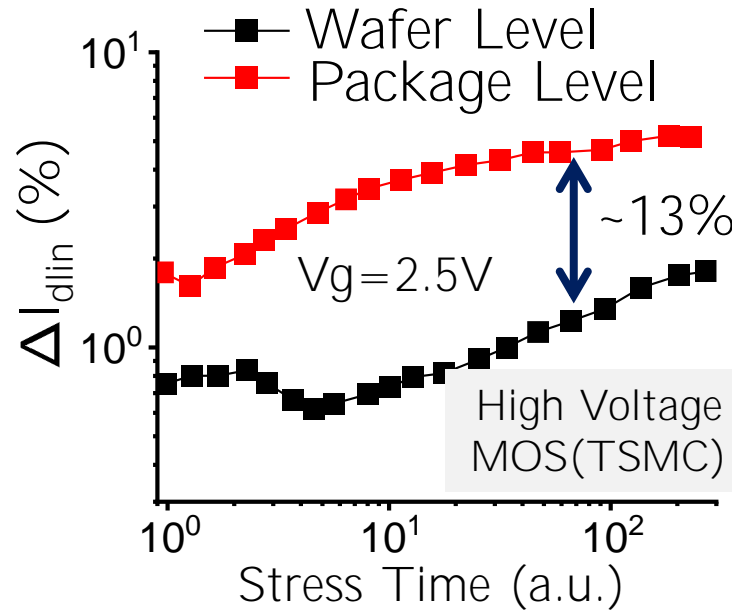
# Packaging increases HCD further ...



$$R_{th} \sim R_{FEOL} || R_{BEOL}$$

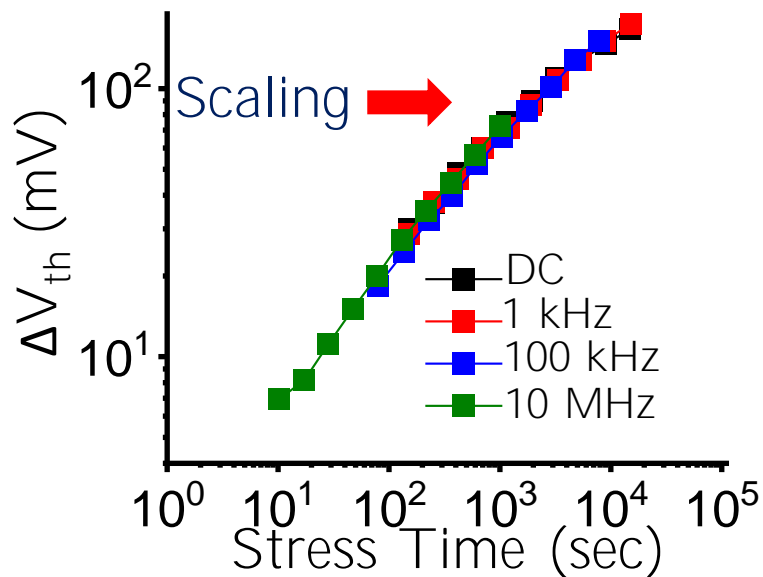
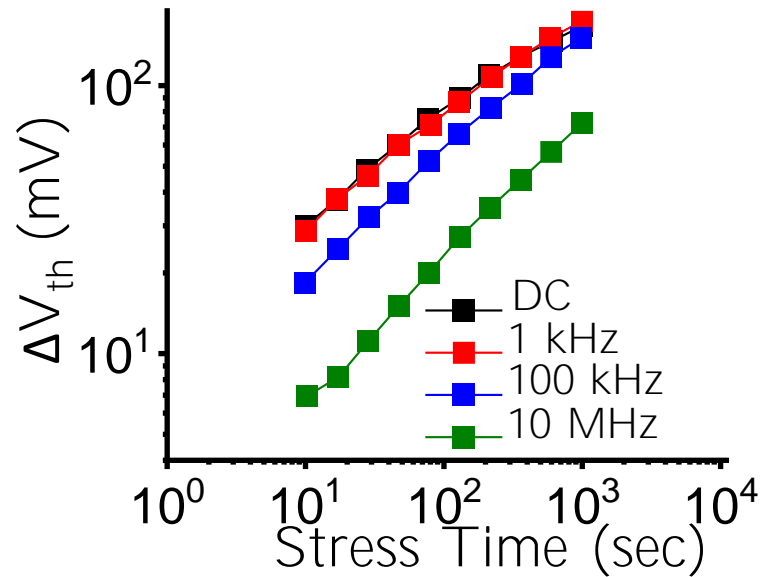
$$T_L = T_A + P R_{th}$$

$$R_B \sim e^{-\frac{E_B}{k_B T_L}}$$

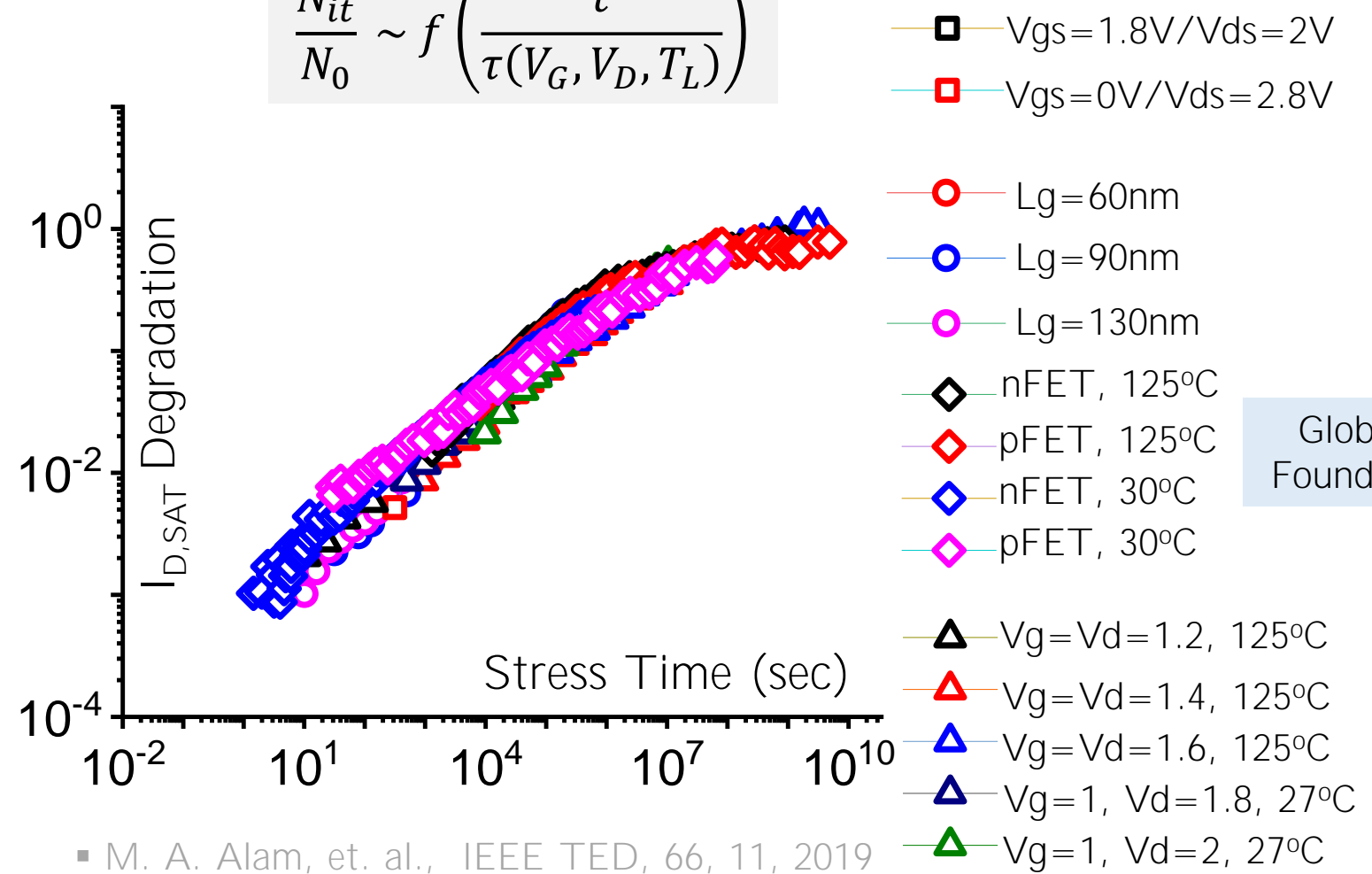


- W. Ahn, et. al., Microelectron. Rel., 81, 2018.
- H. J. Huang et. al., Symp. VLSI Digest, 2011.
- M. A. Alam, et. al. IEEE TED, 66, 11, 2019

# Regardless, HCD of logic FET is universal ...



$$\frac{N_{it}}{N_0} \sim f\left(\frac{t}{\tau(V_G, V_D, T_L)}\right)$$

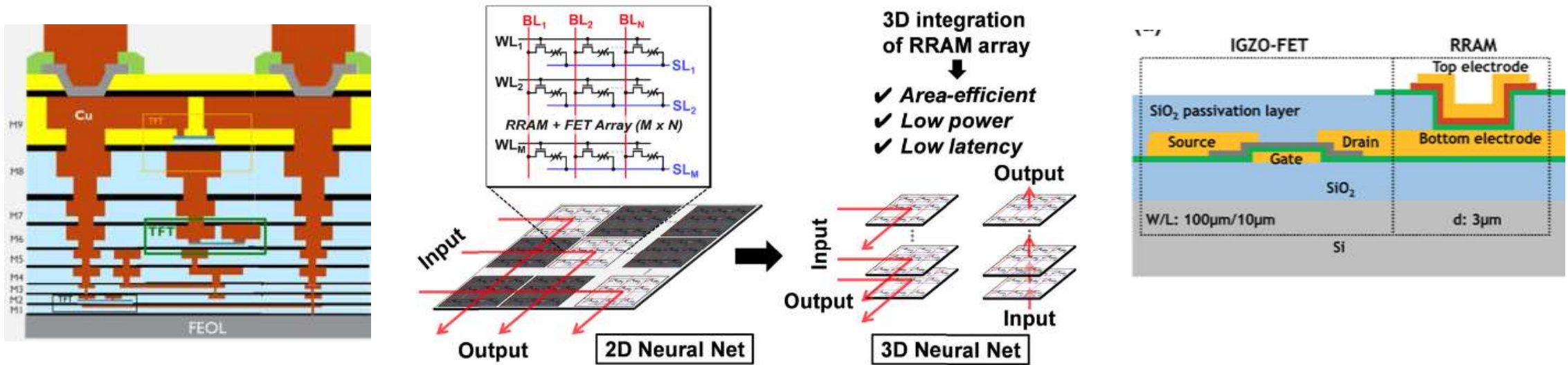


- M. A. Alam, et. al., IEEE TED, 66, 11, 2019
- S. Mahapatra, et. al., IEEE TED, 65, 8, 2018

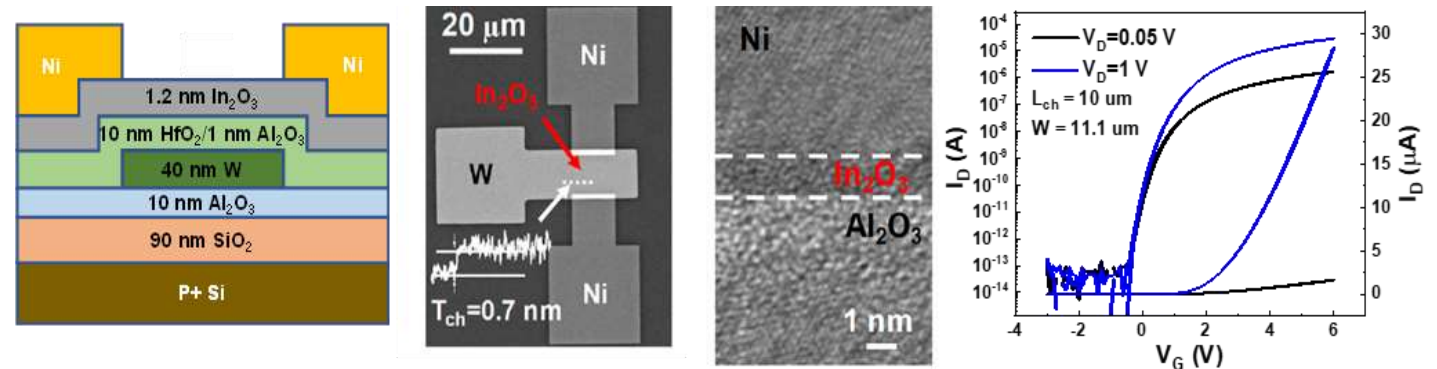
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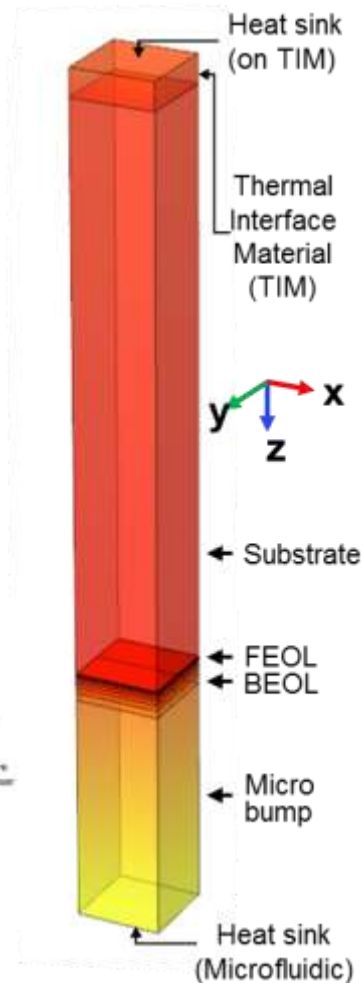
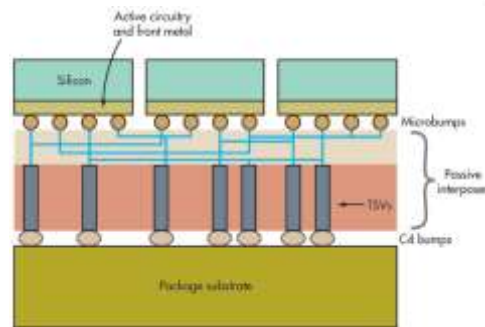
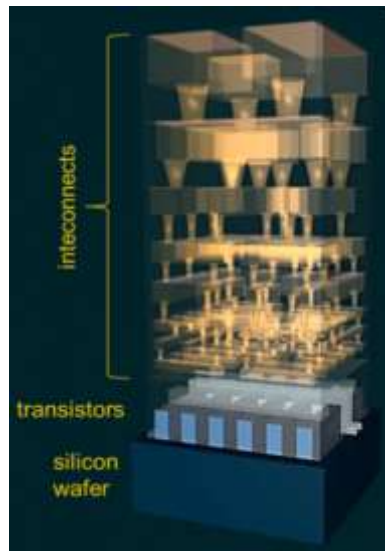
# BEOL-integrated 3D transistor: The next frontier?



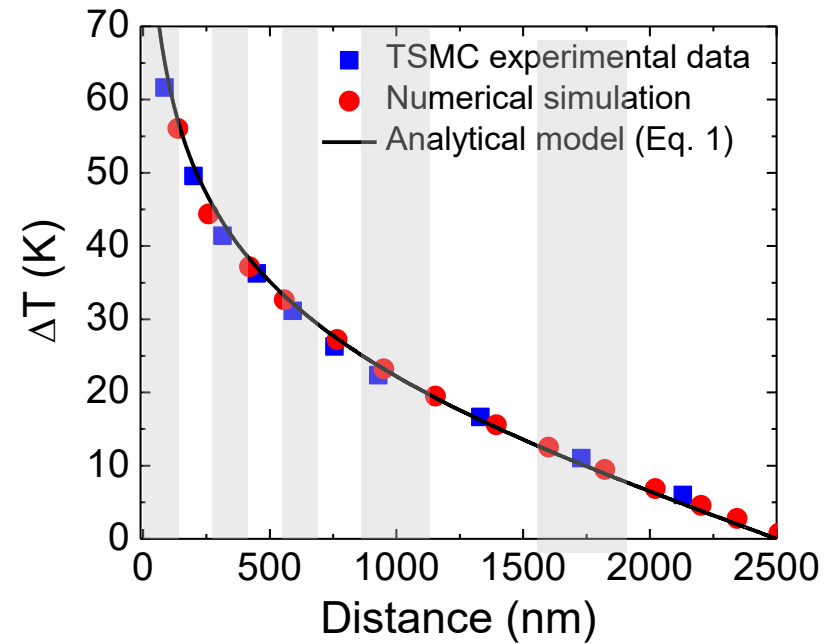
- Datta, S et al. (2019). BEOL compatible transistors for monolithic 3-D integration. IEEE Micro, 39(6), 8-15.
- Jiang, Junkai et al. (2019). Ultimate 3D Integration With 2D Materials: IEEE JED 10.1109/JEDS.2019.2925150.
- Wu, J. et al. (2020). A Monolithic 3-D Integration of RRAM Array and Oxide Semiconductor FET for In-Memory Computing in 3-D Neural Network. TED 67(12), 5322-5328.
- Lin, Zehao, et al. "High-Performance  $\text{In}_2\text{O}_3$ -Based 1T1R FET for BEOL Memory Application." IEEE TED (2021).



# BEOL increases temperature further...

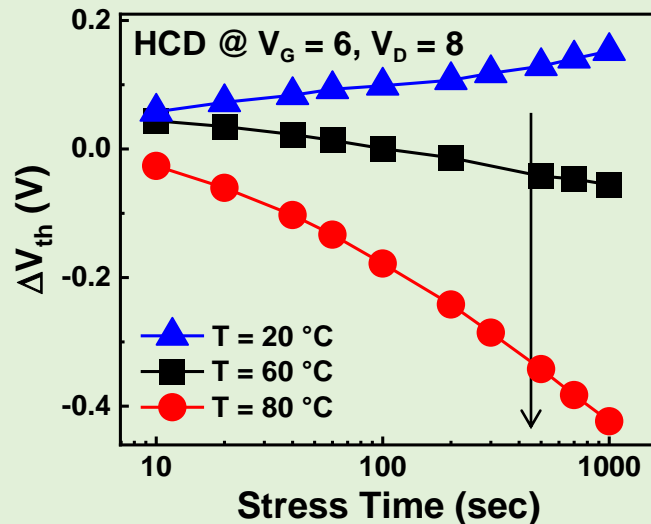
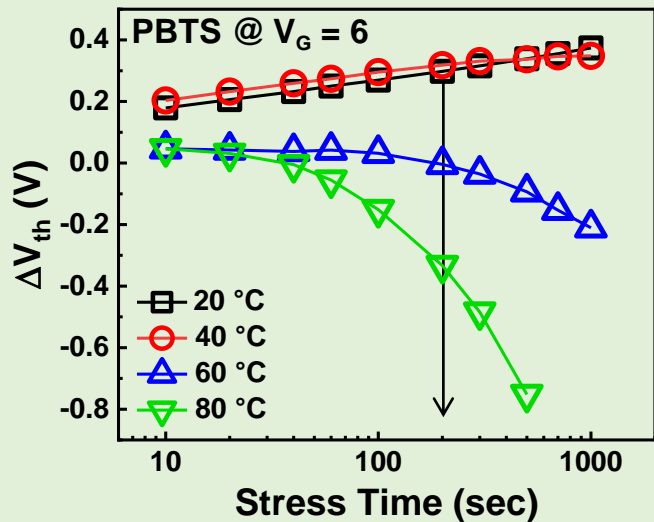
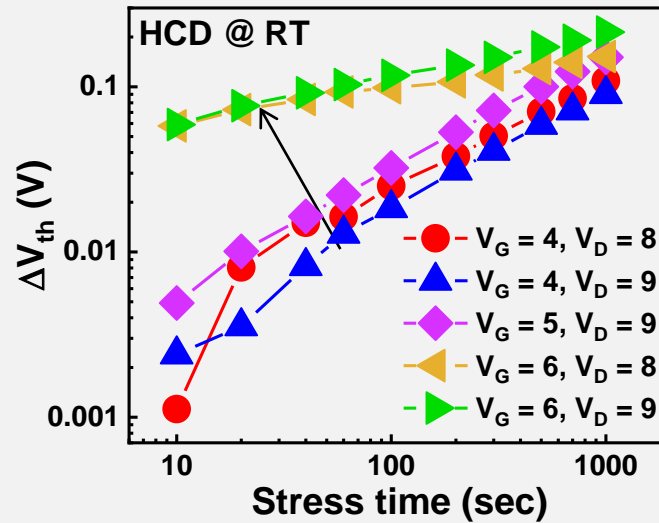
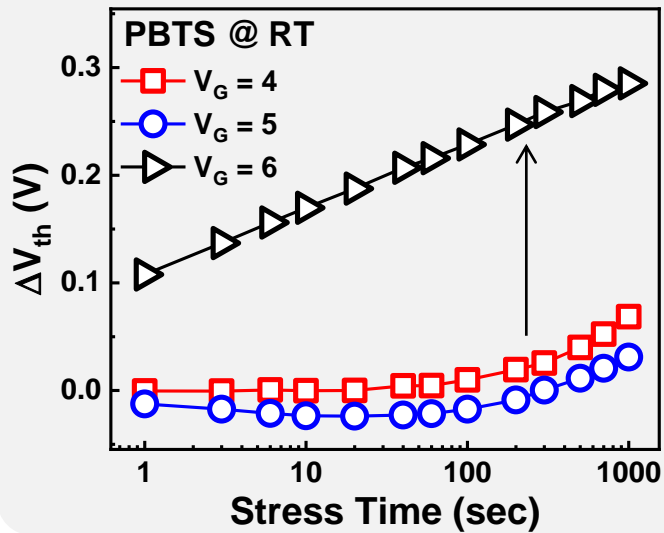


W. Ahn, Ph.D. Thesis, 2019.

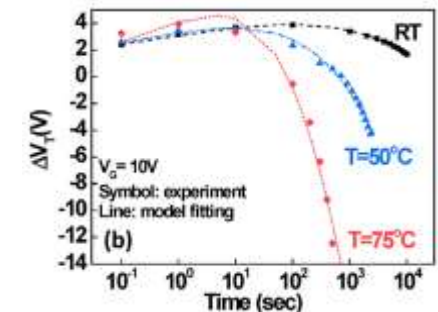
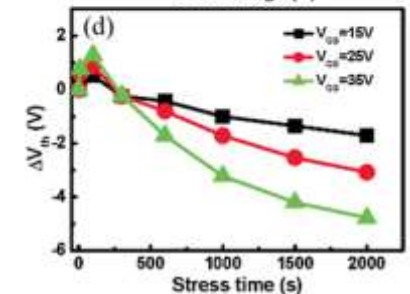
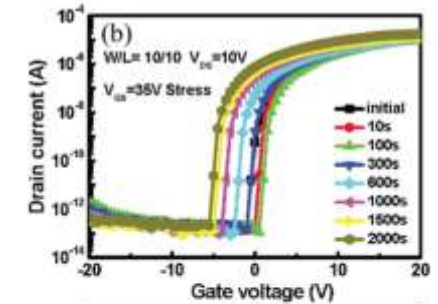


$$T(z) = \frac{P_l}{2\pi \kappa_{eff}} \ln\left(\frac{z}{2h_0 - z}\right)$$

# PBTI vs. HCD: Extreme Temperature Sensitivity



... well known in TFT literature

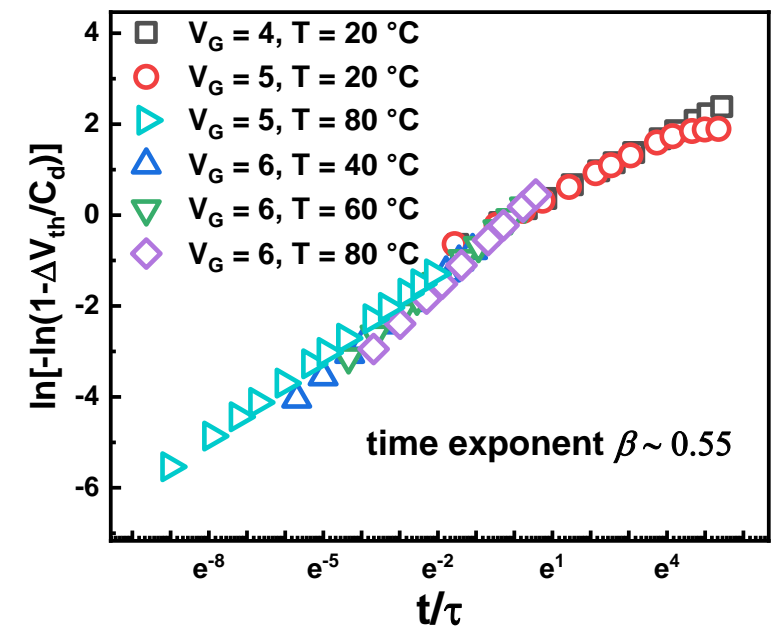
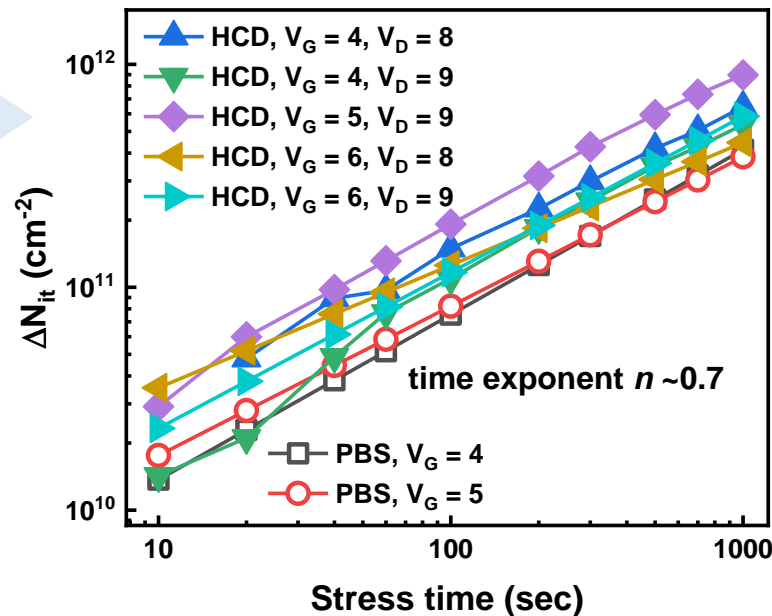
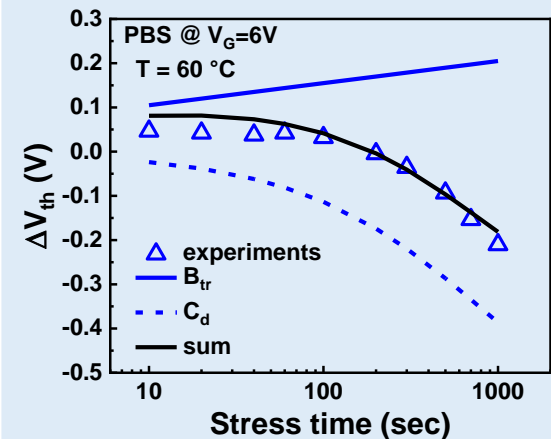
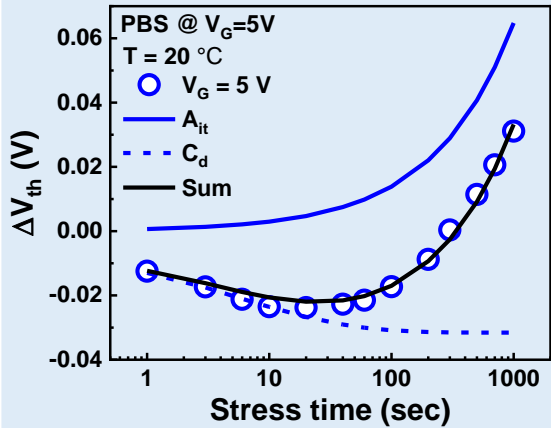


# Underlying degradation is actually universal!

$$\Delta V_{th}(t) = A_{it} t^n + B_{tr} \log\left(\frac{t}{\tau_{tr}}\right) - C_d \left(1 - e^{-\left(\frac{t}{\tau_d}\right)^\beta}\right)$$

Interface  
Trap-generation

Hydrogen-assisted  
Donor trap formation

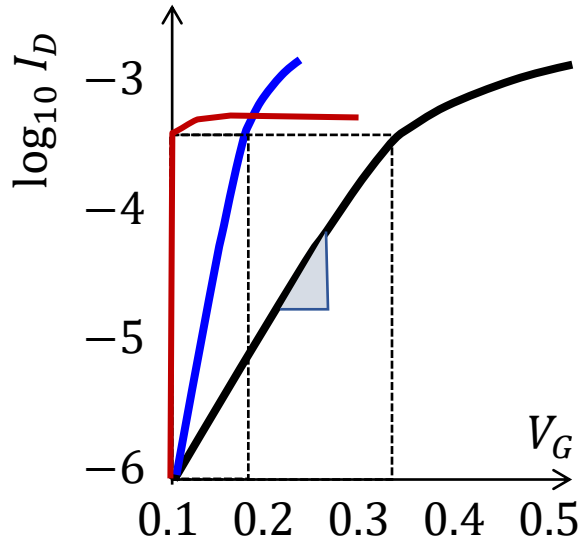




# Outline

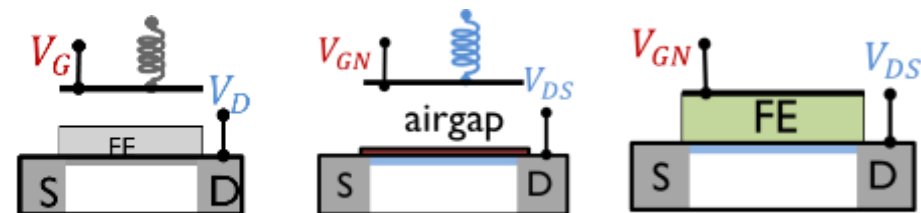
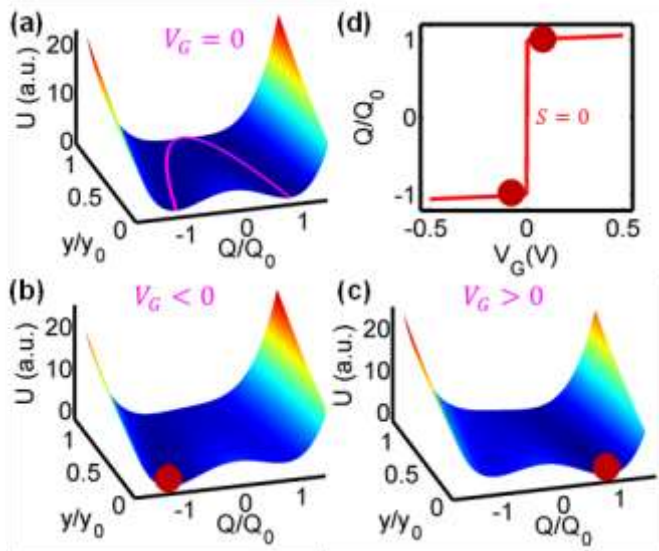
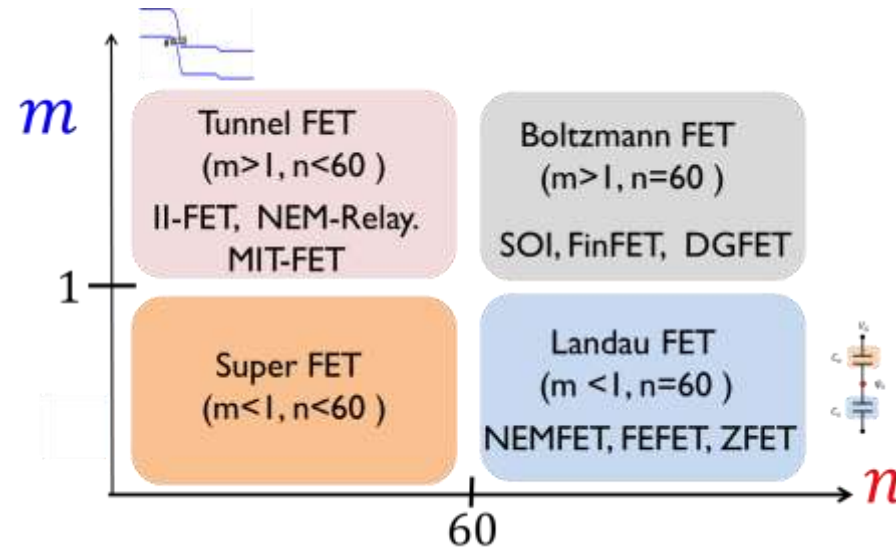
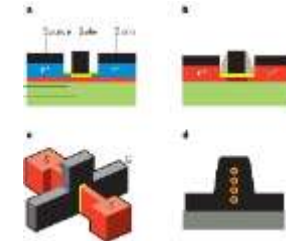
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# Power Solution: Landau switches



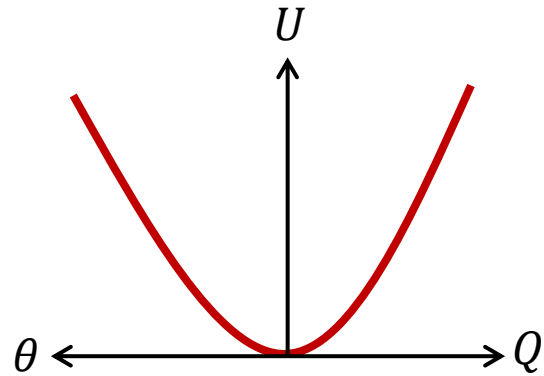
$$\Delta T \equiv T - T_a = P \times R_{th}$$

$$S \equiv \left[ \left( \frac{d\psi_s}{dV_G} \right) \left( \frac{d \log_{10}(I_{DS})}{d\psi_s} \right) \right]^{-1} = m \times n$$

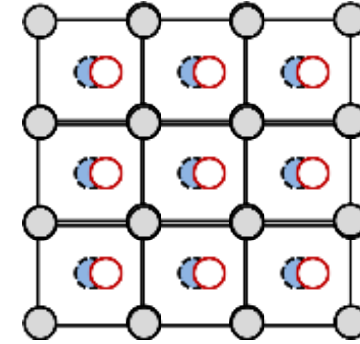
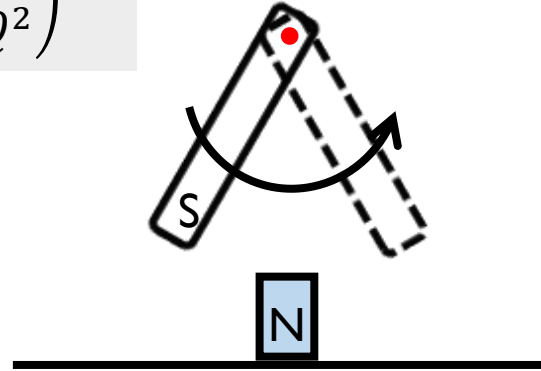


# Positive and Negative Capacitors

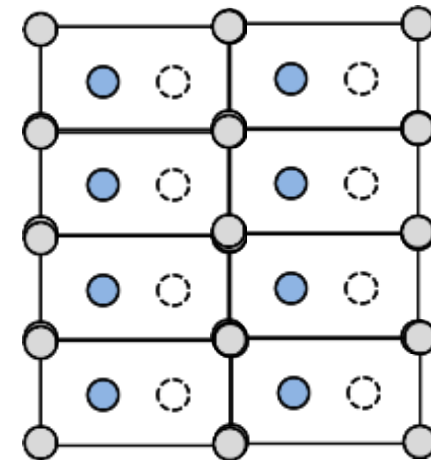
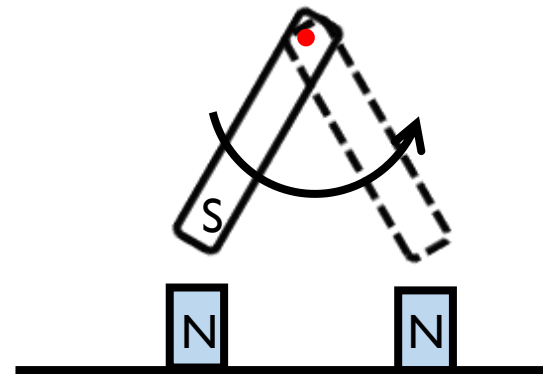
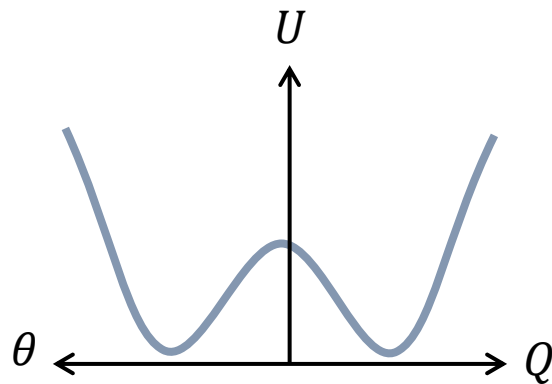
$$U = Q^2 / (2C_o)$$



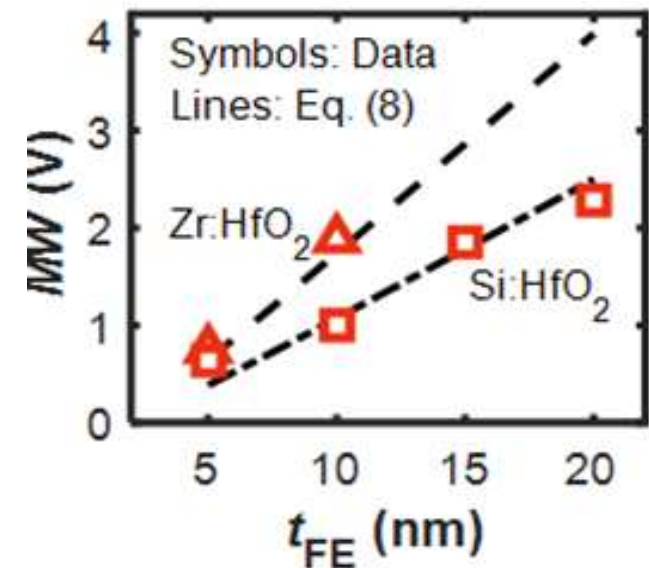
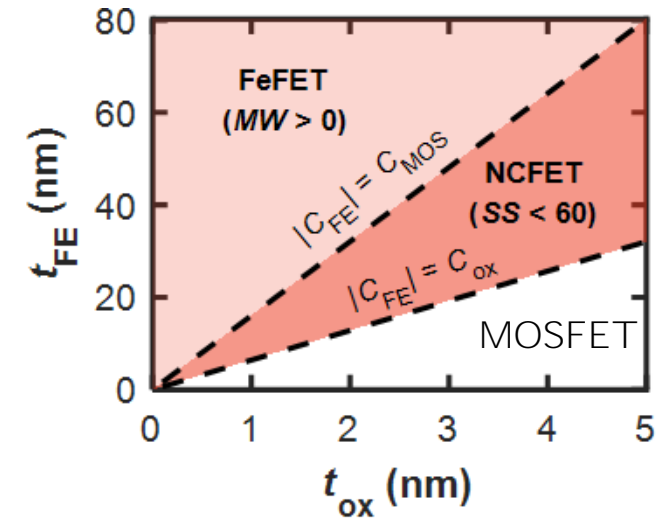
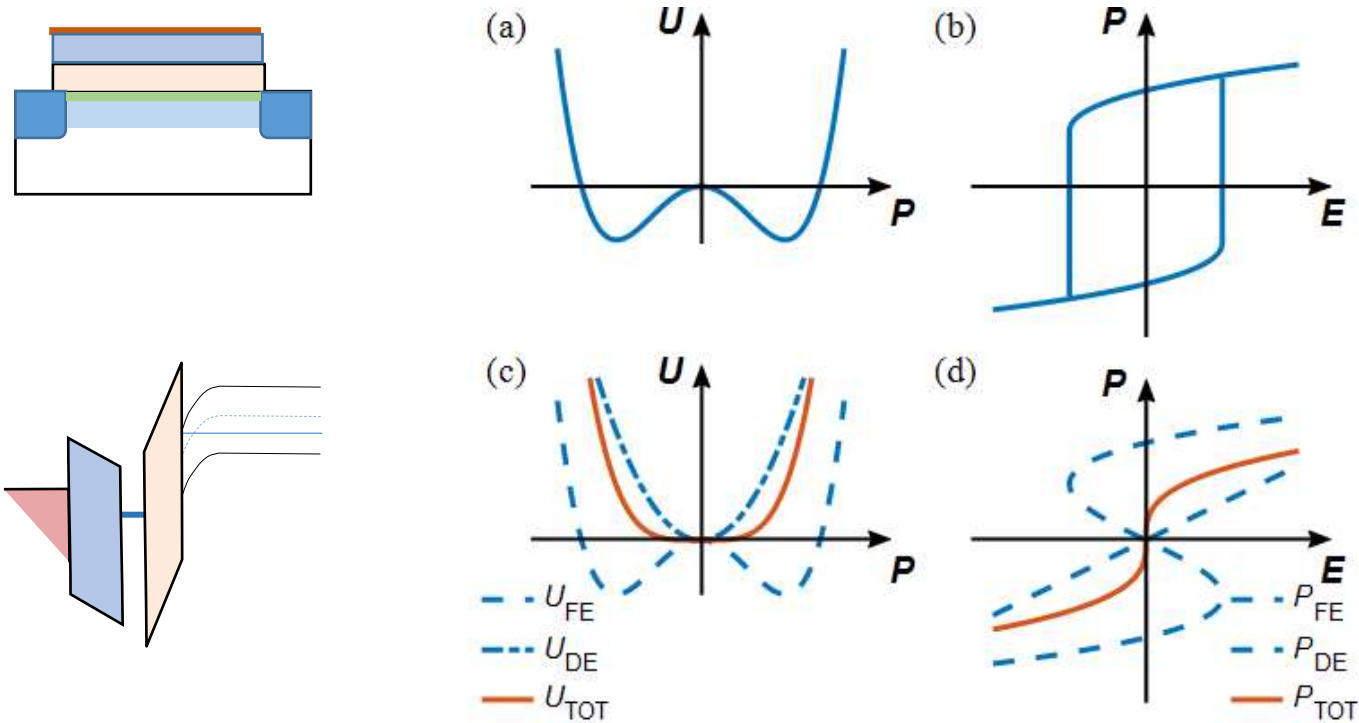
$$C \equiv \left( \frac{d^2U}{dQ^2} \right)^{-1}$$



$$U = -(\alpha Q^2 / 2) + (\beta' Q^4 / 4)$$

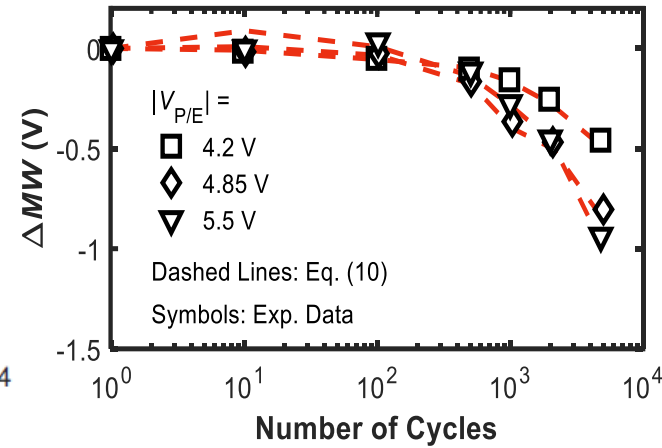
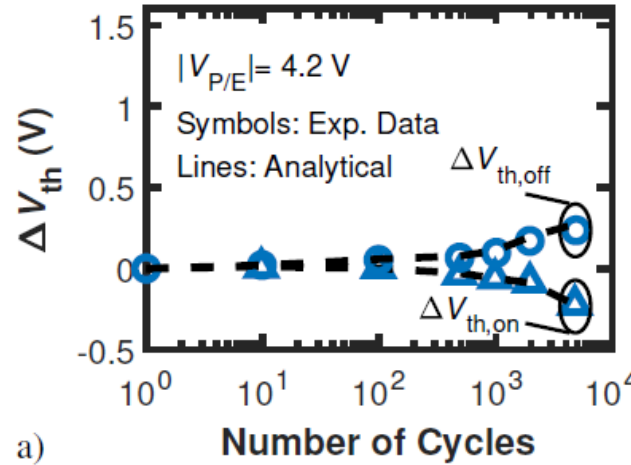
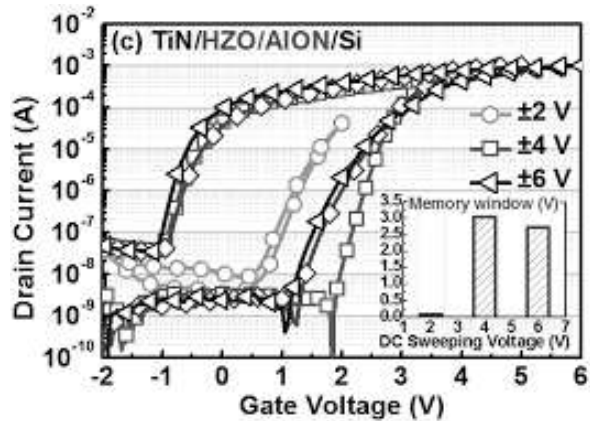


# Reliability of FeFET and NCFET: Landau model



K. Karda et al., TED, 2019. N. Zagni, APL, 2020.  
 Reliability Physics of Ferroelectric/Negative Capacitance Transistors for  
 Memory/Logic Applications: An Integrated Perspective, JMR, 2021.  
 A tutorial Introduction to NCFET: <https://nanohub.org/resources/23157>

# Endurance of FETFET .. Si/SiO2 defects

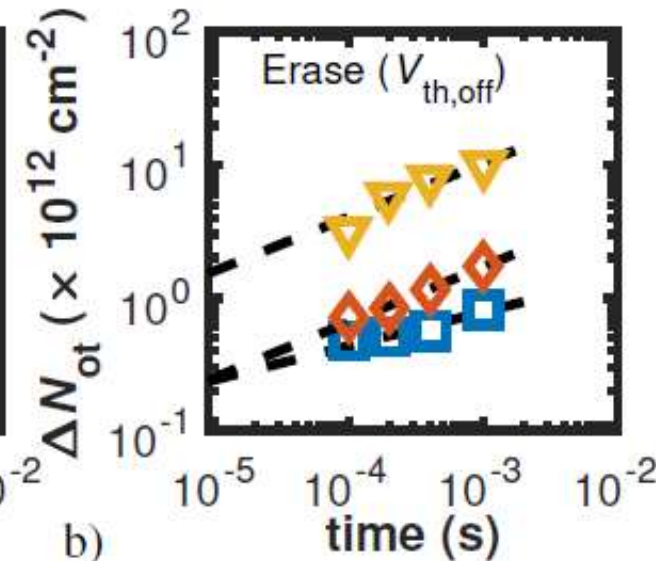
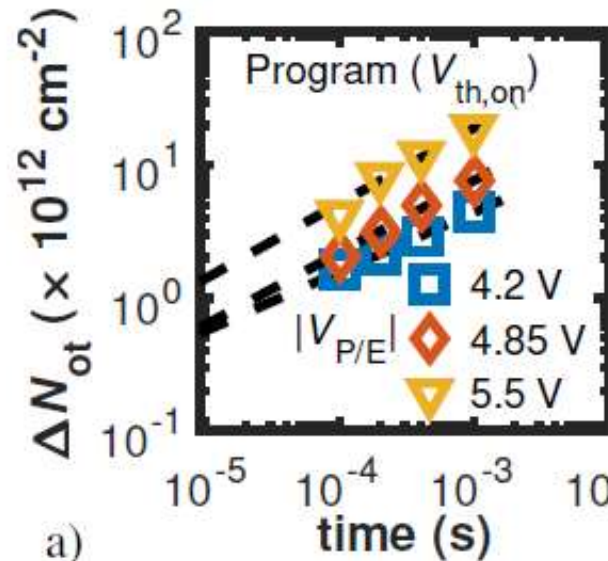
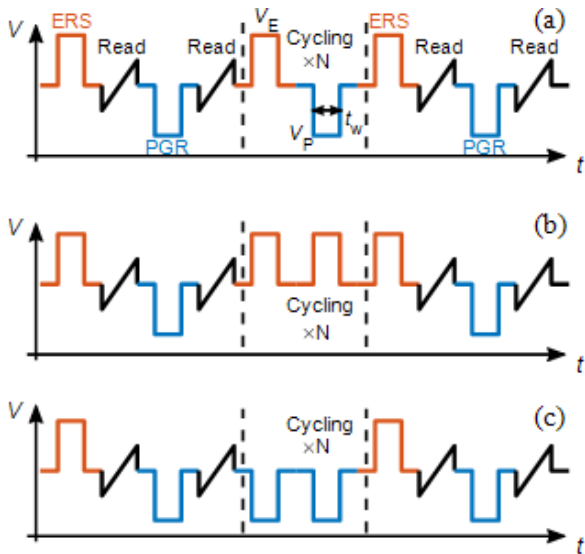


$$V_{th,on} = V_{FB} + 2V_t \ln \left( \frac{2V_t}{|a|Q_0} \right) - 2V_t$$

$$V_{th,off} = V_{FB} + 2V_t \ln \left( \frac{Q_{sw}}{Q_0} \right) - V_{sw}$$

$$MW = 2V_t \ln \left( \frac{2V_t}{|a|Q_{sw}} \right) + (V_{sw} - 2V_t)$$

a)



a)

b)

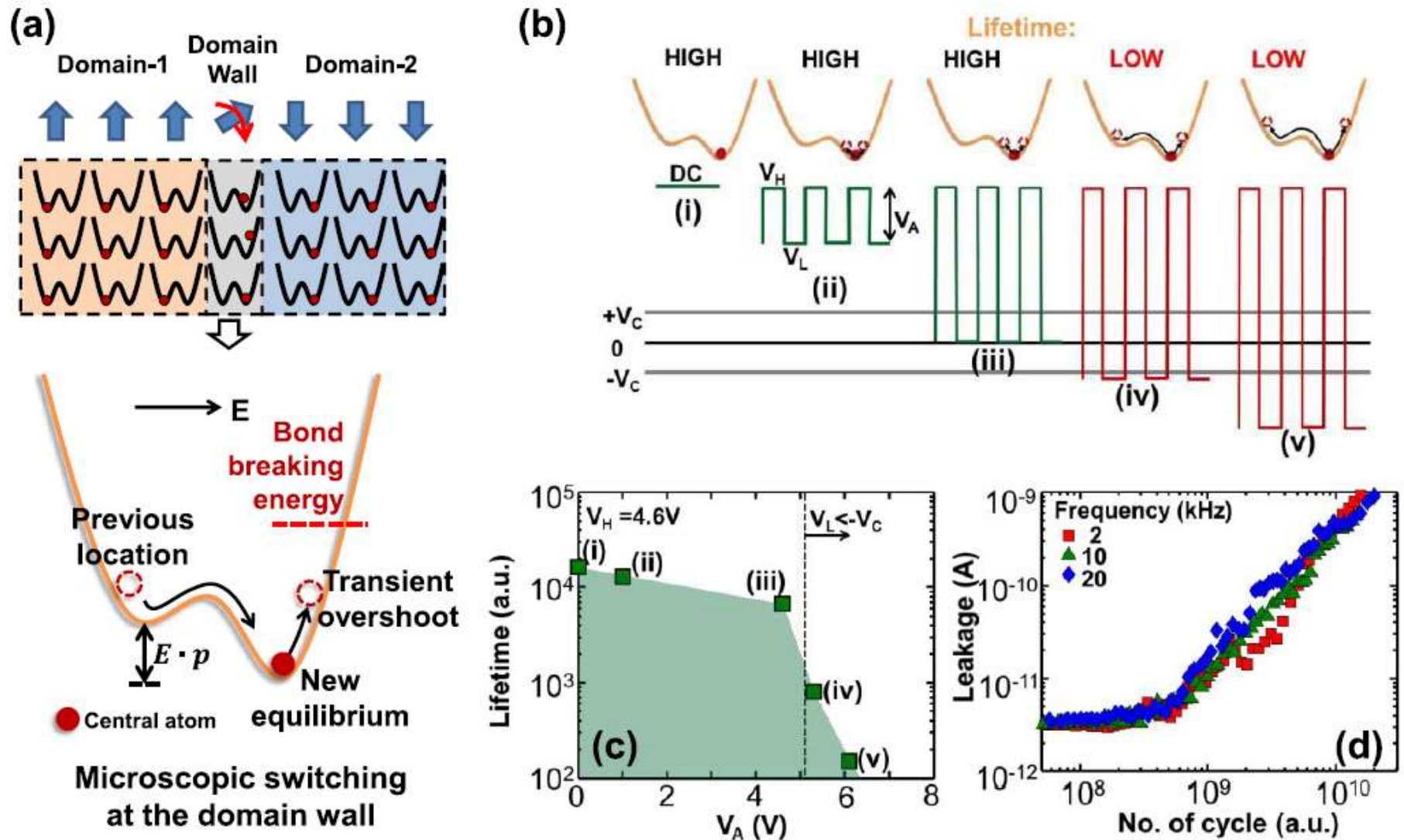
Zagni, Nicolò et al. APL  
117.15 (2020): 152901.

$$\Delta V_{th,on} = 2V_t \ln \left( 1 + \frac{q\Delta D_{u,P}}{C_{ox}} \right) \times \left( 1 + \frac{q\Delta D_{u,P}}{C_{ox}} \right) - \frac{q}{C_{ox}} \times \left\{ \Delta N_{ox,P} - \Delta D_{u,P} \left[ 2V_t \ln \left( \frac{2V_t}{|a|Q_0} \right) - 2V_t - \phi_b \right] \right\} \quad (8a)$$

$$\Delta V_{th,off} = -\frac{q}{C_{ox}} \left\{ \Delta N_{ox,E} - \Delta D_{u,E} \left[ 2V_t \ln \left( \frac{Q_{sw}}{Q_0} \right) - \phi_b \right] \right\} \quad (8b)$$

$$\Delta MW = 2V_t \ln \left( 1 + \frac{q\Delta D_{u,P}}{C_{ox}} \right) \times \left( 1 + \frac{q\Delta D_{u,P}}{C_{ox}} \right) - \frac{q}{C_{ox}} \left\{ (\Delta N_{ox,P} - \Delta N_{ox,E}) - 2V_t \Delta D_{u,P} \left[ \ln \left( \frac{2V_t}{|a|Q_0} \right) - 1 \right] + 2V_t \Delta D_{u,E} \ln \left( \frac{Q_{sw}}{Q_0} \right) + (\Delta D_{u,P} - \Delta D_{u,E}) \phi_b \right\}$$

# Hot atom damage in FeFET

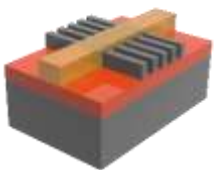
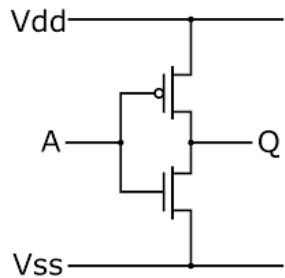
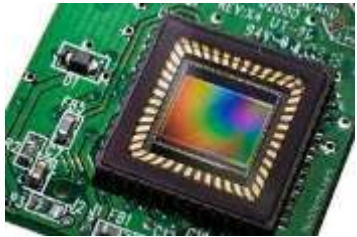


# Outline

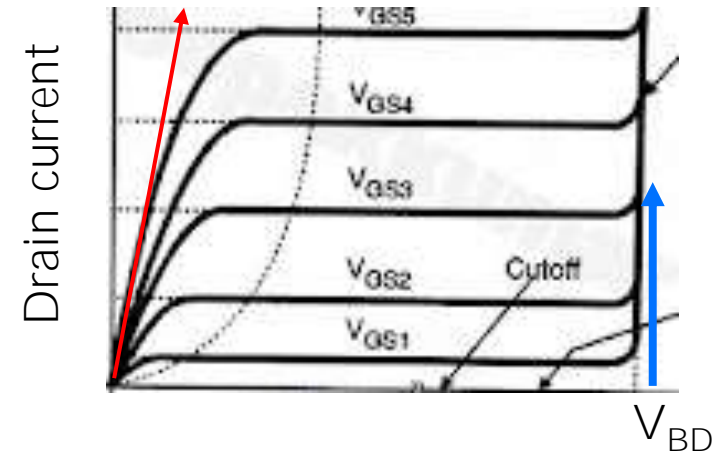
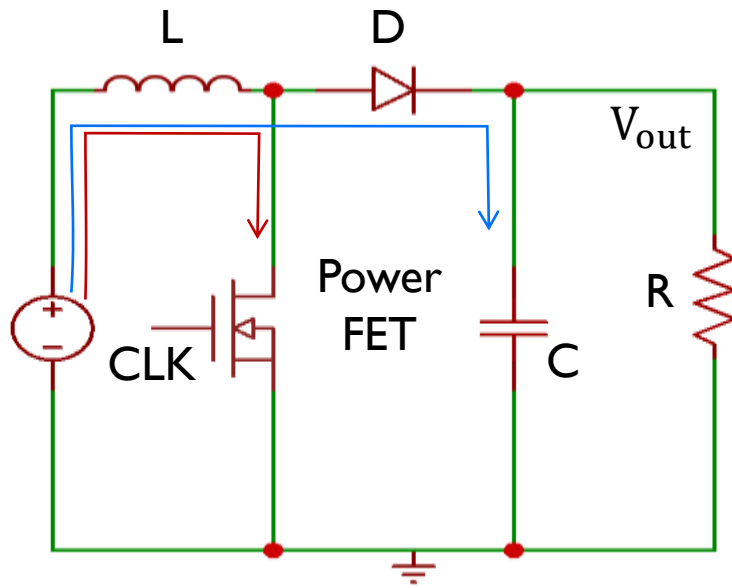
- Introduction: Moore's law is dead, long-live Moore's law
- Self-heating in logic transistors: An enduring challenge
- BEOL-integrated transistors: The next-frontier?
- The brave-new world of FeFET and NCFET
- Rethinking the reliability of power-transistors
- Reliability of 3D Heterogeneously integrated Systems
- Looking ahead

# Inverting logic vs. Power Transistors

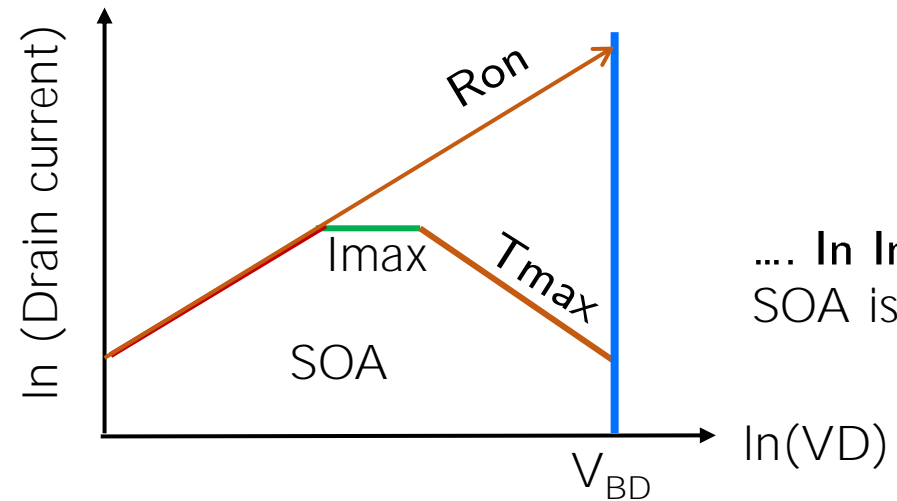
Logic



Power transistors



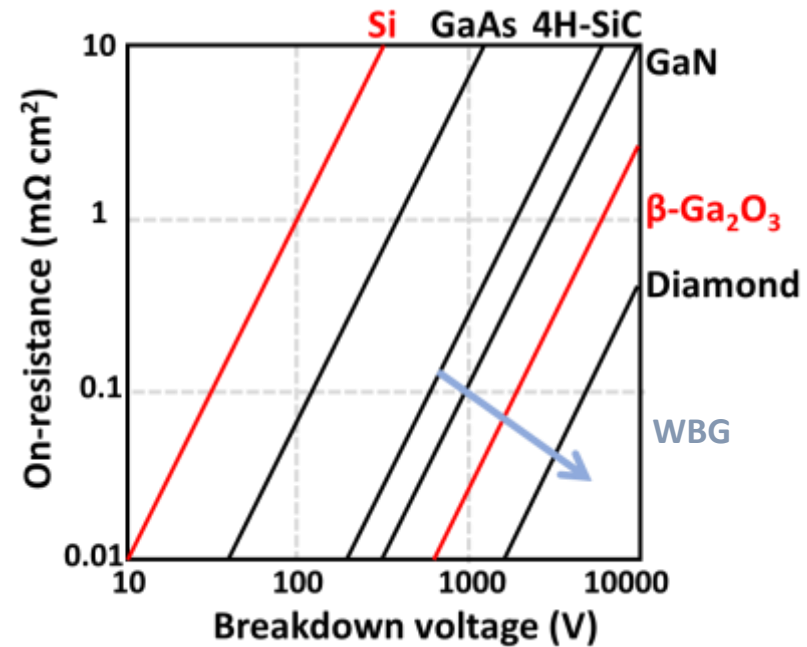
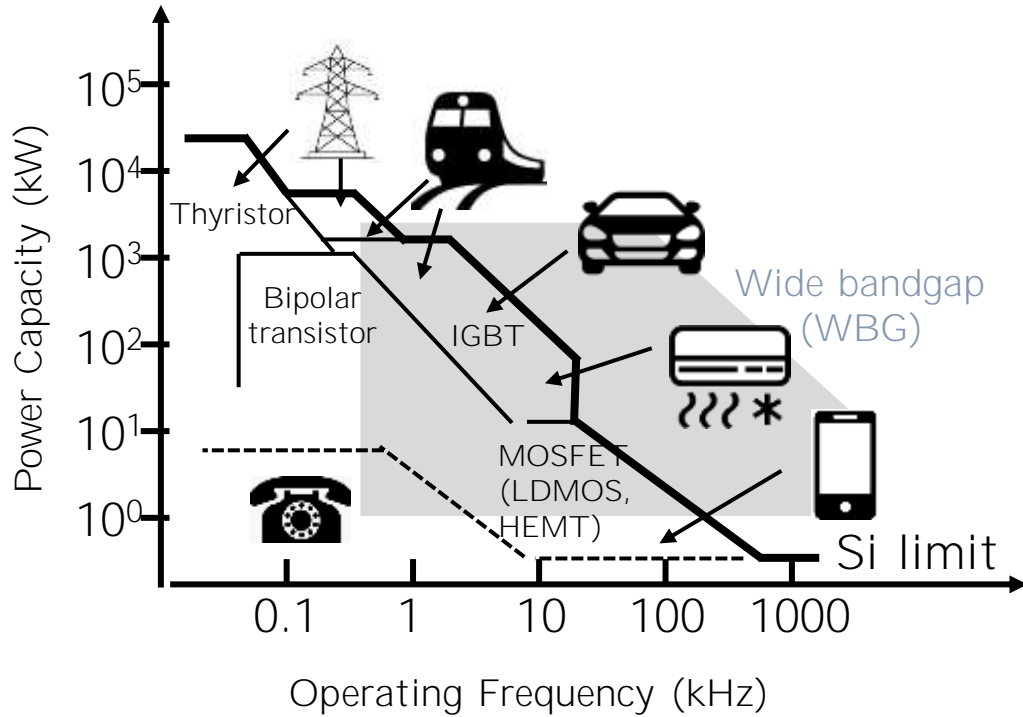
$$\frac{4V_{BD}^2}{R_{on}} = E_c^3 \kappa \epsilon_0 \mu$$



.... In Industry,  
SOA is important



# WBG electronics: Discovery of Ga<sub>2</sub>O<sub>3</sub> ...

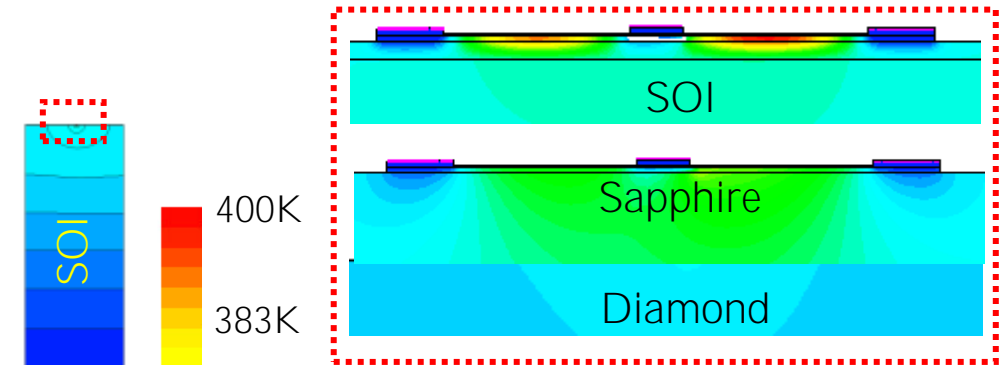
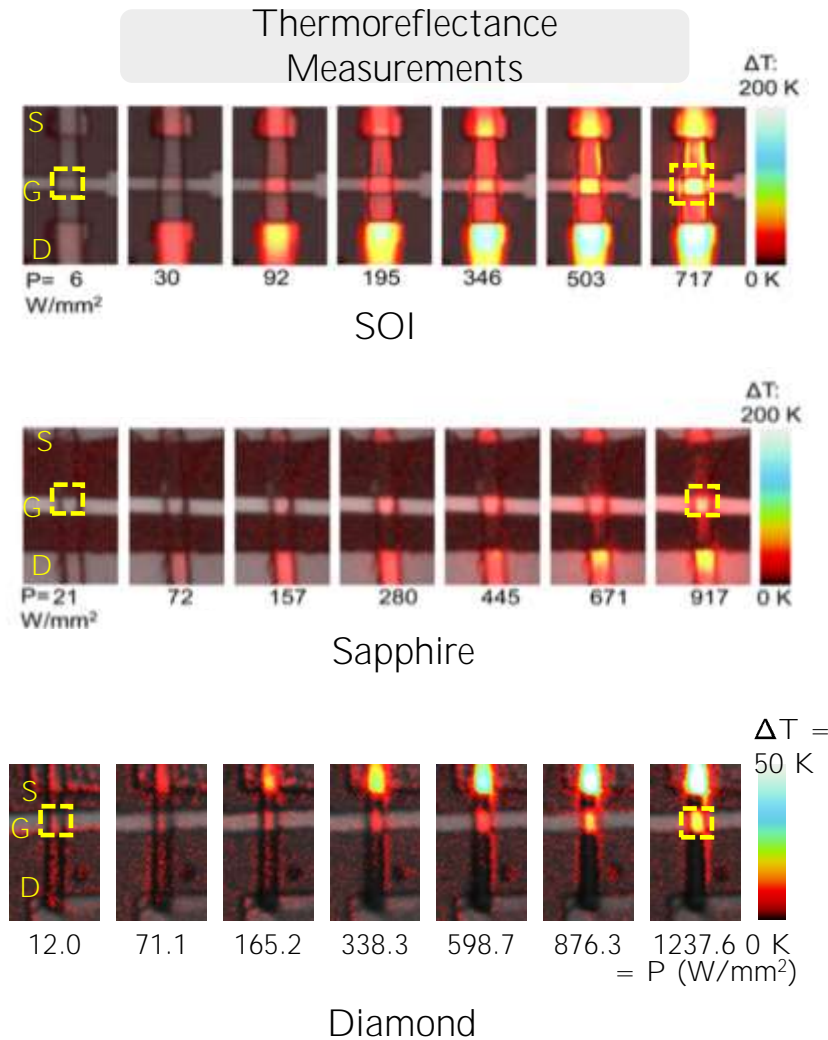


$$\frac{4V_{BD}^2}{R_{on}} = E_c^3 \kappa \epsilon_0 \mu$$

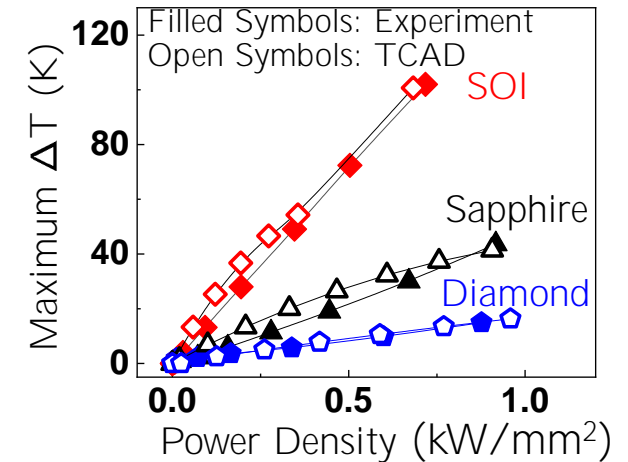
Material Parameters	Si	4H-SiC	GaN	β-Ga <sub>2</sub> O <sub>3</sub>	Diamond
Bandgap, E <sub>g</sub> (eV)	1.1	3.25	3.4	4.85	5.5
Breakdown, E <sub>c</sub> (MV/cm)	0.3	2.5	3.3	8	10

# TCAD Model ... thermal response

Mahajan et al. "Electrothermal performance limit of  $\beta$ -Ga<sub>2</sub>O<sub>3</sub> field-effect transistors." APL, 115.17 (2019): 173508.



$$V_G = -8V, V_D = 30V$$



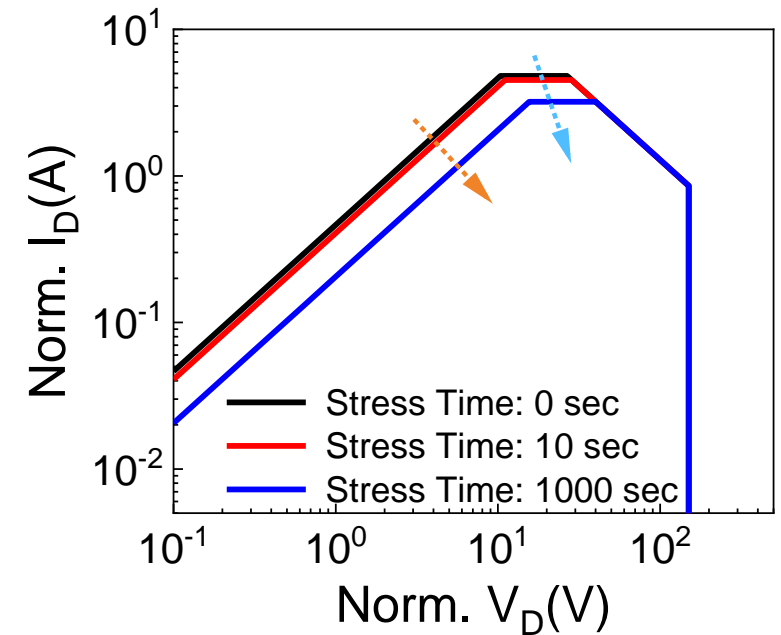
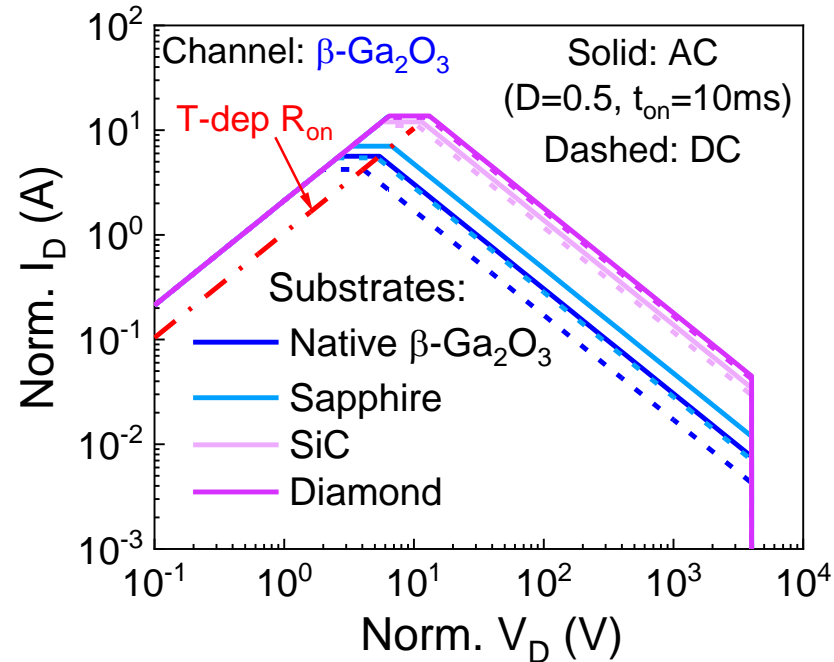
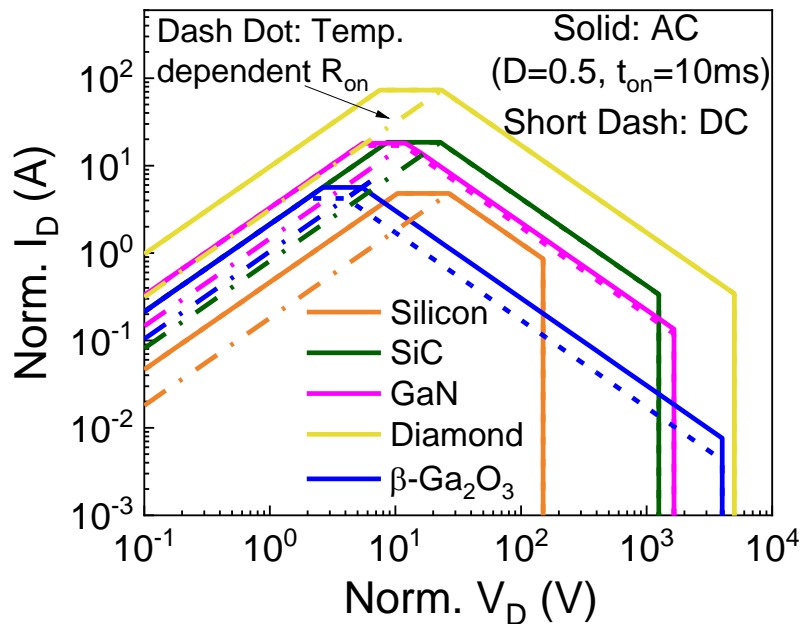
# A new SHE/reliability aware Power FOM ..

$$\frac{4V_{BD}^2}{R_{on}} = E_c^3 \kappa \epsilon_0 \mu$$



$$R_{on}(T_{on}) = \frac{4V_{bd}^2}{\epsilon \mu_0 E_c^3} \left[ 1 + \left( \frac{N_D \xi(T_{on})}{N_{ref}} \right)^\beta \right] \left( \frac{T_{on}}{300} \right)^\gamma \frac{\xi(T_{off})}{\xi(T_{on})}$$

$$Z_{th} = D \cdot R_{th} + (1 - D) \cdot Z_0 (1/f)$$

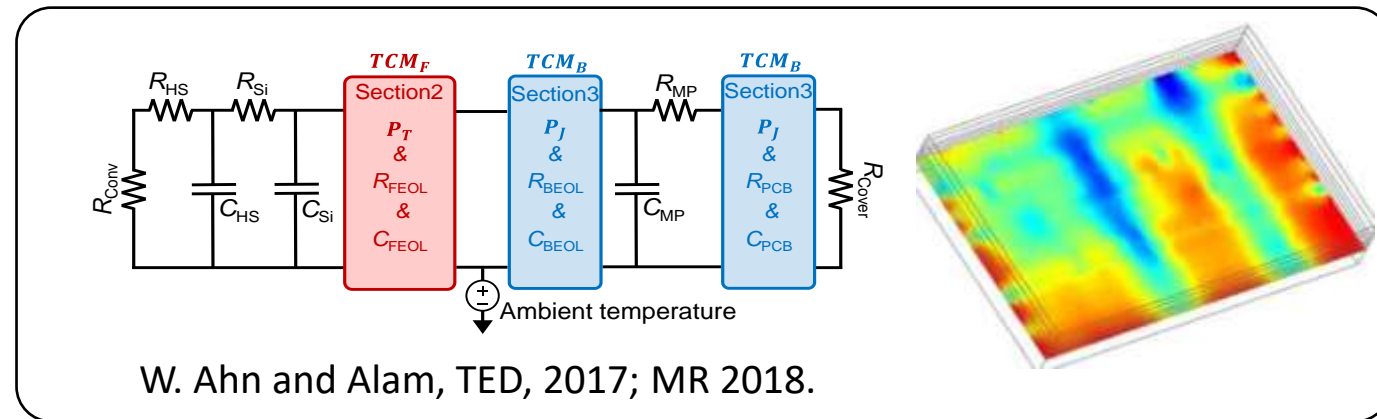
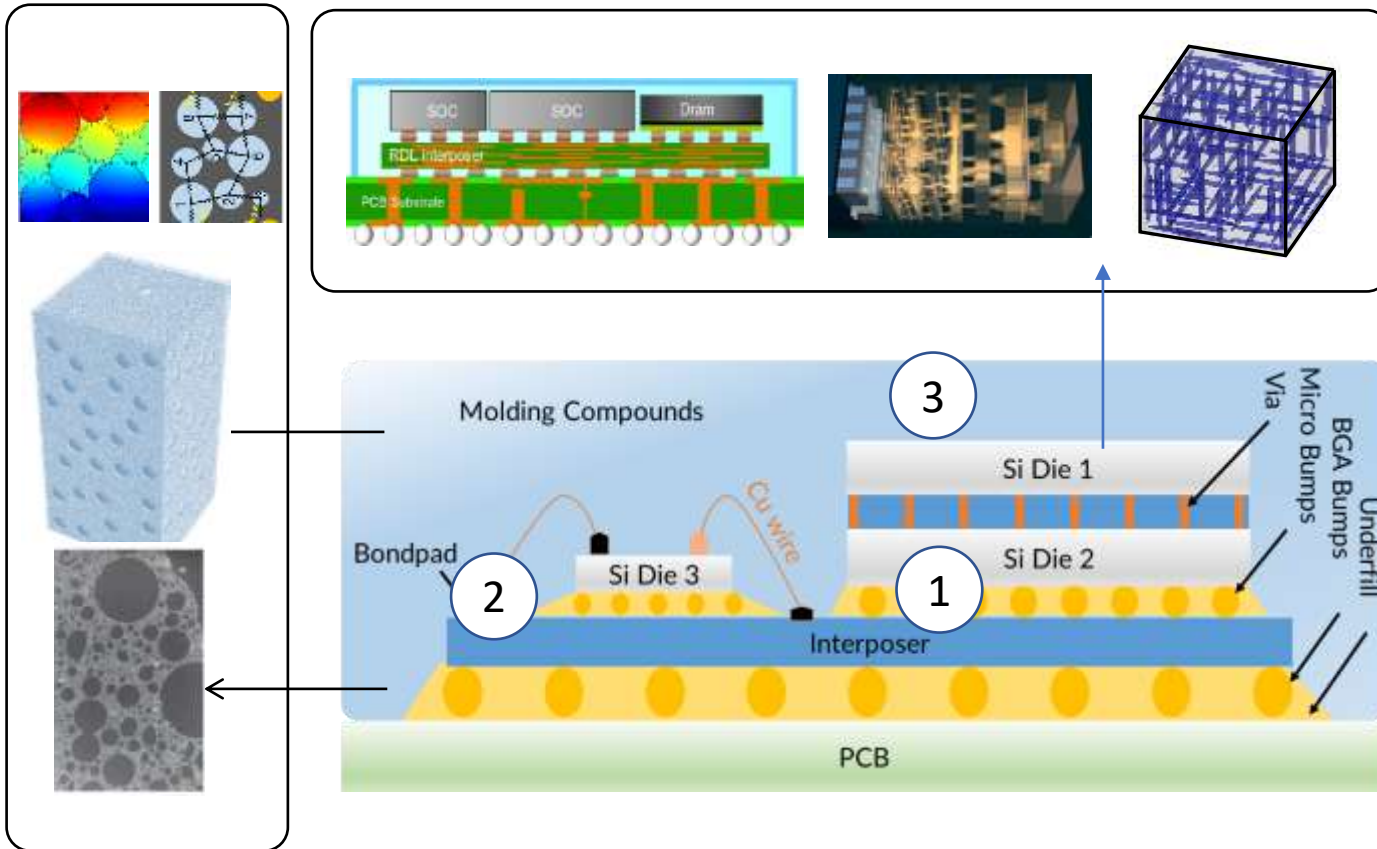


Mahajan, Chen et al., Self-Heating and Reliability-Aware "Intrinsic" SOA, TED, 2022.

# Outline

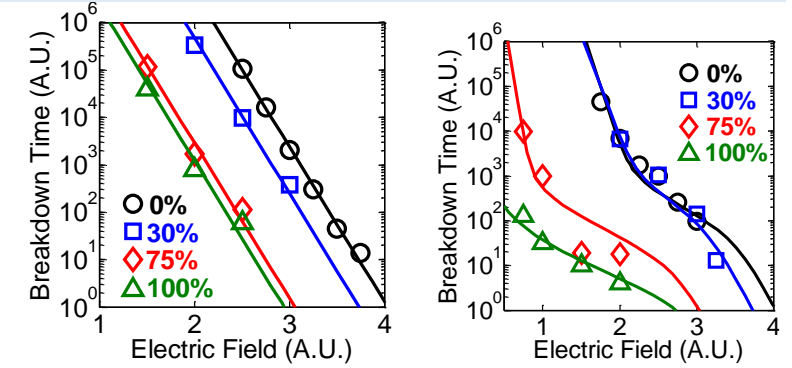
- Introduction: Moore's law is dead, long-live Moore's law
- Self-heating in logic transistors: An enduring challenge
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- The brave-new world of FeFET and NCFET
- Rethinking reliability of power-transistors
- Reliability of 3D Heterogeneously integrated Systems
- Summary

# Multi-scale, multi-physics electro-thermal-mechanical environment

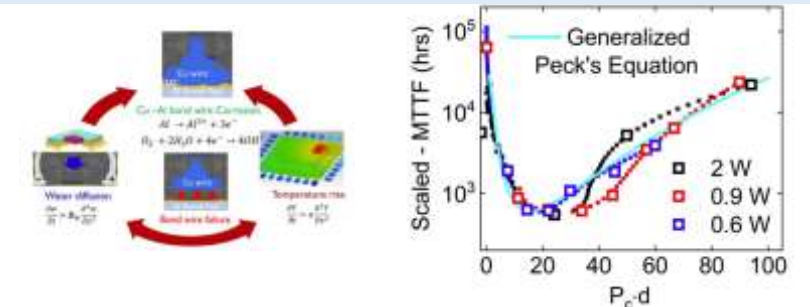


# Electrothermal reliability of 3D-HI

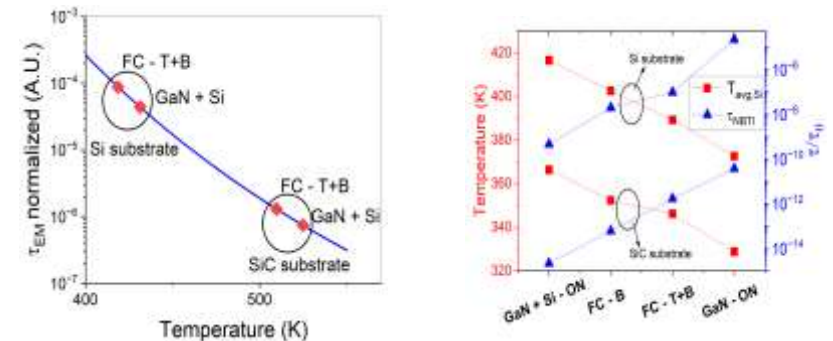
## 1. RDL PI dielectric failure (Palit, JAP, 2018)



## 2. Bond corrosion failure (Asad, IRPS, 2021)

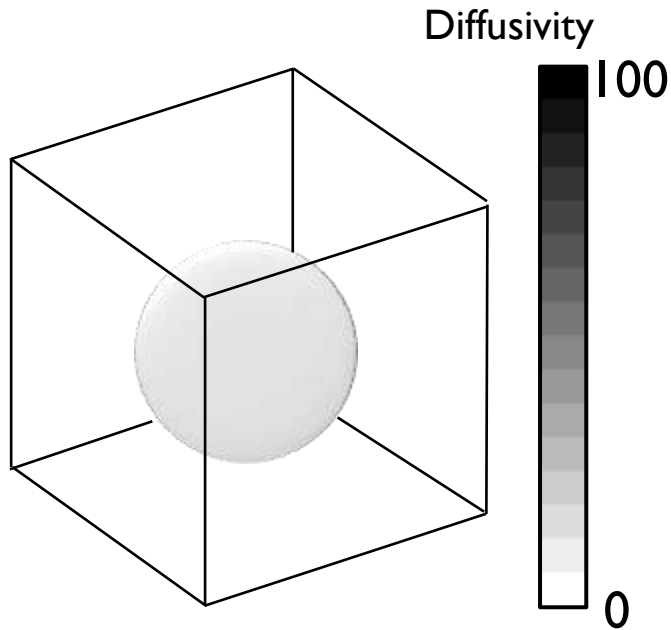


## 3. Transistor failure due to EM, HCI, NBTI

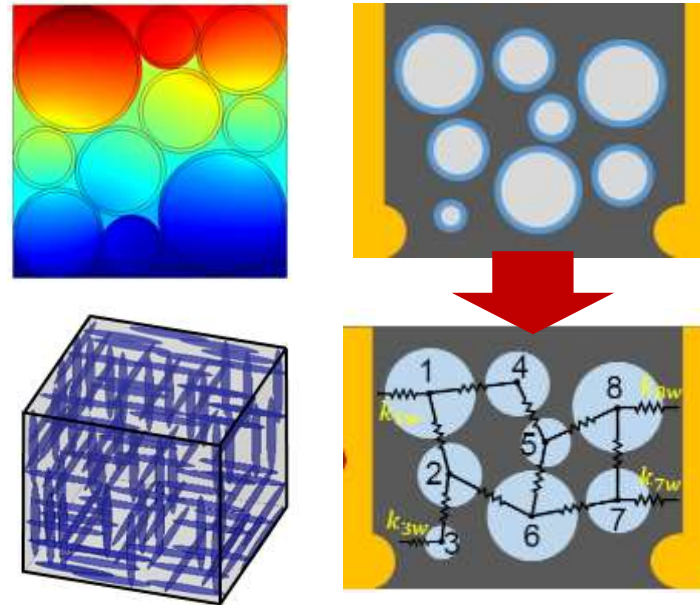


# Packaging reliability requires new techniques

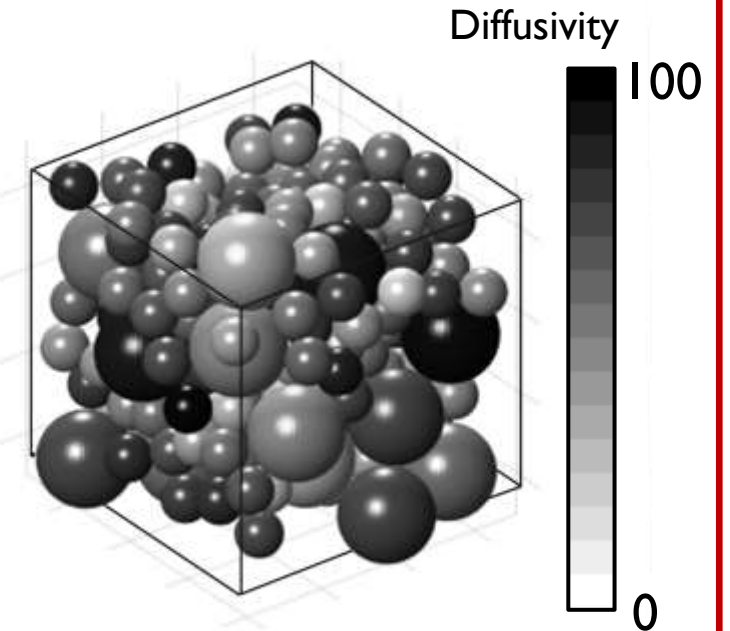
## Effective medium theory (MG model)



## Our approach (Generalized EMT)



## Percolation theory

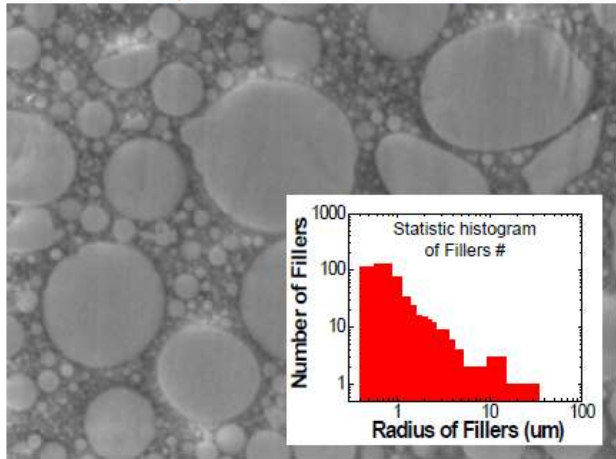
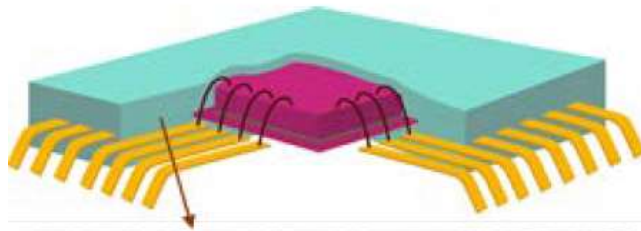


Small

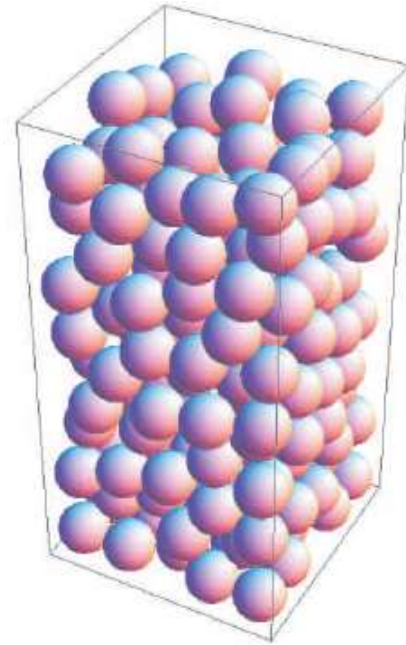
Volume fraction, contrast ratio

Large

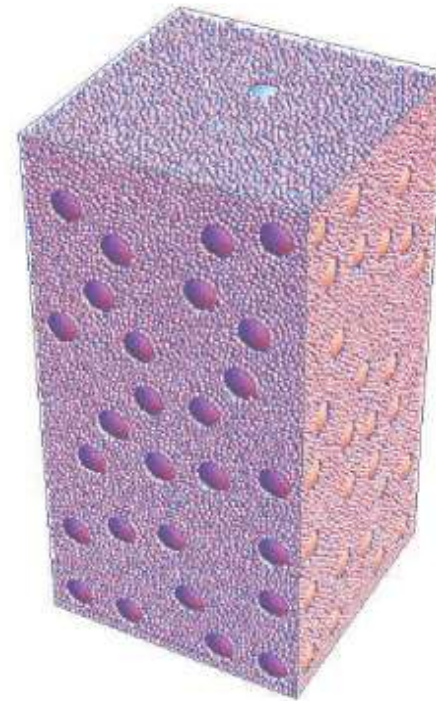
# Packing in epoxy-glass mold compound



Filler ~5-50 micron



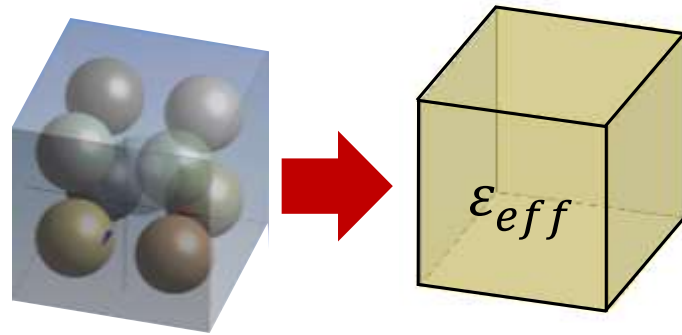
~60%



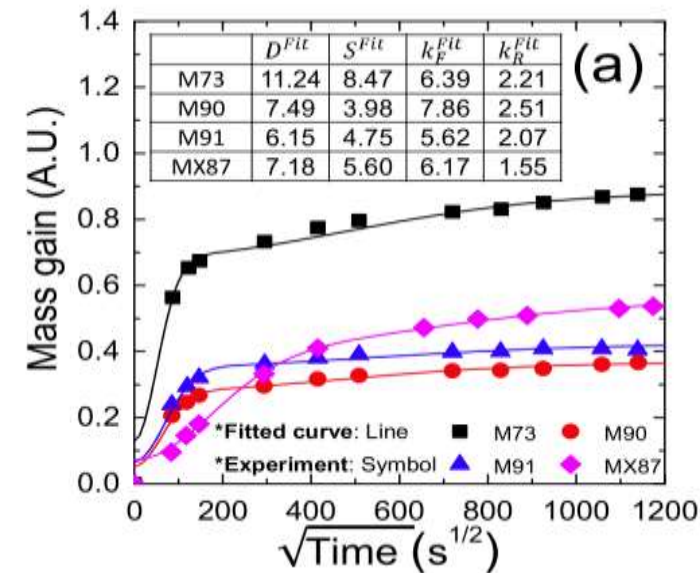
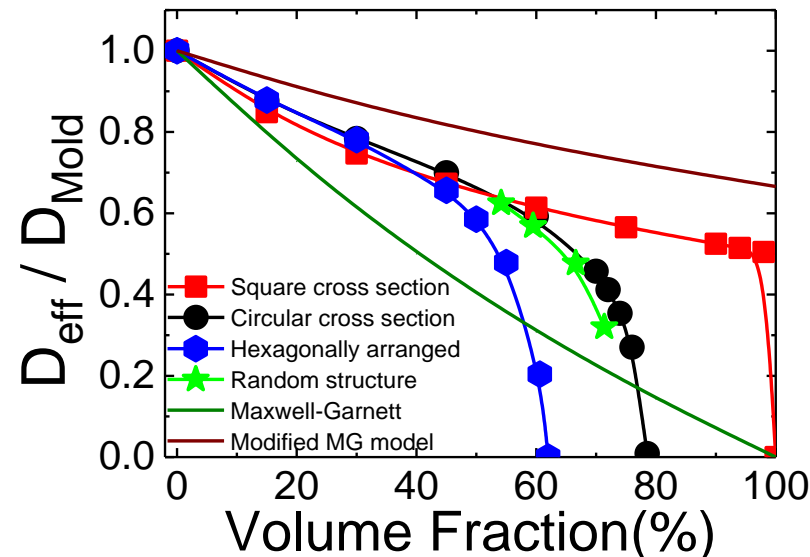
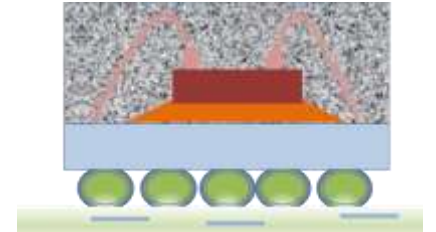
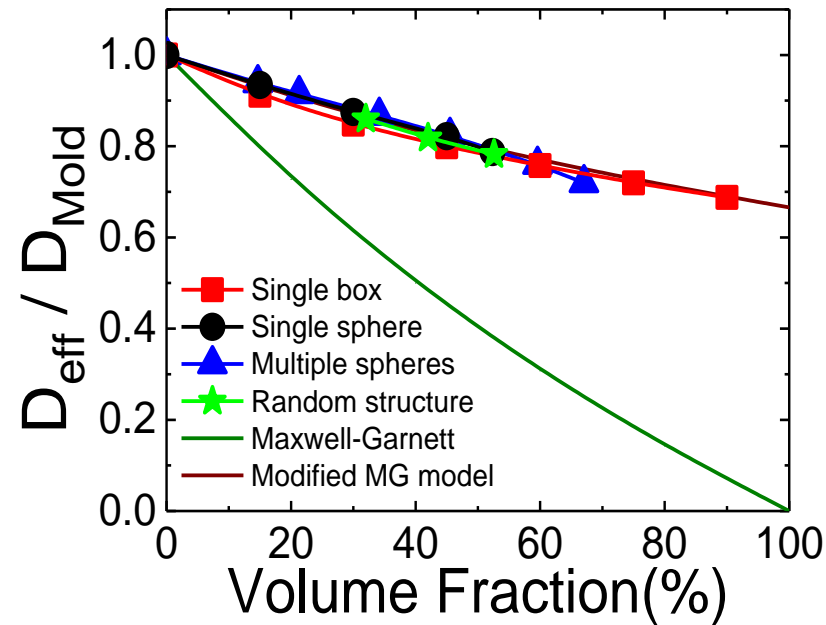
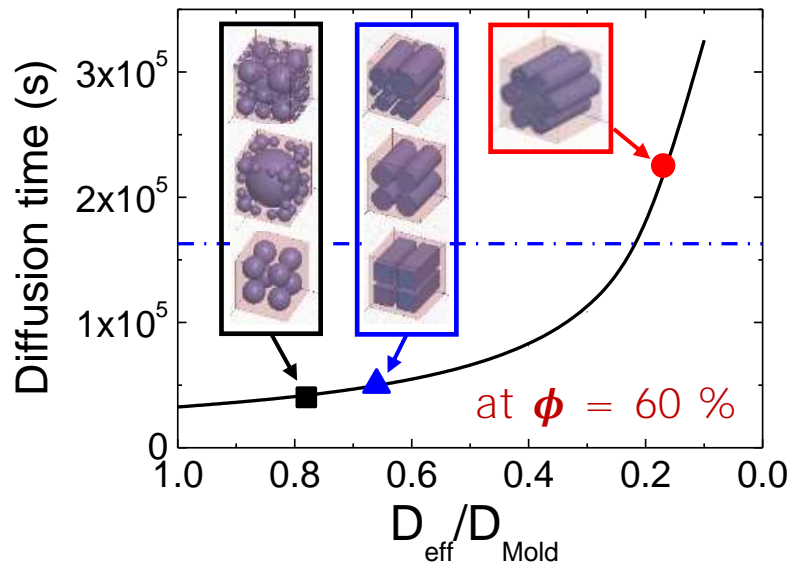
~80%



# Moisture ingress in polymers & mold-compounds

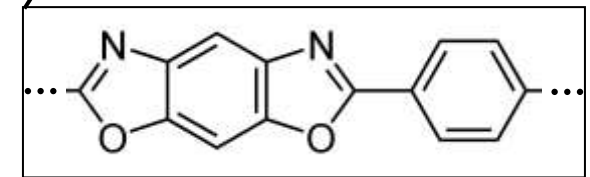
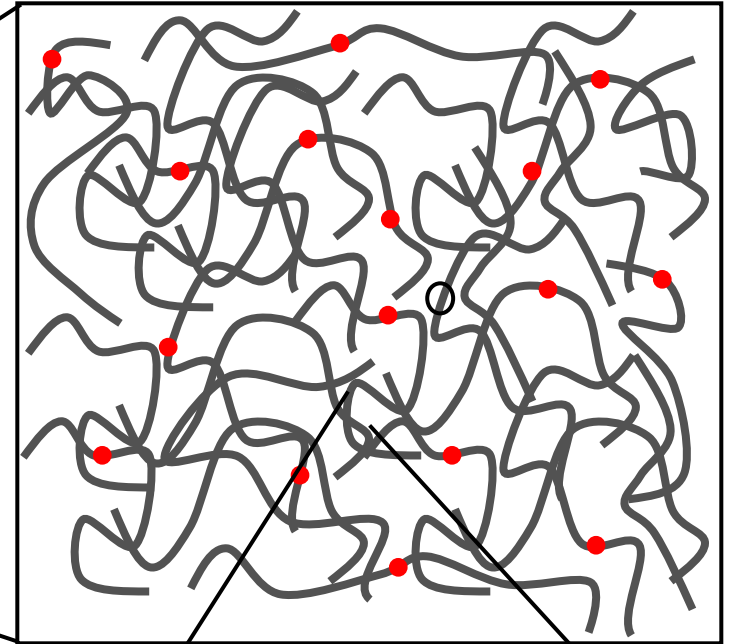
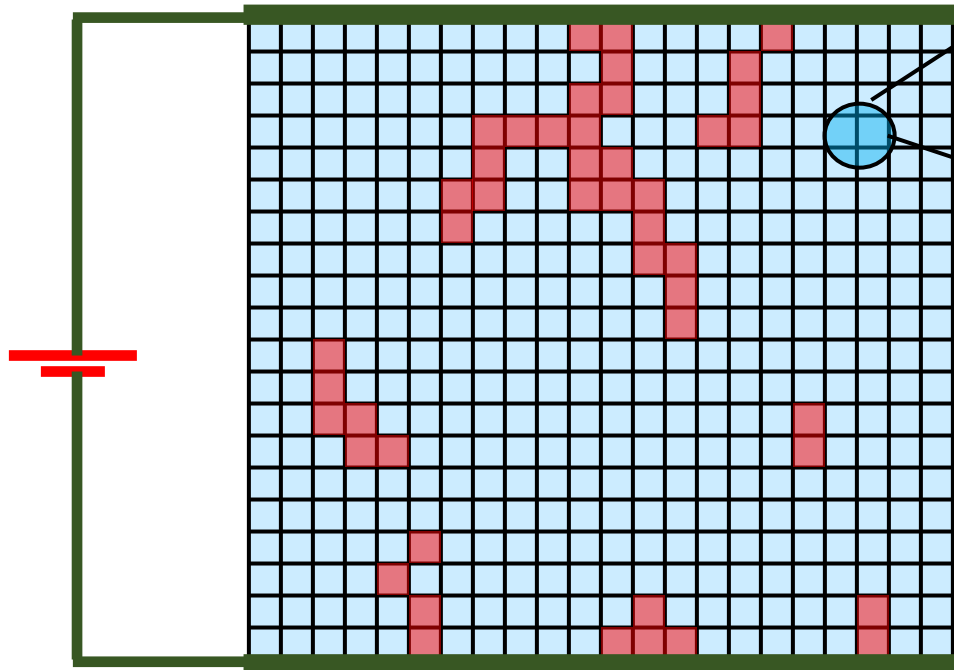
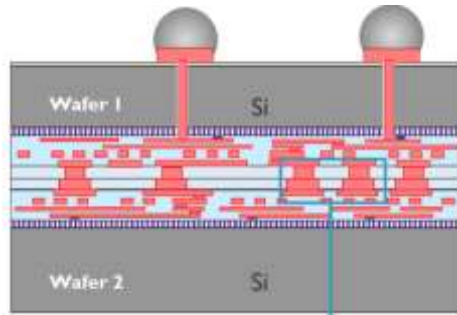
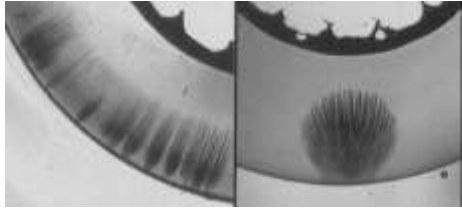


For moisture diffusion,  
EMT model needs to be modified!



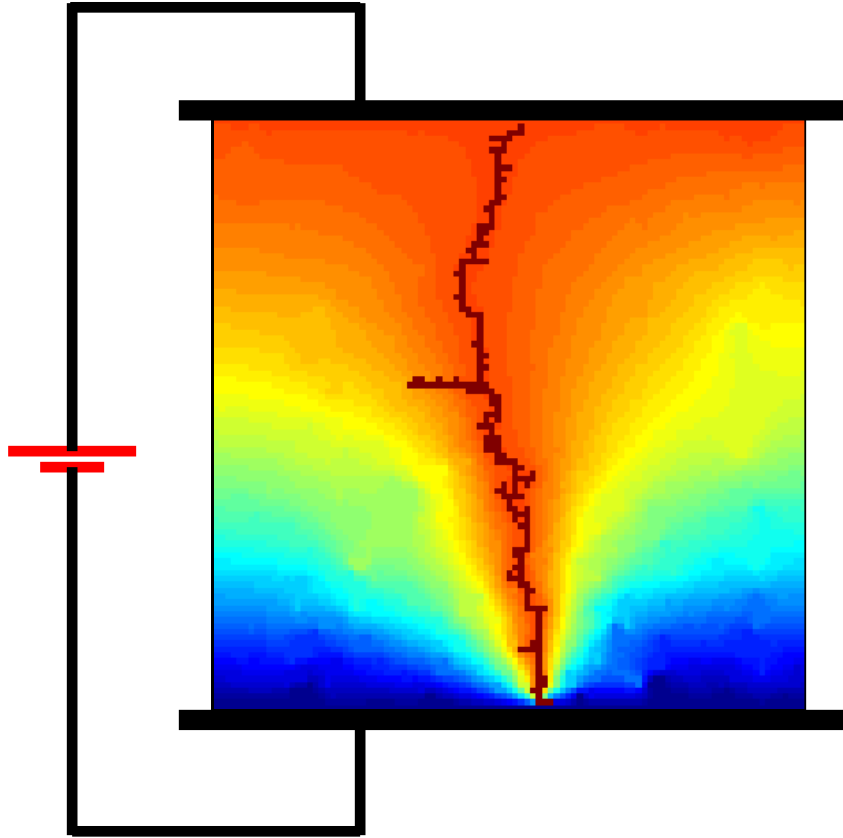


# Dielectric Breakdown: BEOL/RDL/TSV Oxides



Poly-Benzo-Oxazole (PBO)  
monomer

# Dielectric heating & breakdown rates



$$\frac{dN}{dt} = -N \times \frac{k_B T}{h} \exp\left(-\frac{\Delta G - aE}{kT}\right)$$

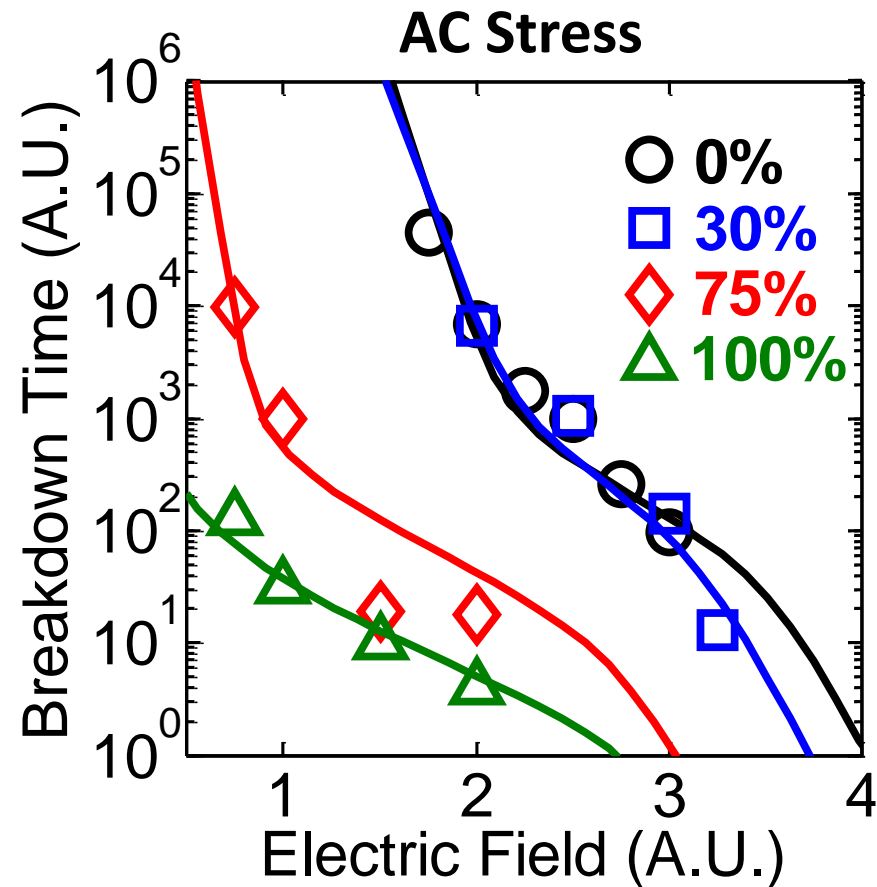
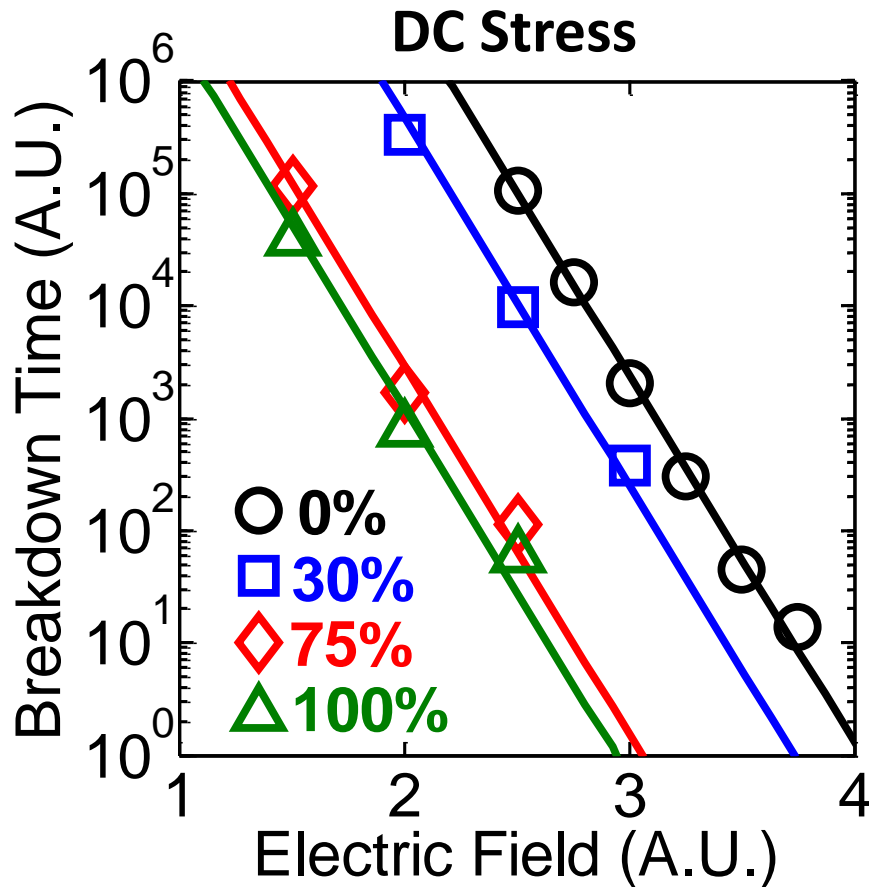
$$T_F = \frac{h}{kT} \log\left(\frac{1}{1-\eta}\right) \exp\left(\frac{\Delta G - aE}{kT}\right)$$

$$T(t) \approx T_0 + \frac{\omega \epsilon_r'' \epsilon_0 E^2 T_d}{2h} \left[ 1 - e^{-\frac{2\beta t}{C_P \rho T_d}} \right]$$

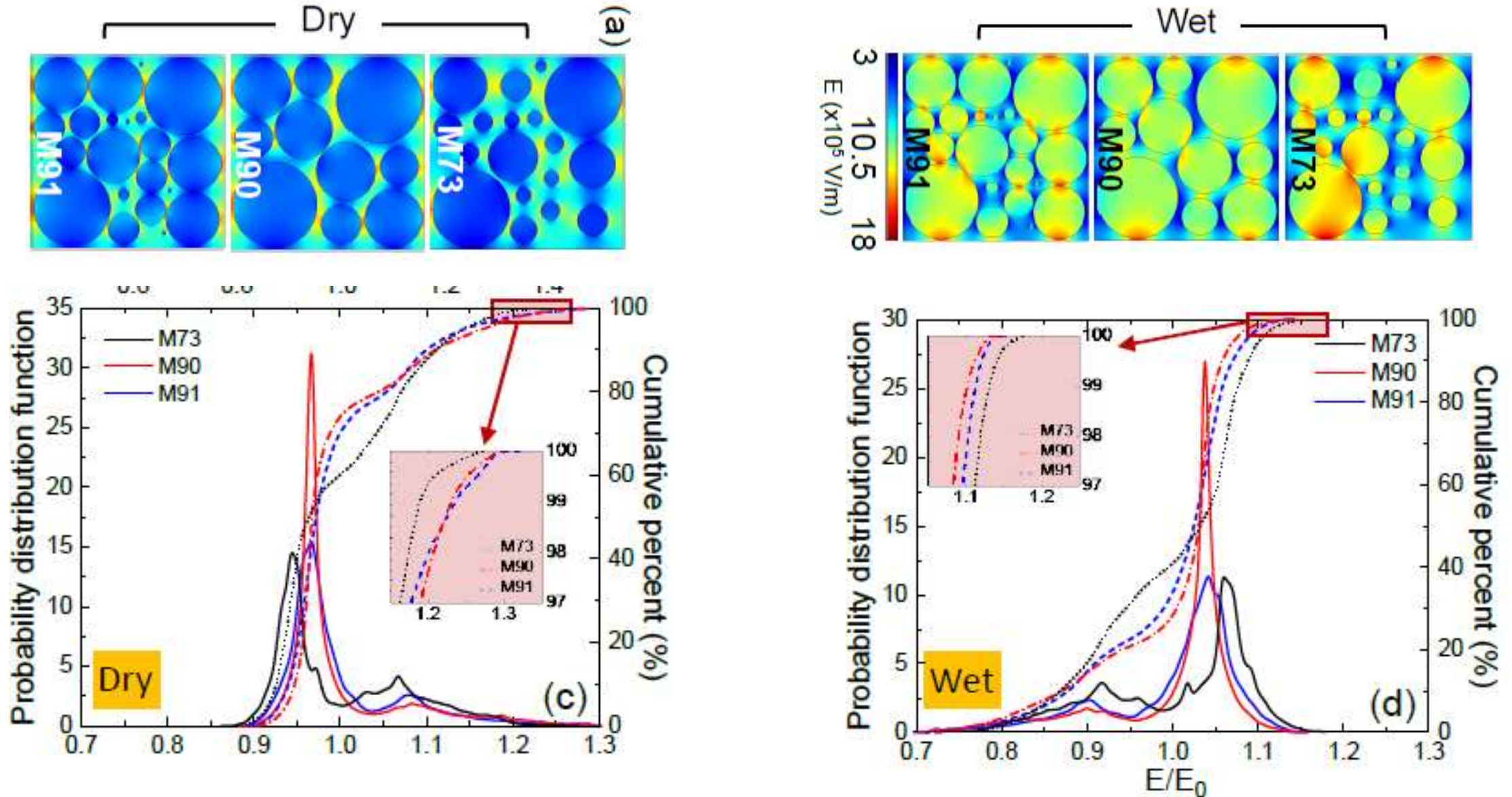
$$C_P \rho V \frac{dT}{dt} = \omega \epsilon_r'' \epsilon_0 E^2 V - \beta A (T - T_0)$$

# Humidity reduces lifetime

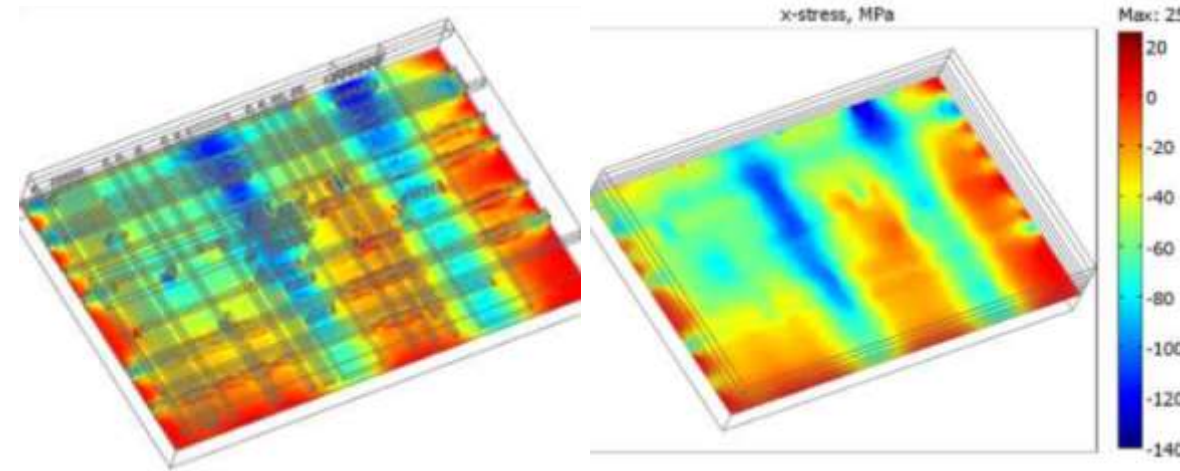
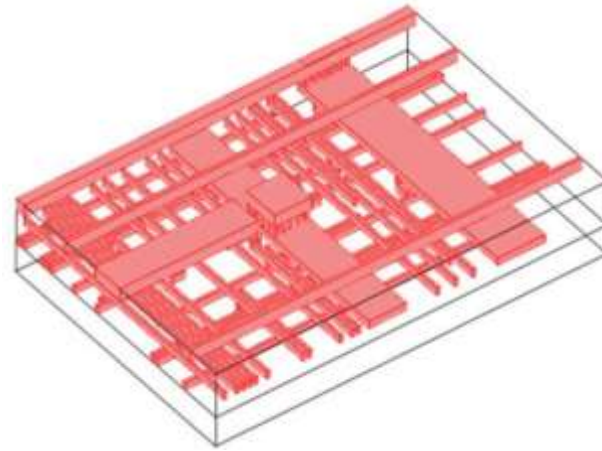
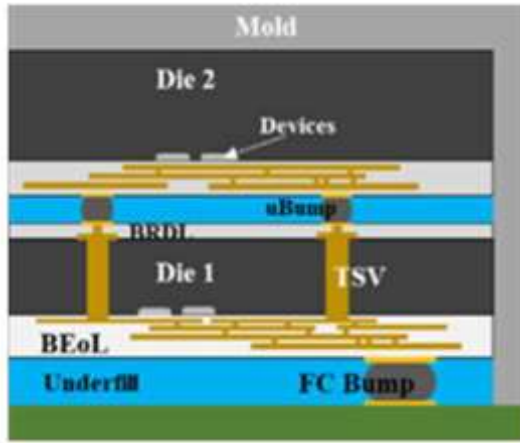
$$T_F \approx \frac{h}{k(T_0 + \Delta T)} \log \left( \frac{1}{1 - \eta} \right) \exp \left( \frac{\Delta G - aE}{k(T_0 + \Delta T)} \right) \quad \Delta T = \frac{\omega \epsilon_r'' \epsilon_0 E^2 T_d}{2\beta}$$



# Dielectric breakdown in Mold-Compounds



# CPI stress aware Front-End design



## THERMO-MECHANICAL PROPERTIES OF COMPOSITE LAYERS

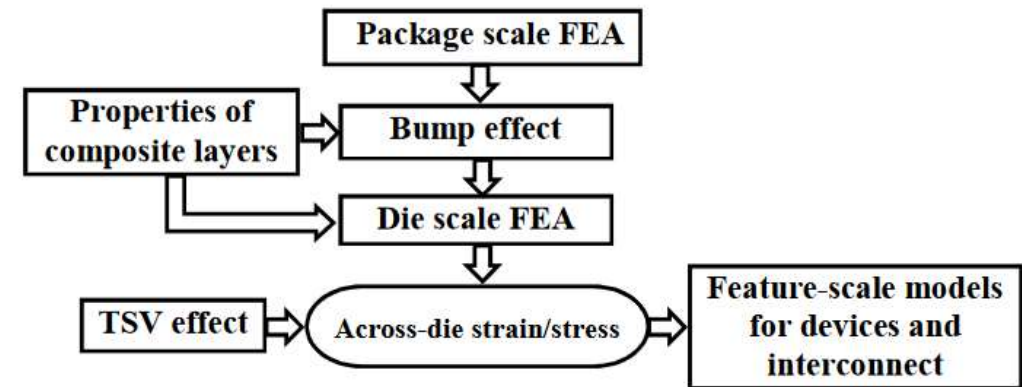
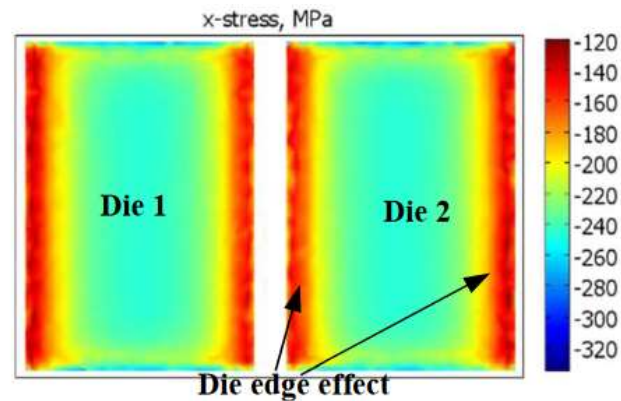
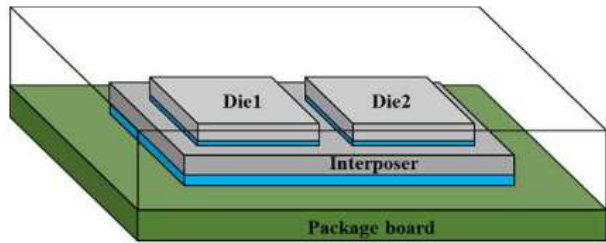
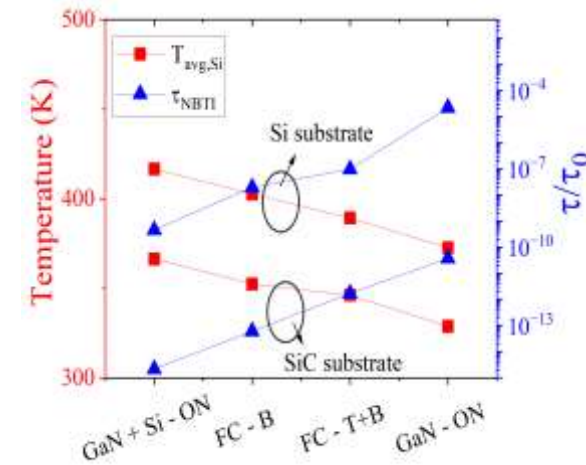
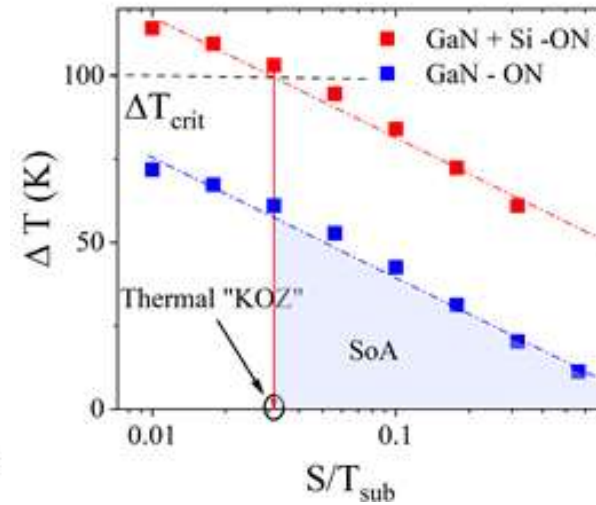
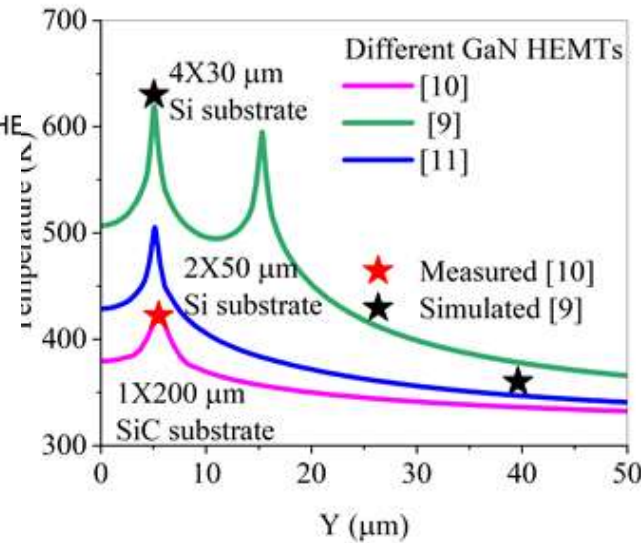
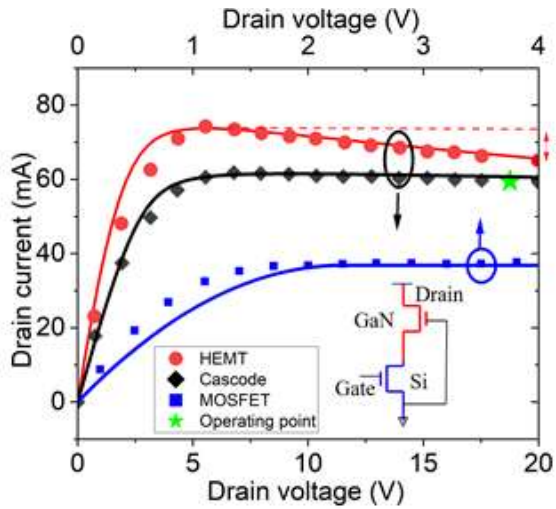
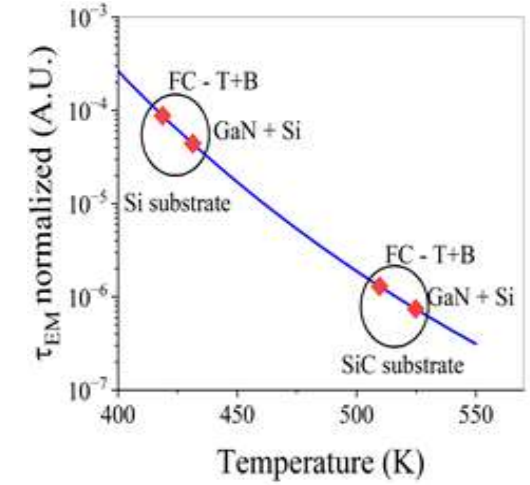
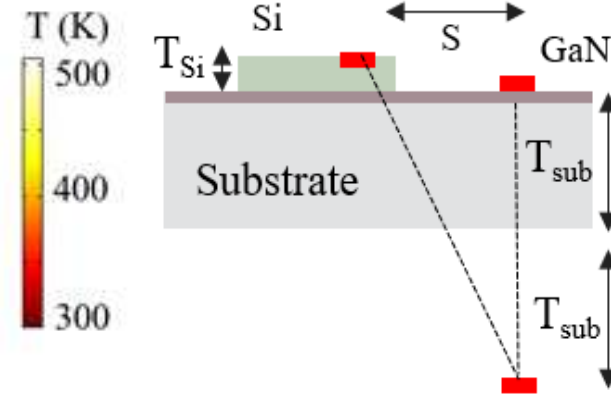
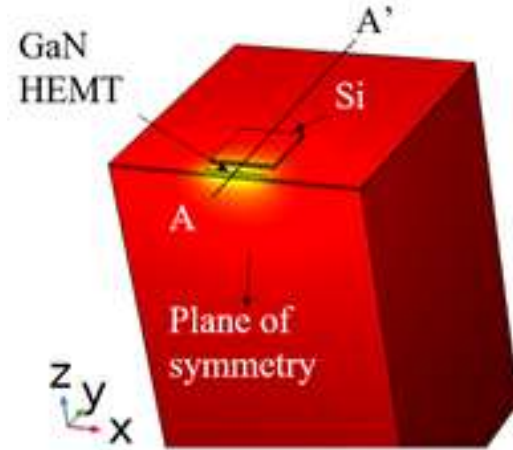
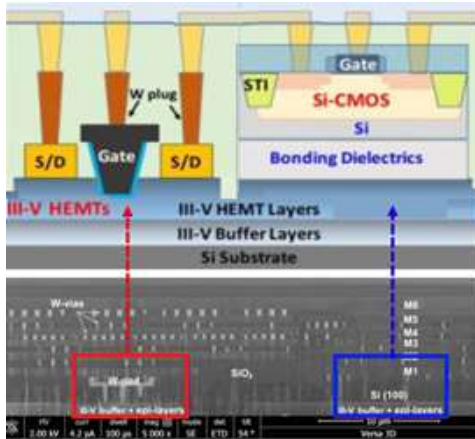


Figure 5. Multi-scale stress simulation flow.

# Thermal Crosstalk: Need of a Keep-out-Zone

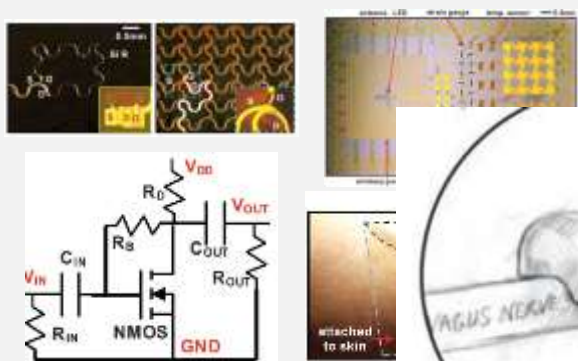
Sruthi M.P. et al, 2022.



# Outline

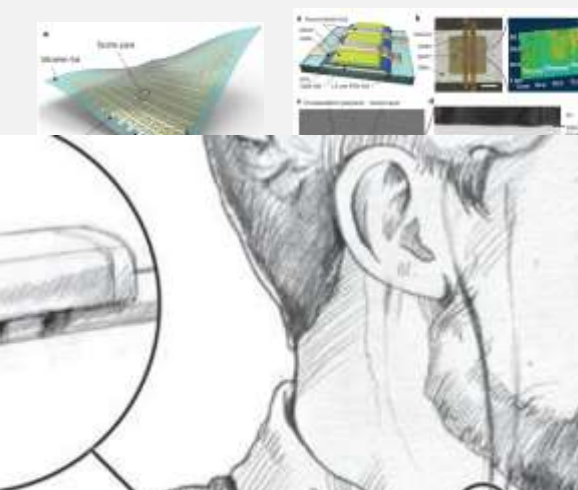
- Introduction: Moore's law is dead, long-live Moore's law
- Self-heating in logic transistors: An enduring challenge
- BEOL-integrated transistors: The next-frontier?
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- Rethinking reliability of power-transistors
- Reliability of 3D Heterogeneously integrated Systems
- Packaging in extreme-environment: Biosensors
- Summary

# Extreme packaging: Pharmaceutical vs. Electroceutical

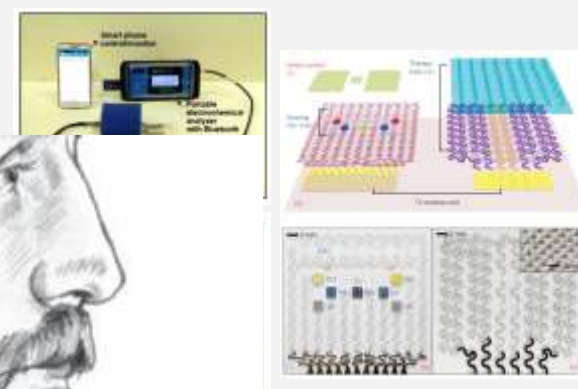


Kim et al.

The top-left panel shows two microscopic images of flexible electronics. The top-right panel shows a microscopic image of a device on a substrate. The bottom-left panel is a circuit diagram of an NMOS transistor with labels:  $V_{in}$ ,  $R_{IN}$ ,  $C_{IN}$ ,  $R_S$ ,  $R_D$ ,  $V_{DD}$ ,  $V_{OUT}$ ,  $C_{OUT}$ ,  $R_{OUT}$ , and  $GND$ . The bottom-right panel shows a microscopic image with the text "attached to skin".

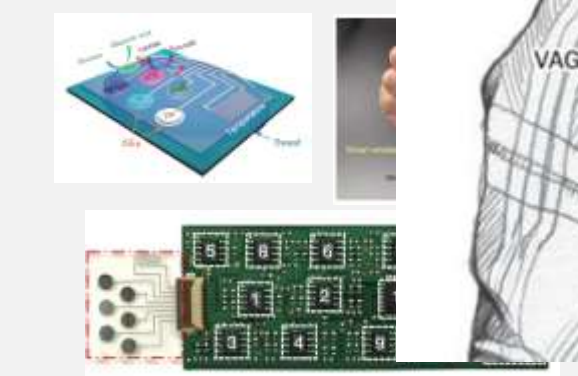


The top-left panel is a 3D schematic of a flexible device. The top-right panel shows a microscopic image of a device on a substrate. The bottom panel is a diagram of a device on a nerve, with the label "VAGUS NERVE".



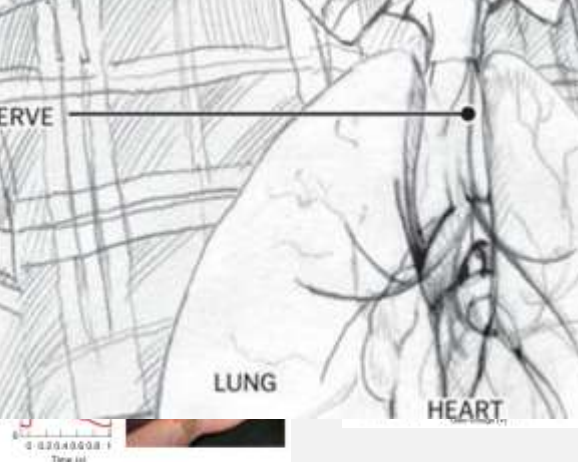
Lee et al.

The top-left panel shows a microscopic image of a device on a substrate. The top-right panel shows a schematic diagram of a device on a substrate. The bottom-left panel shows a microscopic image of a device on a substrate. The bottom-right panel shows a schematic diagram of a device on a substrate.



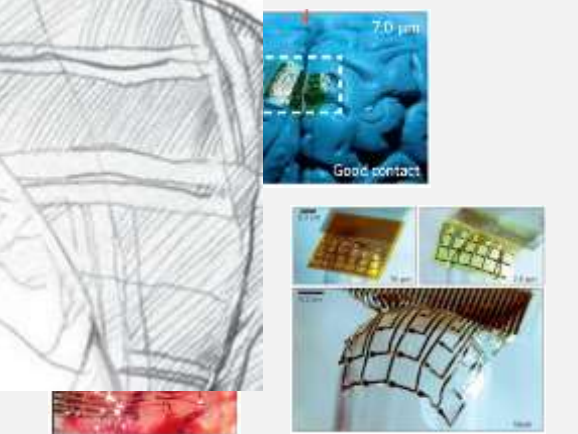
Gao et al.

The top-left panel shows a microscopic image of a device on a substrate. The bottom-left panel shows a photograph of a device on a substrate.



Schwartz et al.

The diagram shows a human torso with the vagus nerve, lung, and heart. Labels include "VAGUS NERVE", "LUNG", and "HEART".

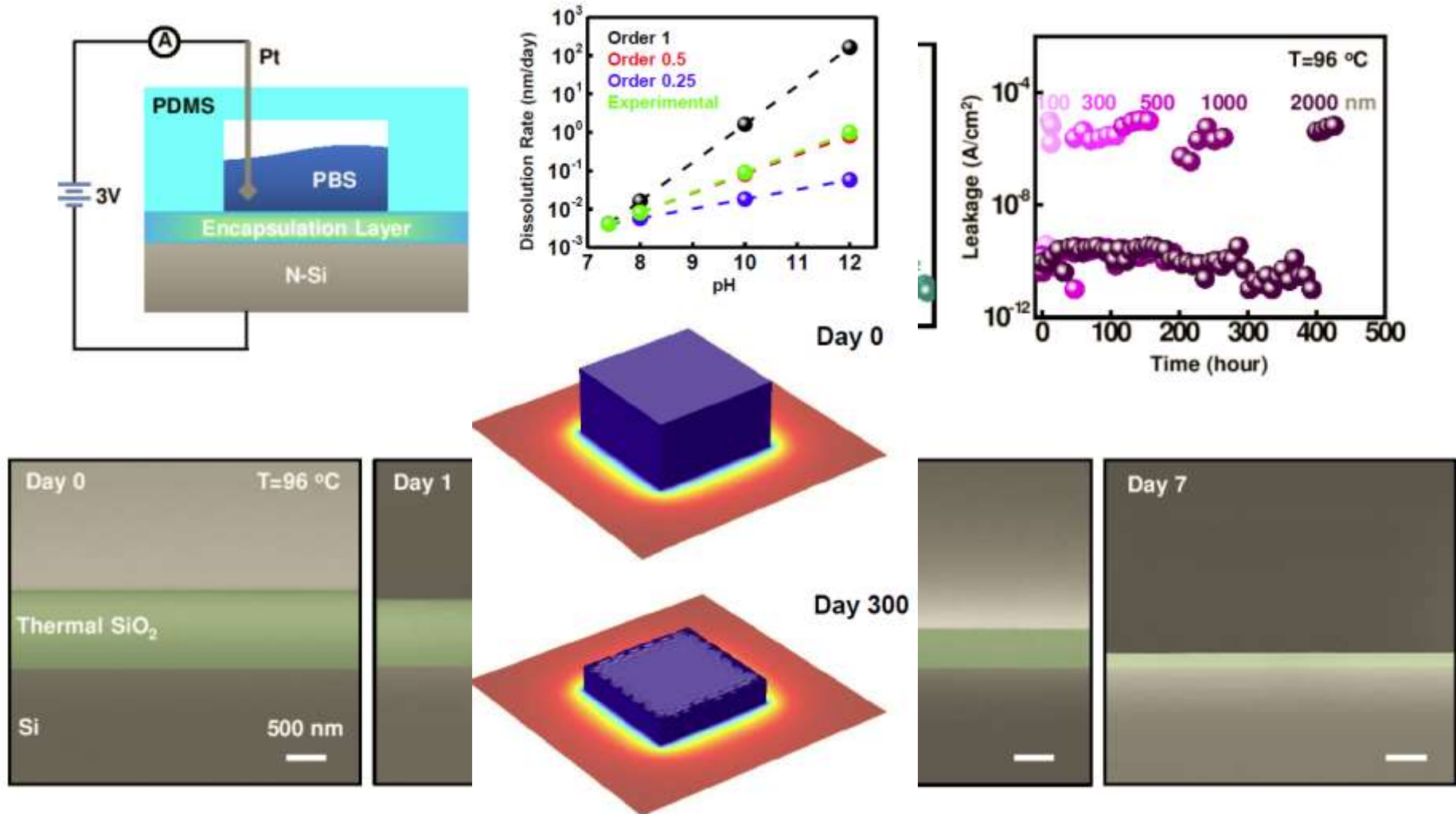


Kim et al.

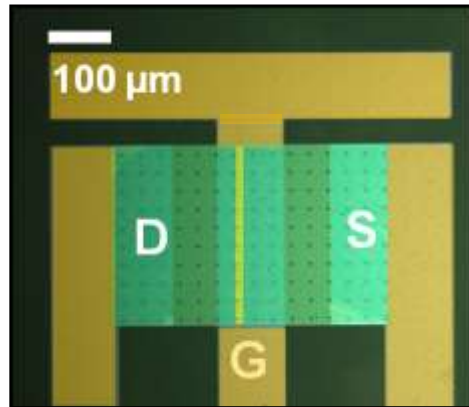
The top-left panel shows a microscopic image of a device on a substrate. The top-right panel shows a microscopic image of a device on a substrate. The bottom-left panel shows a photograph of a device on a substrate. The bottom-right panel shows a photograph of a device on a substrate.



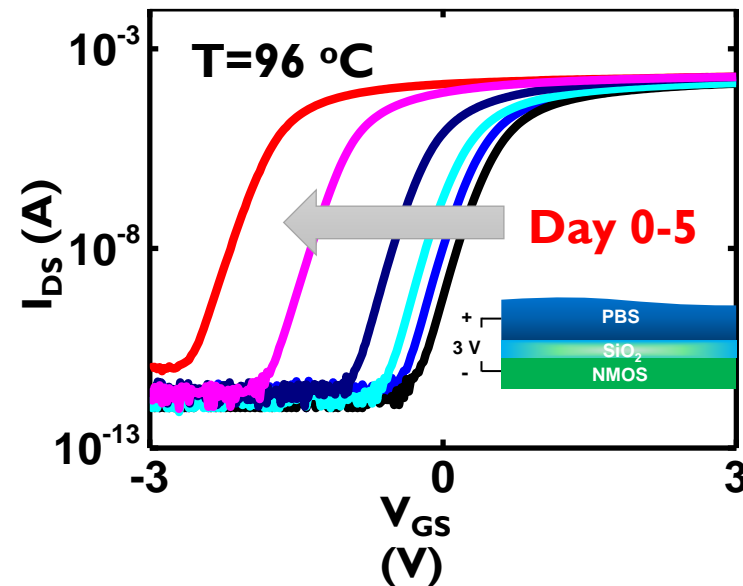
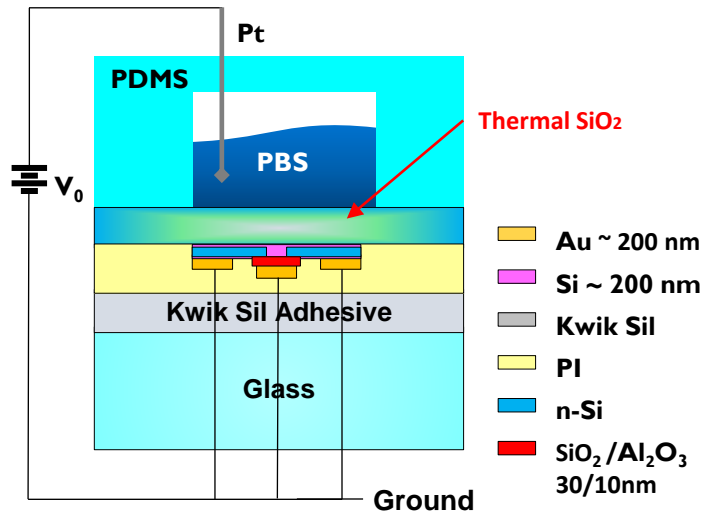
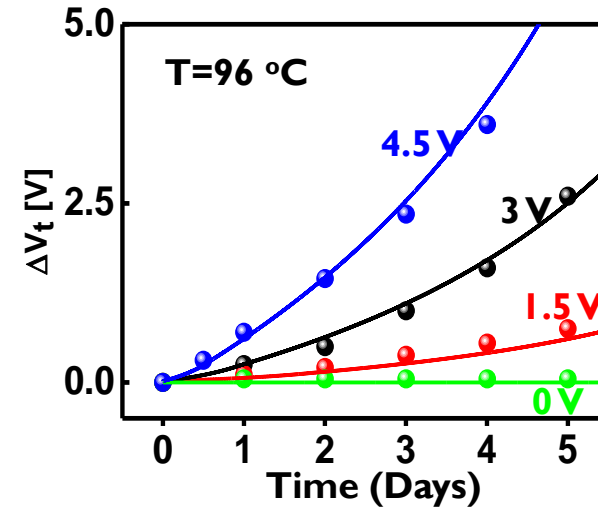
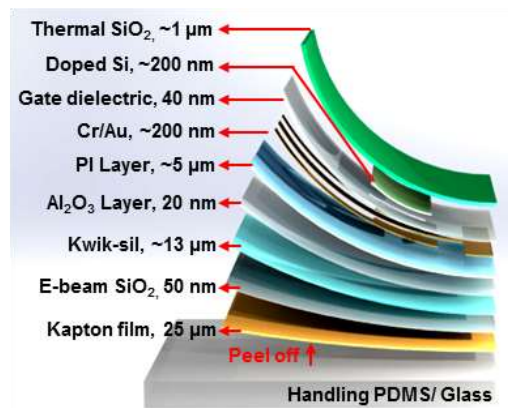
# Extreme Packaging: Oxide dissolution in DI water



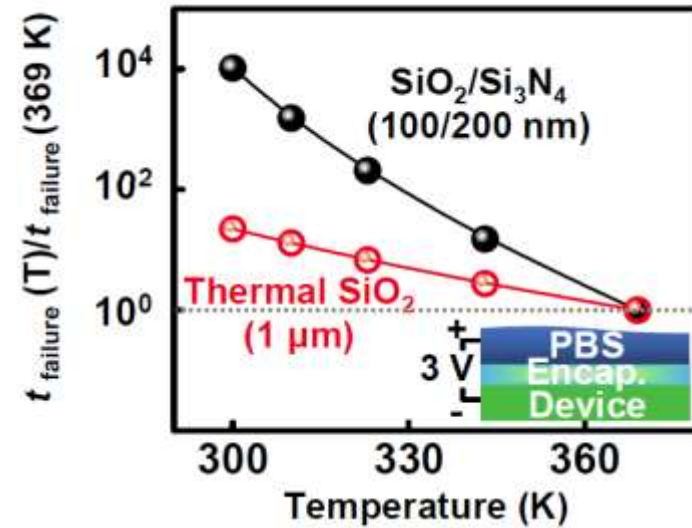
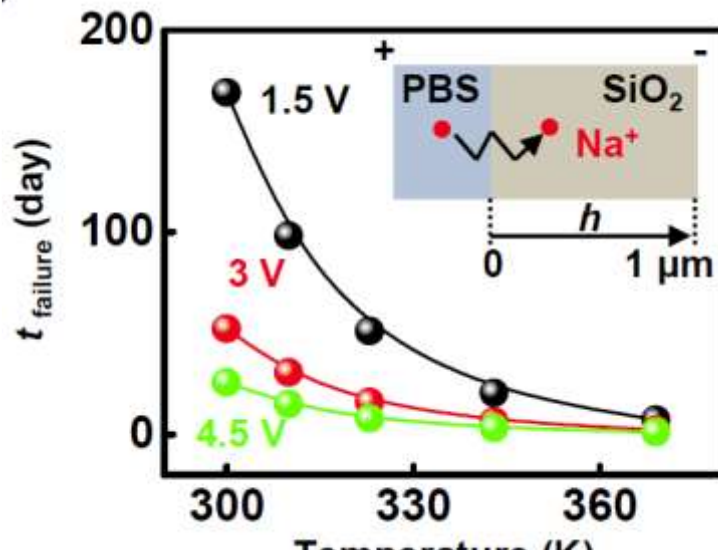
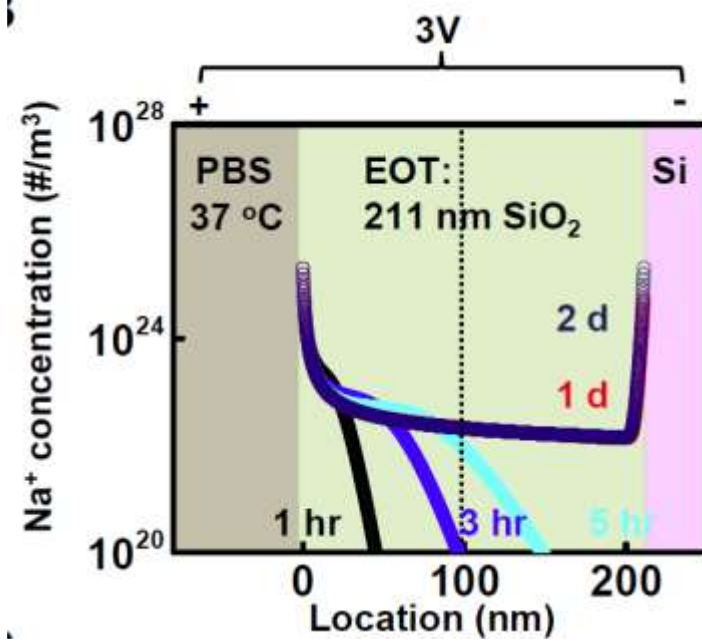
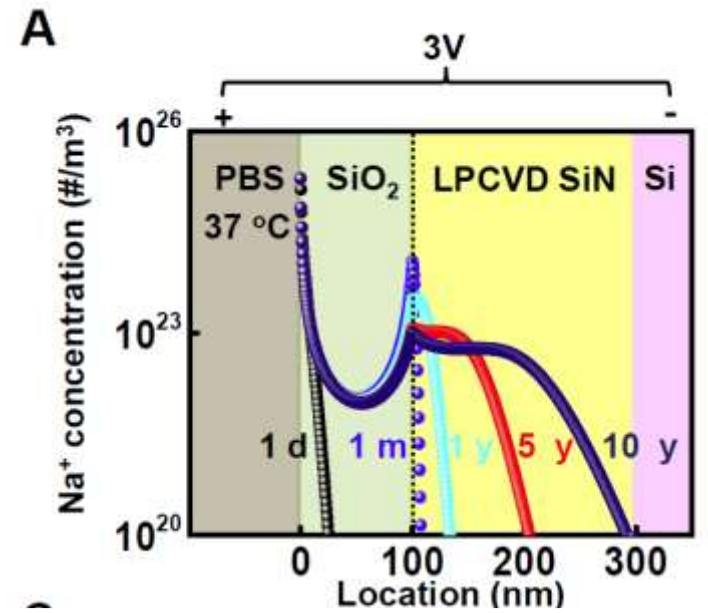
# Extreme Packaging: Ion diffusion in encapsulants



Xin Jin, TED, PNAS, 2016



# Extreme Packaging and stacked encapsulant



# Conclusions: Take-home points

- Moore's law is dead, long-live Moore's law
  - Moore's law will live through 3D integration. Thermal bottleneck is a concern.
- Self-heating in logic transistors: An enduring challenge
  - Serious challenge in application-specific design in a broad range of applications
- BEOL-integrated transistors: The next-frontier?
  - Performance is significant, but reliability could be a concern.
- The brave-new world of FeFET and NCFET
  - Most important reliability issues are classical. New degradation pathways exist.
- Rethinking reliability of power-transistors
  - Self-heating and reliability are first order concerns.
- Reliability of 3D Heterogeneously integrated Systems
  - Many new modes of degradation, especially in harsh environments. Front-end reliability physics can be selectively used for reliability issues involving chip-package interaction.
- New characterization techniques and modeling tools are essential.

