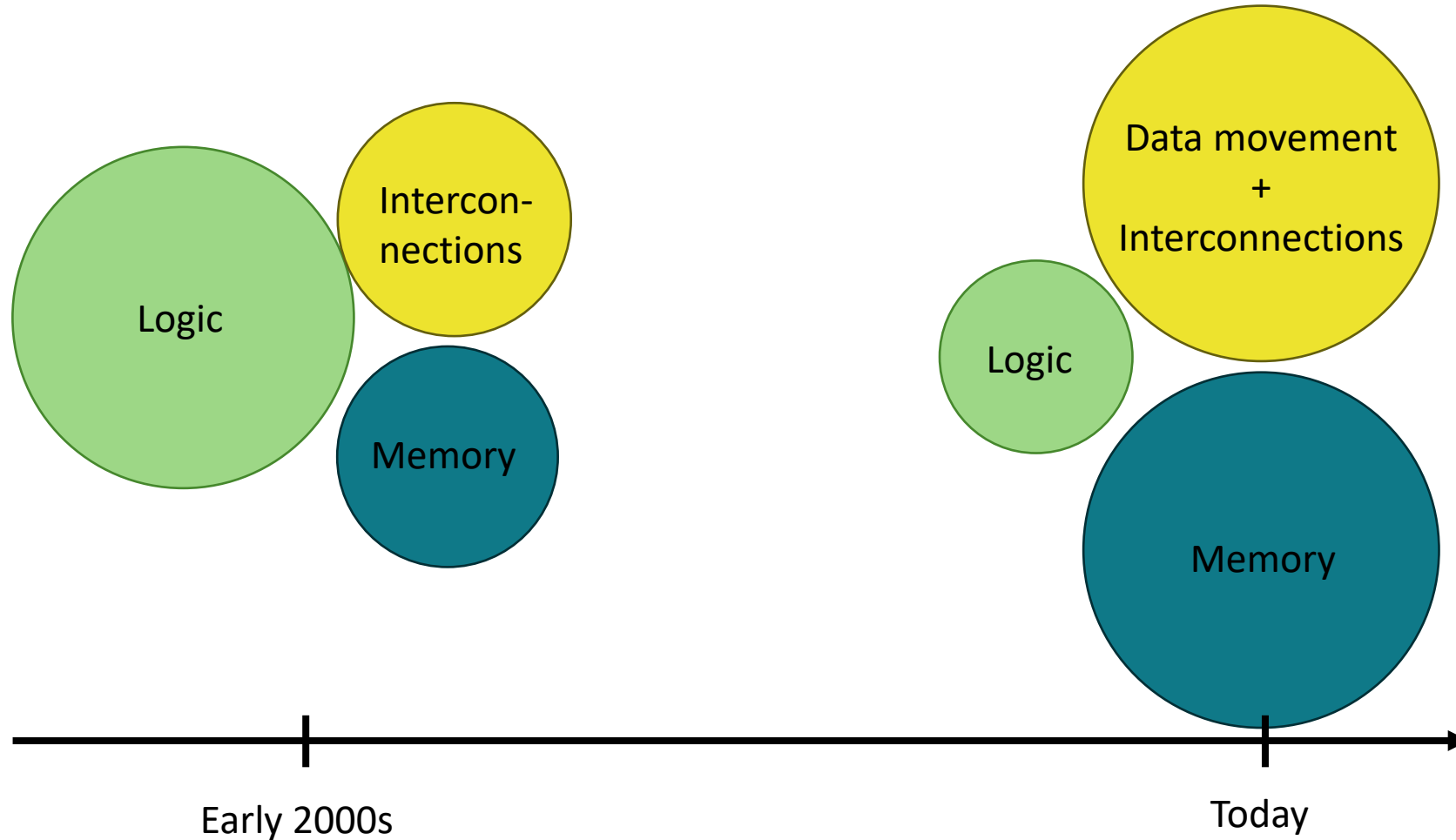


Modeling and simulation of ferroelectric materials for neuromorphic computing

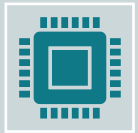
IUNET - UDINE



- **Computing today** is mainly driven by **data** and **unconventional applications: AI and Machine Learning**
- **New architectures and paradigms** inspired by brain functionalities: **Neuromorphic computing**

Evolution of the computing cornerstones, from IEEE ESSDERC 2022

- Diffusion of computing systems based on **neural networks** and **artificial intelligence** → very **energy intensive**



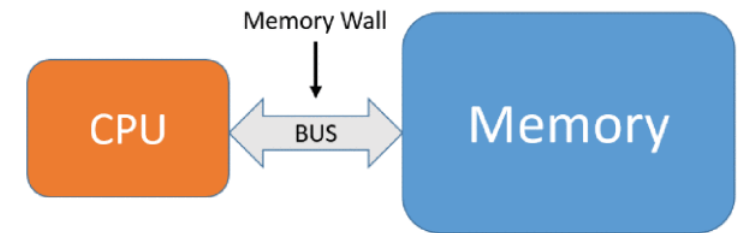
new computing paradigms

In-Memory Computing to overcome **CPU** $\leftrightarrow$ **memory** data transfer

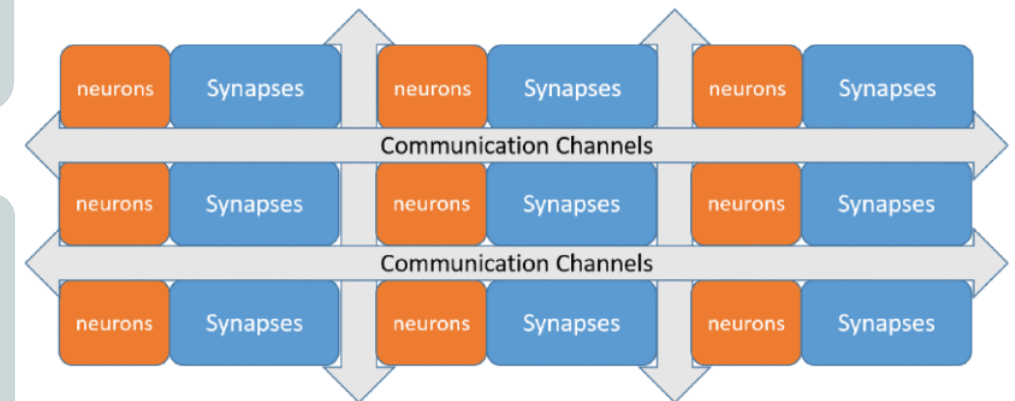


dedicated hardware

Memristors:
programmable resistors



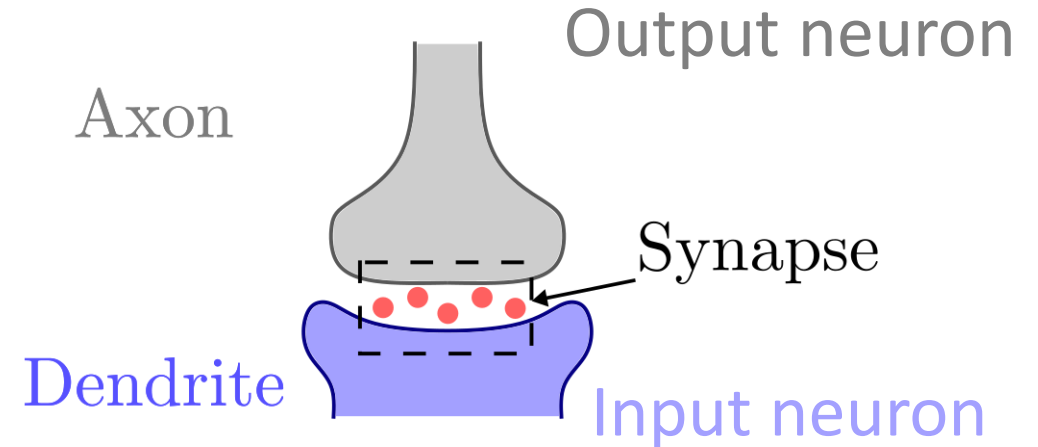
(a) von-Neumann architecture



(b) Neuro-inspired Architecture

[S. Yu, Proc. IEEE 2018]

- **Biological neural networks:** interconnections between **neurons** thanks to **synapses**
- **Synapses** weigh the **electrical signals** transmitted and received by **neurons**
- How can we create an **artificial synapse**? → **Memristors**
- **Memristors:** passive devices, can be switched from a **high resistive state** (HRS) to a **low resistive state** (LRS) in a **non-volatile** manner
- Types of memristors: Phase-Change Memories, Resistive-RAM, **Ferroelectric-based devices**



	PCM	RRAM	FTJ	FeFET
Area	4-50 F ²	4-50 F ²	1-10 F ²	6-50 F ²
Retention	10 y	10 y	10 y	1 y
Endurance	10 ⁶ -10 ⁹	10 ³ -10 ⁹	10 ⁷	10 ⁶ -10 ⁹
Switching Energy	~ 10 pJ	~ pJ	10 fJ	~ fJ

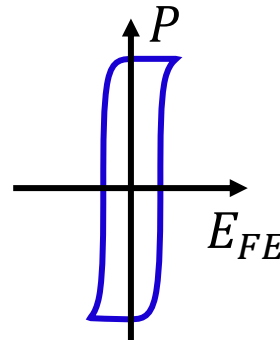
Data from [Chen et al., Advanced Electronic Materials 2022](#) and [Semiconductor Memory Devices and Circuits](#) by Shimeng Yu

- Ferroelectric materials
- Ferroelectric Tunnel Junctions (FTJs)
 - Large signal operation
 - Small signal operation
- Ferroelectric Field Effect Transistors (FeFETs)
- Conclusions

- **Ferroelectric materials** exhibit **hysteresis** in their **Polarization-Electric field** characteristic
- Notable features: **Coercive field** E_C , **remnant polarization** P_r , **depolarization field** E_{dep} , **multi-domain** nature

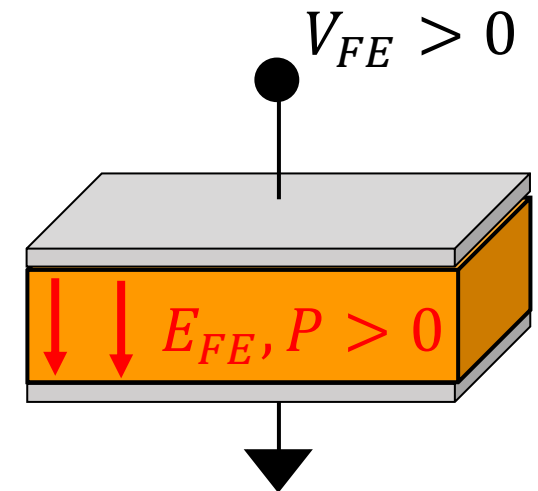
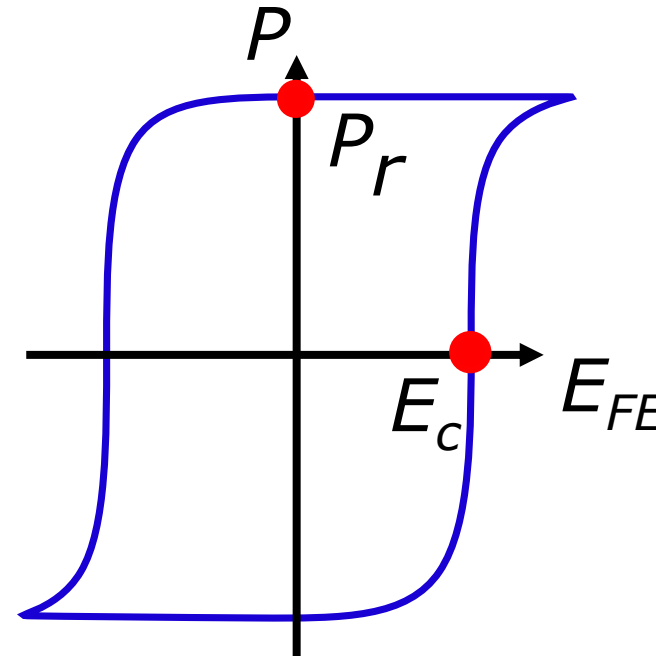
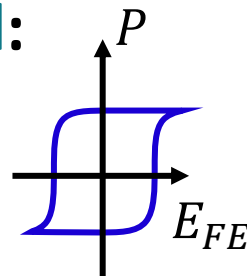
- **Perovskites:**

- high P_r
- **low** E_C



- **Hafnium-based:**

- lower P_r
- **higher** E_C



The total ferroelectric polarization is written as a **spontaneous** or **critical polarization** P_S plus a polarization induced proportional to the electric field [1-4]:

$$P_T = P_S + \varepsilon_0(\varepsilon_{FE} - 1)E_{FE}$$

ε_{FE} is the so-called background polarization

The thermodynamic potential related to a **uniform free standing ferroelectric** is written according to the Landau theory of second-order phase transition

$$f(P_S) = \alpha P_S^2 + \beta P_S^4 + \gamma P_S^6 - EP_S \text{ [J/m}^3\text{]} \quad (\text{we assume polarization only along one direction})$$

The order parameter refers to the critical part of the polarization: P_S

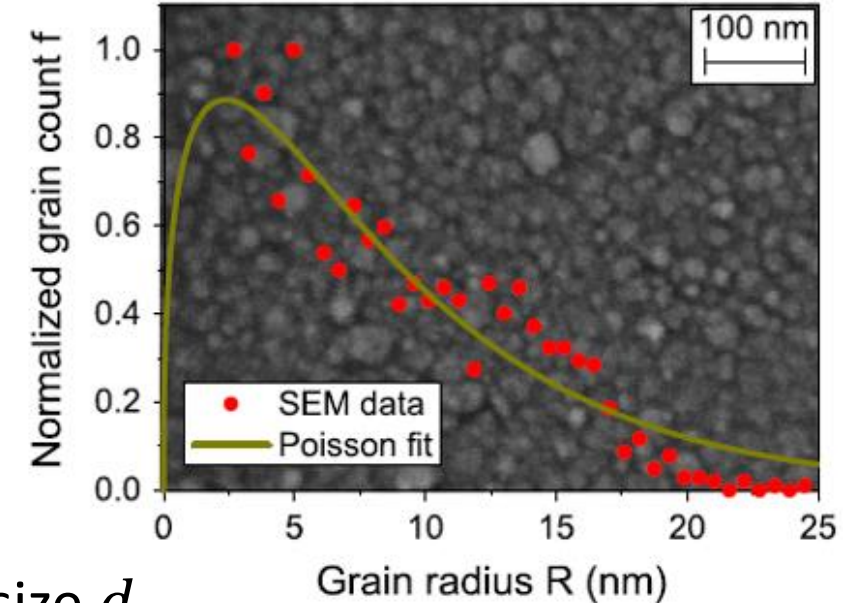
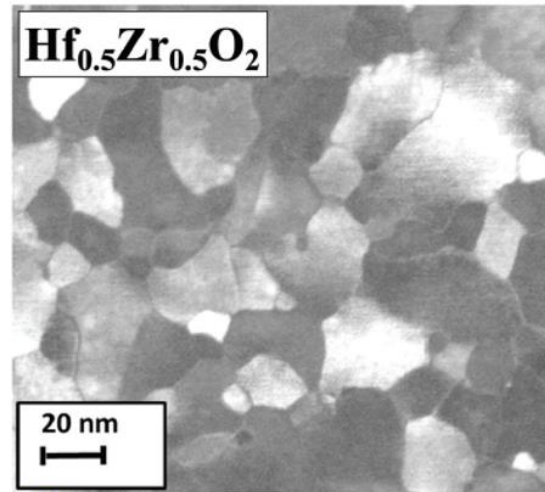
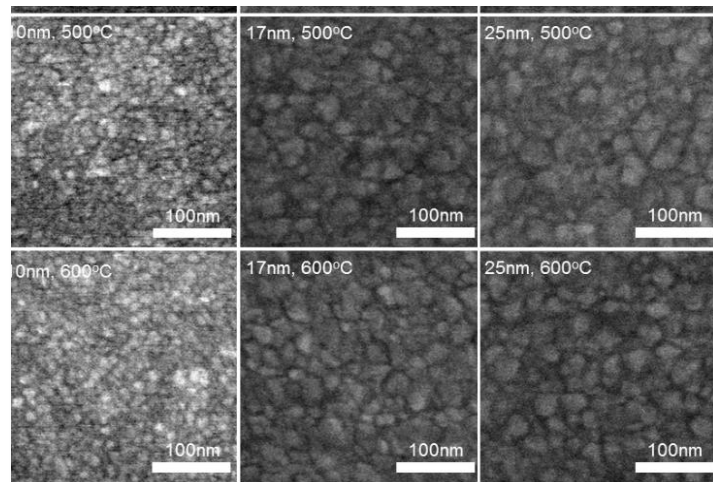
[1] A. K. Tagantsev, *Ferroelectrics* 375, 19, (2008); [2] C.H. Woo and Y. Zheng, *Appl. Phys. A* 91, 59–63 (2008); [3] T. Rollo *et al.*, *Nanoscale* 12, 2020, (10), 6121-6129; [4] J. Bizindavyi et al., *Commun Phys* 4, 86 (2021).

MULTIPLE DOMAINS (1/2)

FIXIT

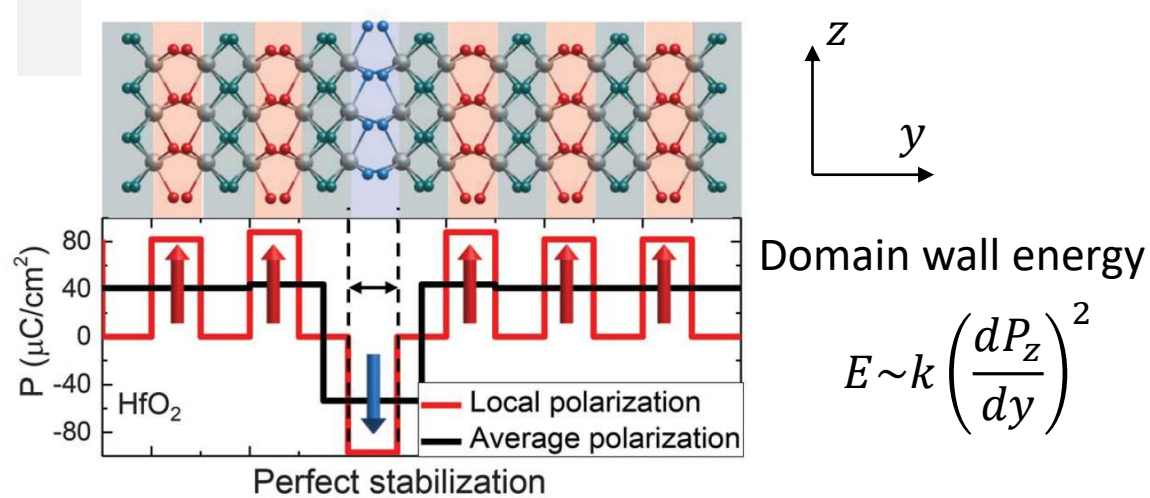
HfO₂ based ferroelectrics are **polycrystalline** → there are **grains**

A uniform polarization is expected inside each grain → ferroelectric **domains**



- In our models we introduce built-in grains having fixed size d

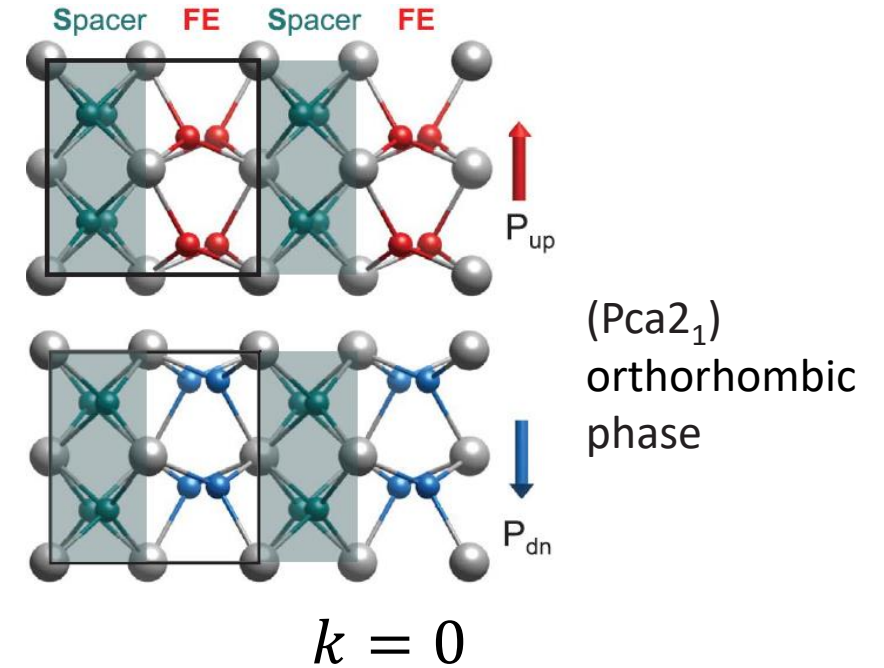
DOMAIN WALL COUPLING CONSTANT k (1/2) FIXIT



- orthorhombic ferroelectric structure of HfO_2 : periodic stacking of alternate 2-dimensional spacer and ferroelectric layers [1]
- HfO_2 has polar transverse optical phonons with flat bands [1]

phonon dispersion relation $\omega(q) = \omega(0) + k_0 q^2$

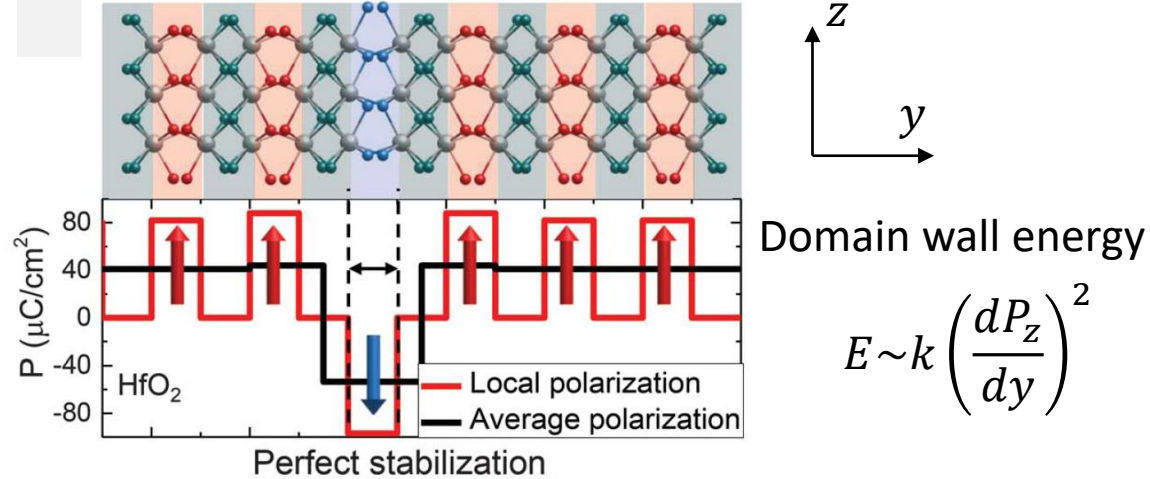
where $k_0 = 0$ and k_0 is related to k



No energy penalty in the formation of oppositely polarized domains (180°) with domain walls of vanishing thickness

[1] H.-J. Lee et al., *Science*, vol. 369, no. 6509, p. 1343–1347, 2020

DOMAIN WALL COUPLING CONSTANT k (2/2) FIXIT

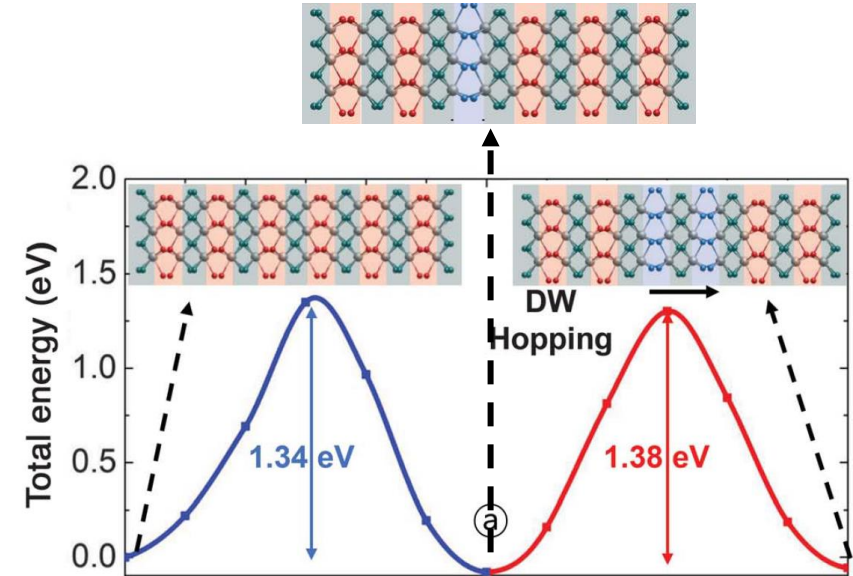


- orthorhombic ferroelectric structure of HfO_2 : periodic stacking of alternate 2-dimensional spacer and ferroelectric layers [1]
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[1] H.-J. Lee et al., *Science*, vol. 369, no. 6509, p. 1343–1347, 2020

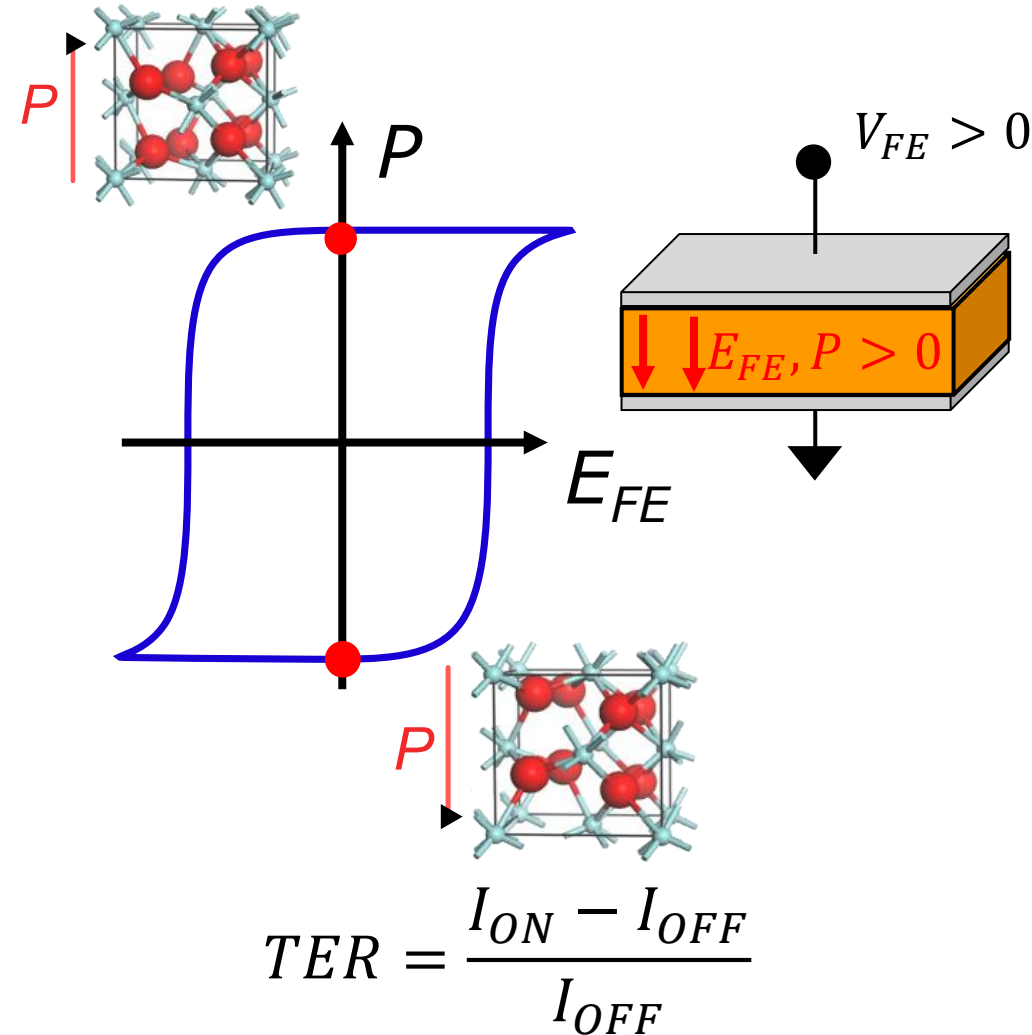


weakly interacting domain walls + zero group velocity of the relevant polar modes ($g \sim 0$, by the flat bands of HfO_2)

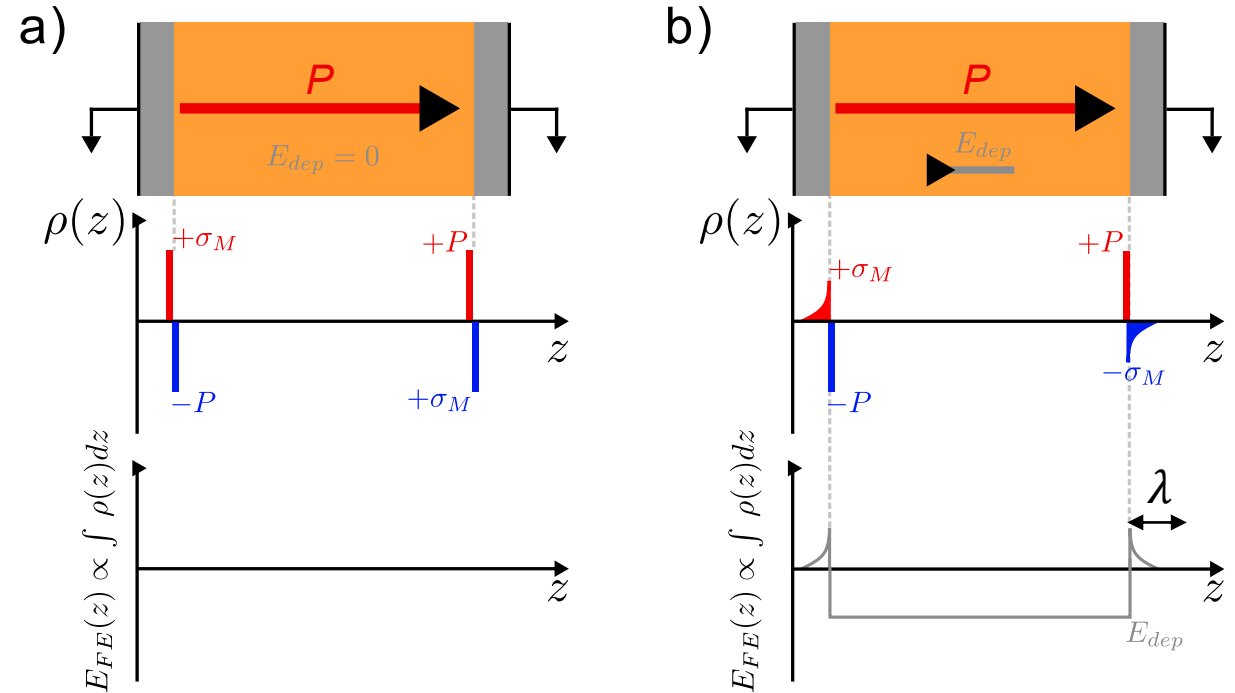
$\rightarrow$ domain walls do not propagate efficiently and can move only by hopping over a large energy barrier

- ✓ Ferroelectric materials
- **Ferroelectric Tunnel Junctions (FTJs)**
 - Large signal operation
 - Small signal operation
- Ferroelectric Field Effect Transistors (FeFETs)
- Conclusions

- Exploit the **spontaneous polarization** state to **modulate** the **tunneling barrier** of the device
- **Write voltage** large enough to **ensure polarization switching** (typically 1-1.2 MV/cm for hafnium-based ferroelectrics)
- Trade-off for **read voltage**: small enough to **preserve polarization state** (no read disturb), large enough to **sense the tunneling current**
- Design metrics: **Tunneling-Electro Resistance (TER)** and **absolute current values**



- **First FTJ device concept, proposed by Leo Esaki** [Esaki *et al.*, IBM Tech. Discl. Bull, 1971]
- Spontaneous polarization produces a **depolarization field**
- In vacuum $\rightarrow E_{dep} = -\frac{\vec{P}}{\epsilon_0 \epsilon_{FE}}$
- In an **MFM stack** it depends on the metal **screening length**



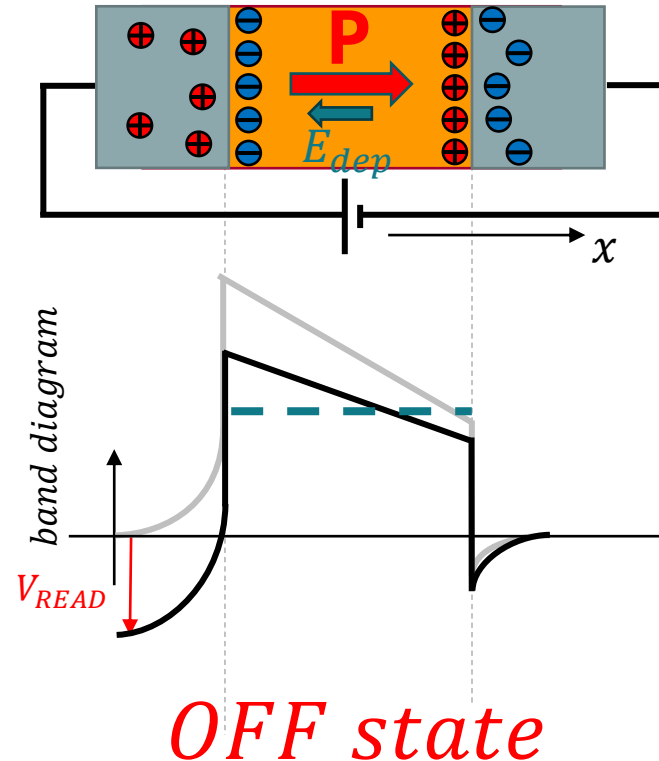
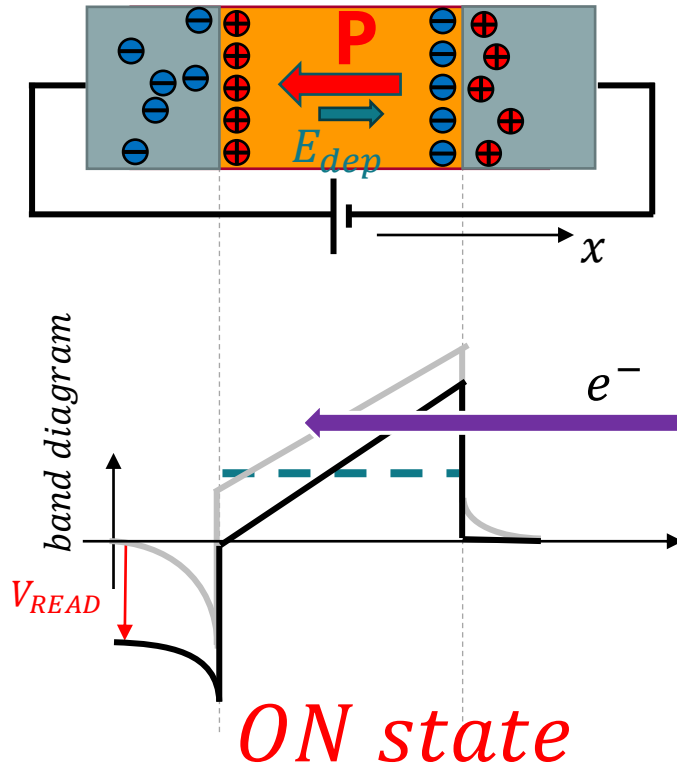
Screening length [1] $\lambda = \frac{h}{q} \sqrt{\frac{\epsilon_0 \epsilon_M}{3m_0}} \cdot \left(\frac{3}{8\pi}\right)^{1/3} \cdot \left(\frac{1}{n_0}\right)^{1/6}$

ϵ_M : relative permittivity of the metal

m_0 : electron effective mass

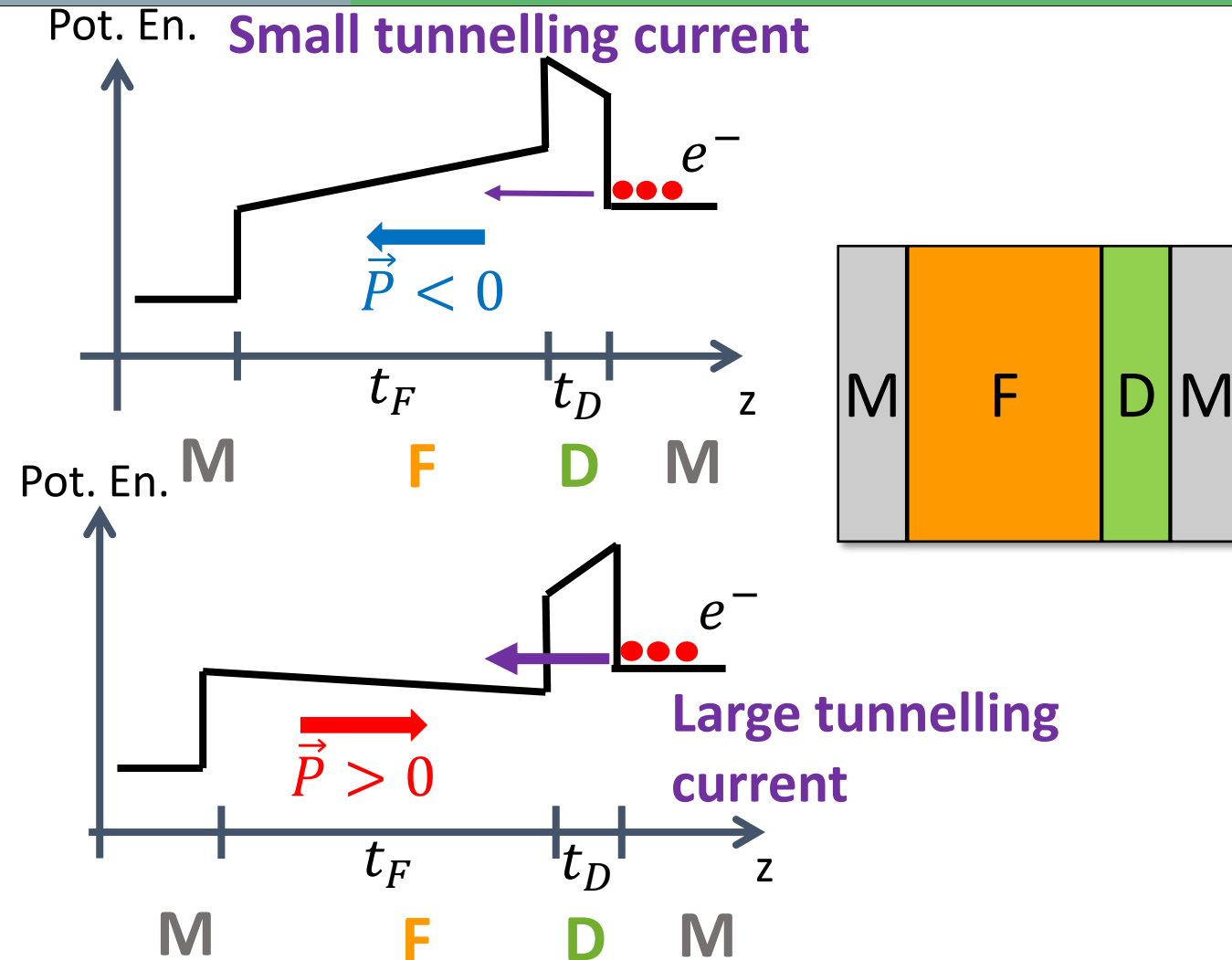
n_0 : equilibrium metal electron density

[1] [Mehta *et al.*, JAP, vol. 44, n. 8, pp. 3379–3385, 1973.](#)



- Different effective heights of the tunneling barriers.
- Need for very thin FE layers (<5nm) to allow for large enough current densities.

- **Different polarization** states $\Rightarrow$ **different** band bending and **tunnelling current** $\Rightarrow$ can operate as **memristors**
- **Tunneling** barrier **decoupled** from the ferroelectric **switching** layer
- **Band profile** at the **FE-DE** **interface** depends on **polarization** plus possible **trapping**



The tunnelling read current, I_R , is estimated as the sum of the $I_{R,i}$ in each domain resulting from a Landauer model

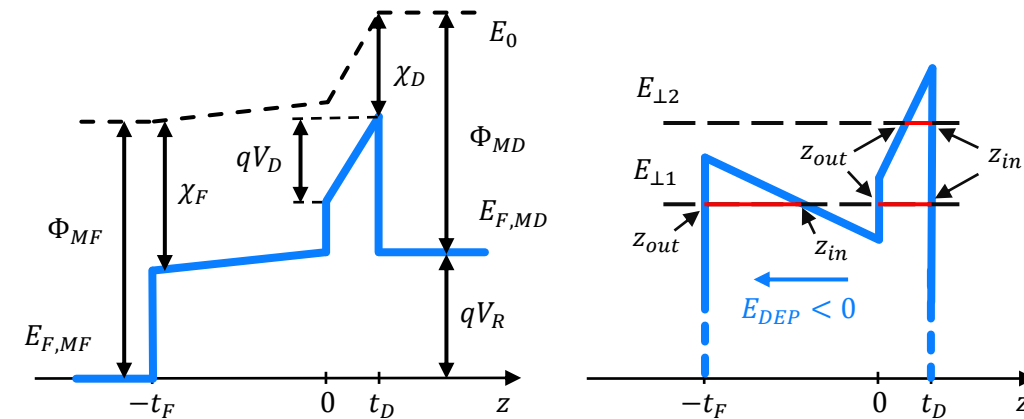
$$I_{R,i} = \frac{q}{\pi \hbar} \int_{-\infty}^{+\infty} \sum_{k_x, k_y} T_i(E_{\perp}) [f_{0,MD}(E_{\perp} + \epsilon(k)) - f_{0,MF}(E_{\perp} + \epsilon(k))] dE_{\perp}$$

$$= \frac{A K_B T m_{\parallel} q}{2\pi^2 \hbar^3} \int_{-\infty}^{+\infty} T_i(E_{\perp}) \{ F_0(E, E_{fMD}) - F_0(E, E_{fMF}) \} dE_{\perp}$$

$$F_0(E, E_f) = \ln \left[1 + \exp \left(\frac{E_f - E}{K_B T} \right) \right]$$

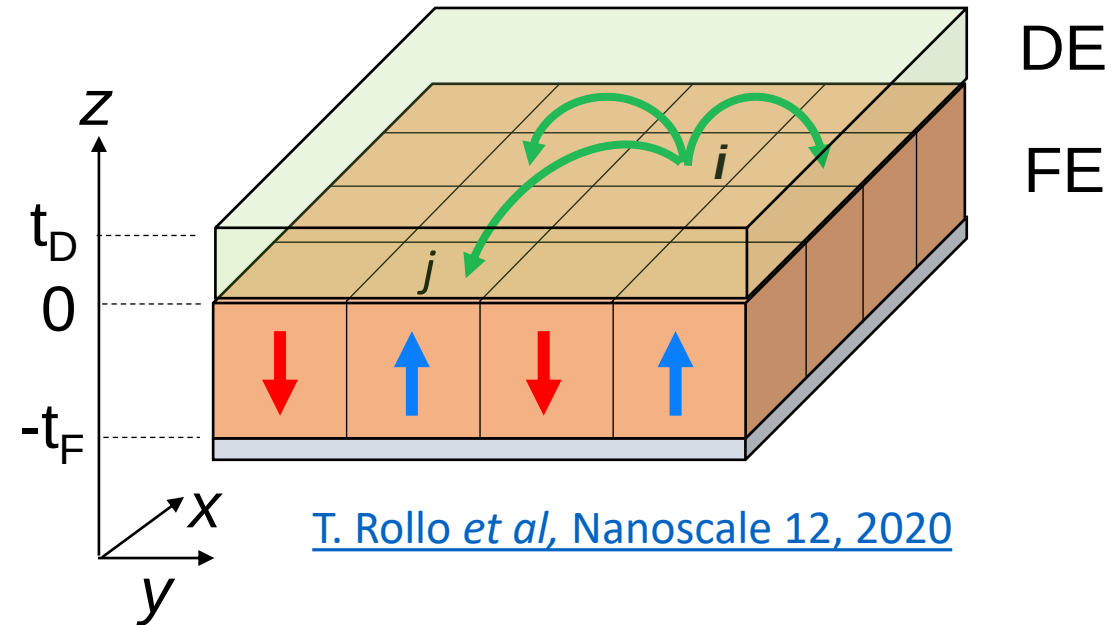
[R. Fontanini et al. , IEEE EDTM, 2021](#)

The transmission coefficient $T_i(E_{\perp})$ is calculated accordingly with the WKB approximation



$$T_i(E_{\perp}) = \exp \left[-2 \int_{z_{in}(E_{\perp})}^{z_{out}(E_{\perp})} \sqrt{\frac{2m_0}{\hbar^2} (E_{C,i}(z) - E_{\perp})} dz \right]$$

- The presence of the **dielectric layer** introduces:
 - **Imperfect screening** of polarization → **depolarization field**
 - **Electrostatic coupling** between **ferroelectric domains**
- **3D description** of the stack **necessary** due to the **multidomain** nature of the **ferroelectric**
- **Coupling** between ferroelectric domains **expressed** in terms of **capacitances**



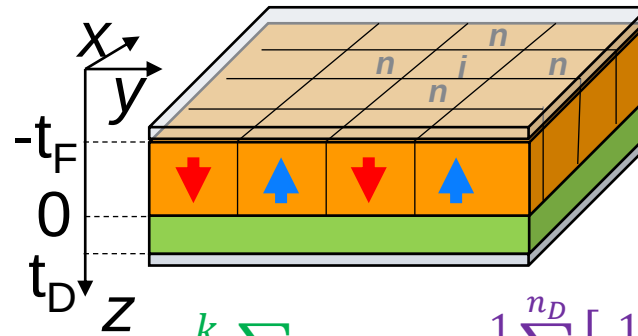
$$C_{i,j} = \left(\frac{1}{d^2} \int_{D_i} G_{D,j}(\vec{r}) d\vec{r} \right)^{-1}$$

$C_{i,j}$: capacitance between i-th and j-th domain
 $G_{D,j}(\vec{r})$: Green's function relative to j-th domain

SIMULATION MODEL BASED ON LGD THEORY FIXIT

- Our **in-house developed** simulator solves both **ferroelectric dynamics** (dP_i/dt) and **trap occupation** (df_T/dt) equations
- Ferroelectric dynamics based on **Landau-Ginzburg-Devonshire (LGD)** theory and **Landau-Khalatnikov (LK)** model
- **General** model and theory applicable to **different** device **stacks** and **materials**
- **Interface traps** have **utmost importance** in the **depolarization term**

Landau-Khalatnikov



[T. Rollo et al, Nanoscale 12, 2020](#)

$$t_F \rho \frac{dP_i}{dt} = - (2\alpha P_i + 4\beta P_i^3 + 6\gamma P_i^5) t_F - 2t_F \frac{k}{d^2} \sum_n (P_i - P_n) - \frac{1}{2} \sum_{j=1}^{n_D} \left[\frac{1}{C_{i,j}} + \frac{1}{C_{j,i}} \right] (P_j + Q_{T,j}) + \frac{C_D}{C_0} V_T$$

LGD theory term

Ferroelectric free
energy term

Domain coupling term

Depolarization +
Electrostatic term

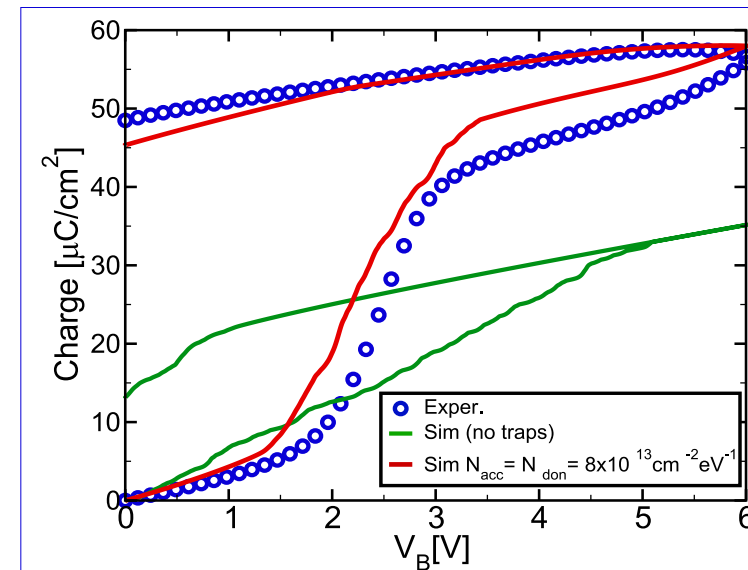
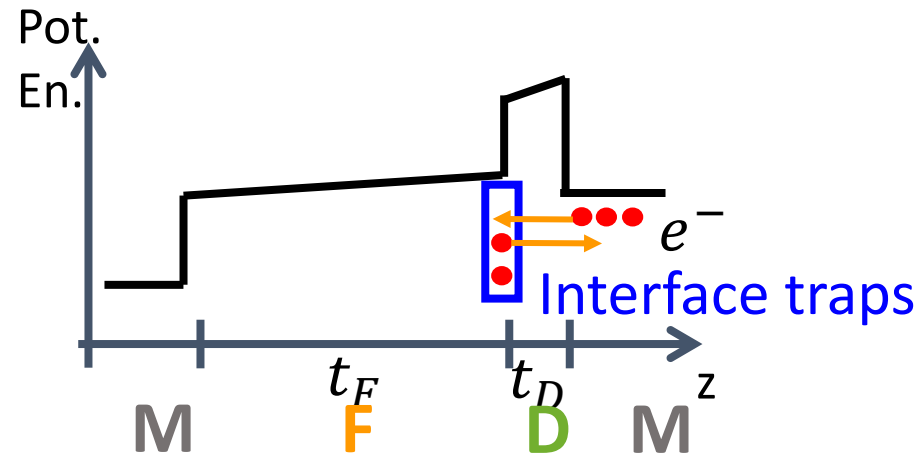
Interface traps

- ✓ Ferroelectric materials
- Ferroelectric Tunnel Junctions (FTJs)
 - Large signal operation
 - Small signal operation
- Ferroelectric Field Effect Transistors (FeFETs)
- Conclusions

WHY DO WE NEED TRAPS?

FIXIT

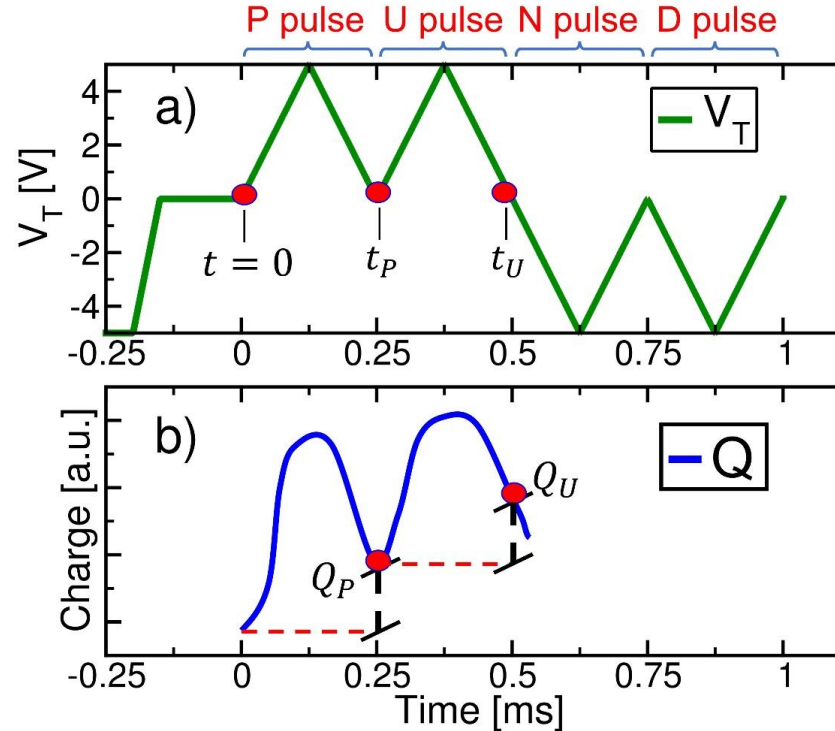
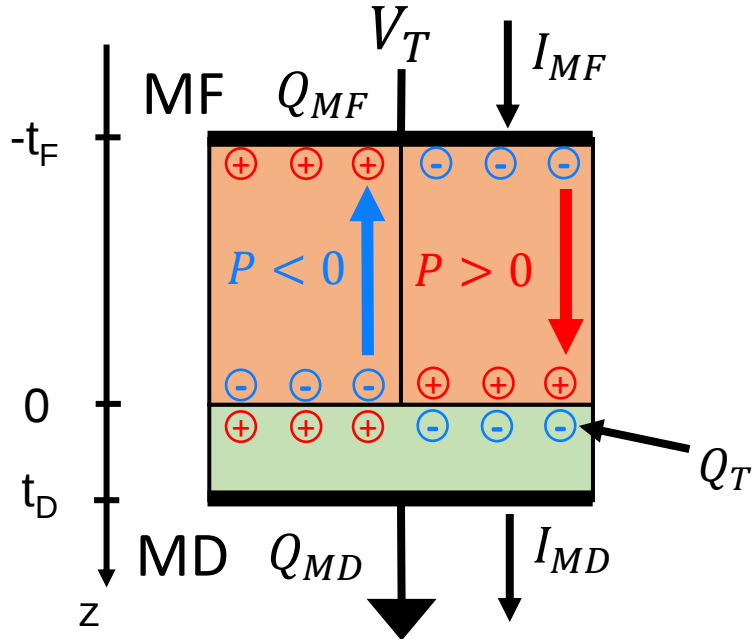
- **Traps:** available **states in the energy gap** of a material
- **Necessary** to explain experimental behaviour of **FTJs**
- **Influence several aspects** of operation and **design** of **FTJs**
 - **Large signal** regime
 - **Read current**



R. Fontanini *et al.*,
ESSDERC 2021

PUND AND DEPOLARIZATION (1)

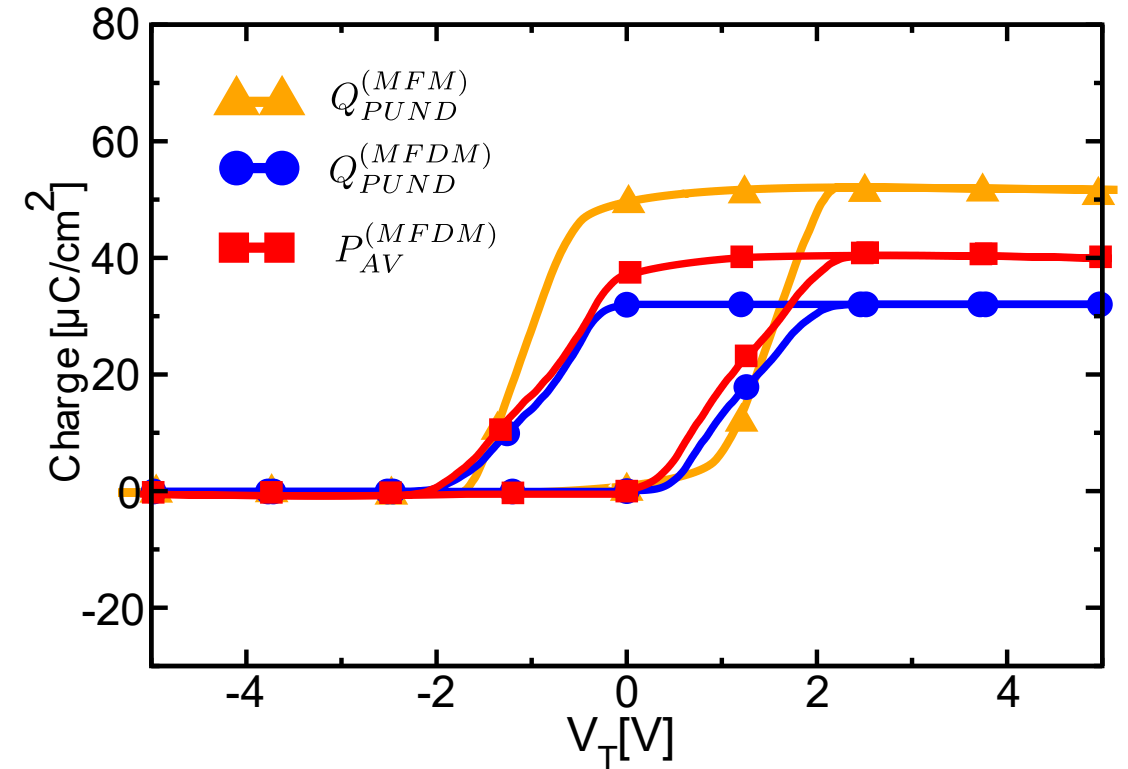
FIXIT



- P_{AV} : average spontaneous polarization (**simulated quantity**)
- $E_{DP,AV}$: **depolarization field** related to polarization screening by **interfacial charge Q_T**

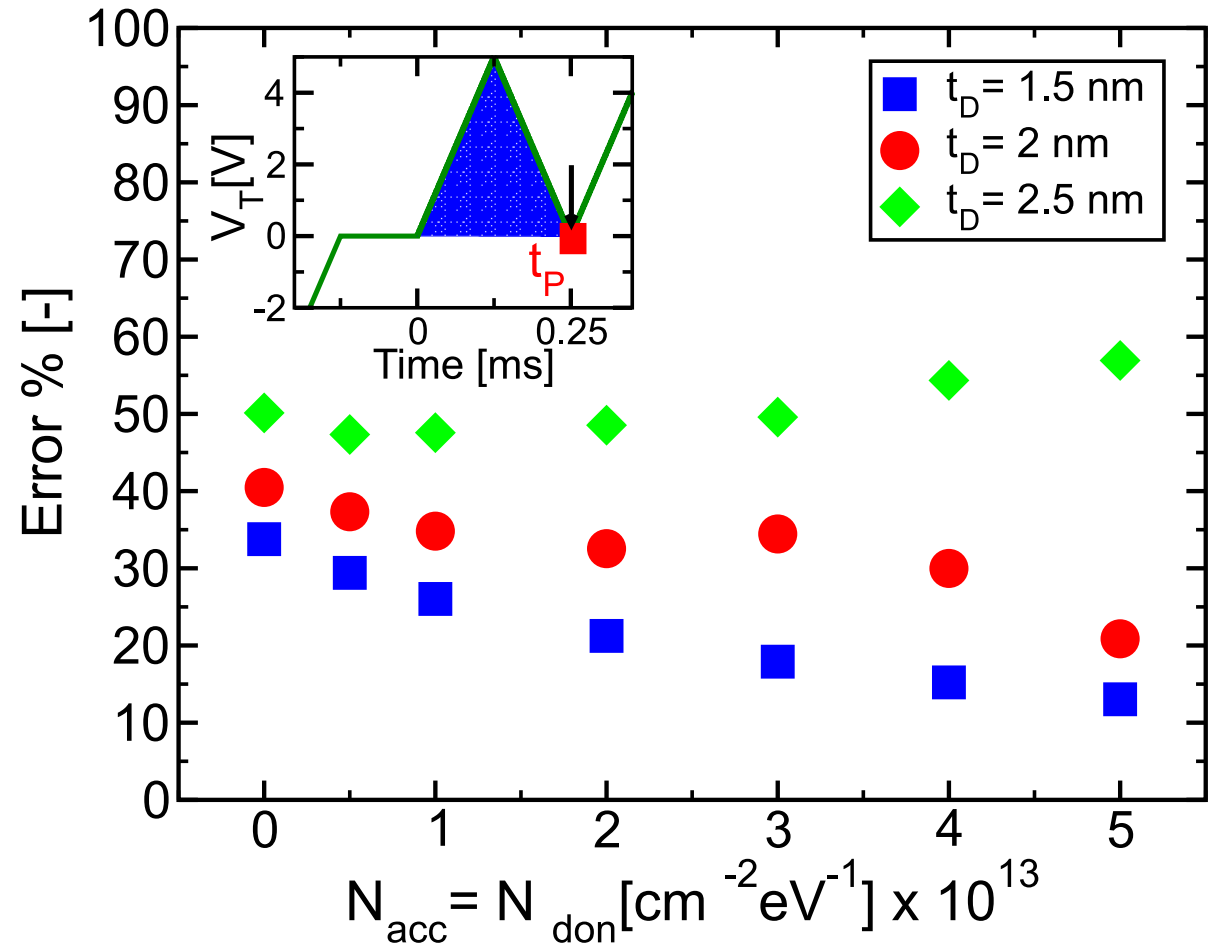
- $Q_P(t) = \int_0^{t_P} I_{MF}(t') dt'$
- $Q_U(t) = \int_{t_P}^{t_P+t} I_{MF}(t') dt'$
- $Q_{PU} = Q_P - Q_U = P_{AV}^{(P)} - P_{AV}^{(U)} + \epsilon_0 \epsilon_F (E_{DP,AV}^{(P)} - E_{DP,AV}^{(U)}) + [Q_{QT,MF}^{(P)} - Q_{QT,MF}^{(U)}] + [Q_{lkg}^{(P)} - Q_{lkg}^{(U)}]$

- In an **MFM stack**: negligible depolarization, no trapping, similar leakage during **P** and **U** pulses $\rightarrow Q_{PU} \approx P_{AV}^{(P)} - P_{AV}^{(U)} \approx 2P_r$
- **Not true in general!** Particularly not in **MFDM stacks**



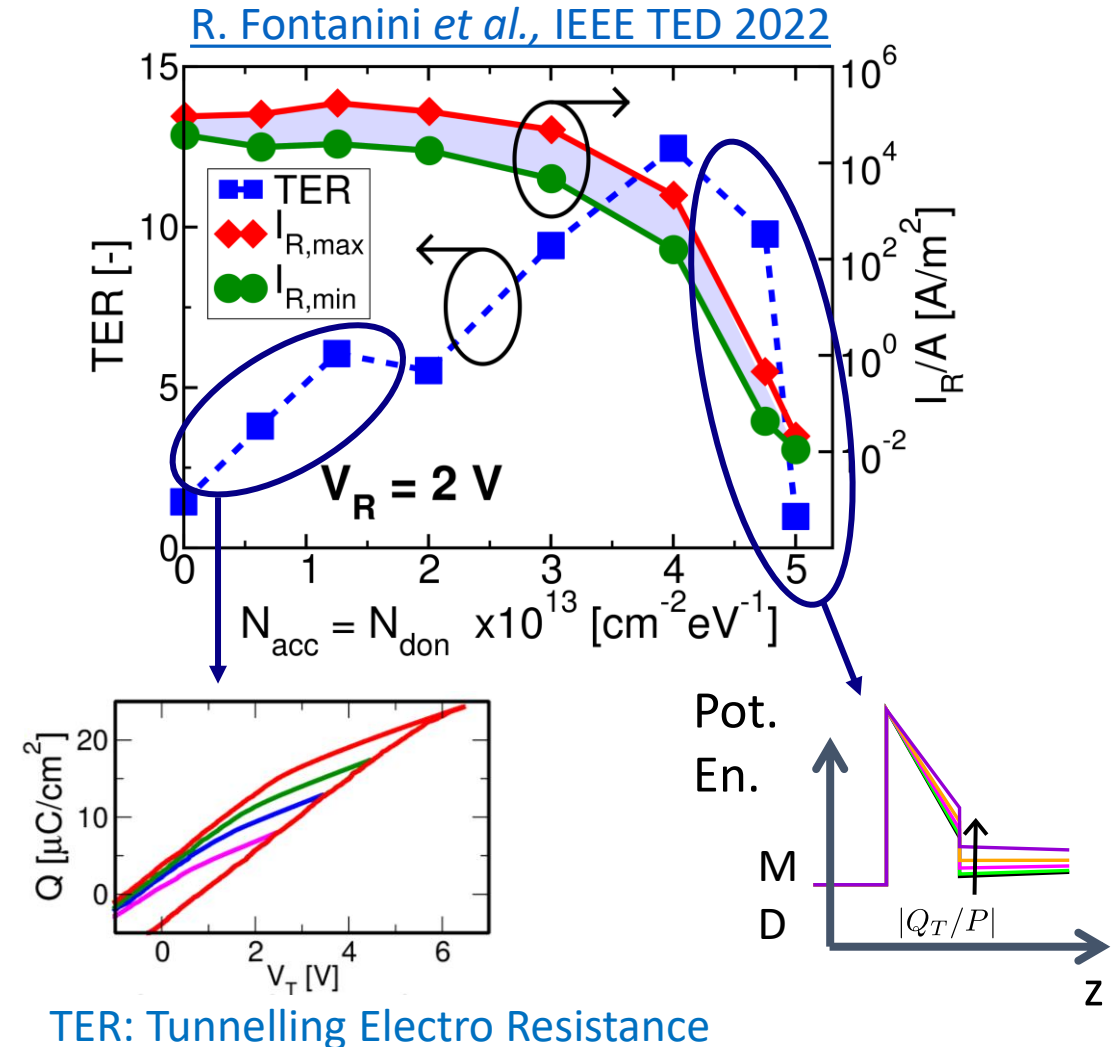
- **Relative error** introduced when estimating $P_{AV}^{(P)}$ with Q_{PU} **defined as**

$$Error = \left| \frac{Q_{PU} - P_{AV}^{(P)}}{P_{AV}^{(P)}} \right|$$
- **Error reduces** for **increasing trap density**
 → **reduction** of the **depolarization field**
- **Difficult** to provide **fixes** to extract the 'actual' $2P_r$



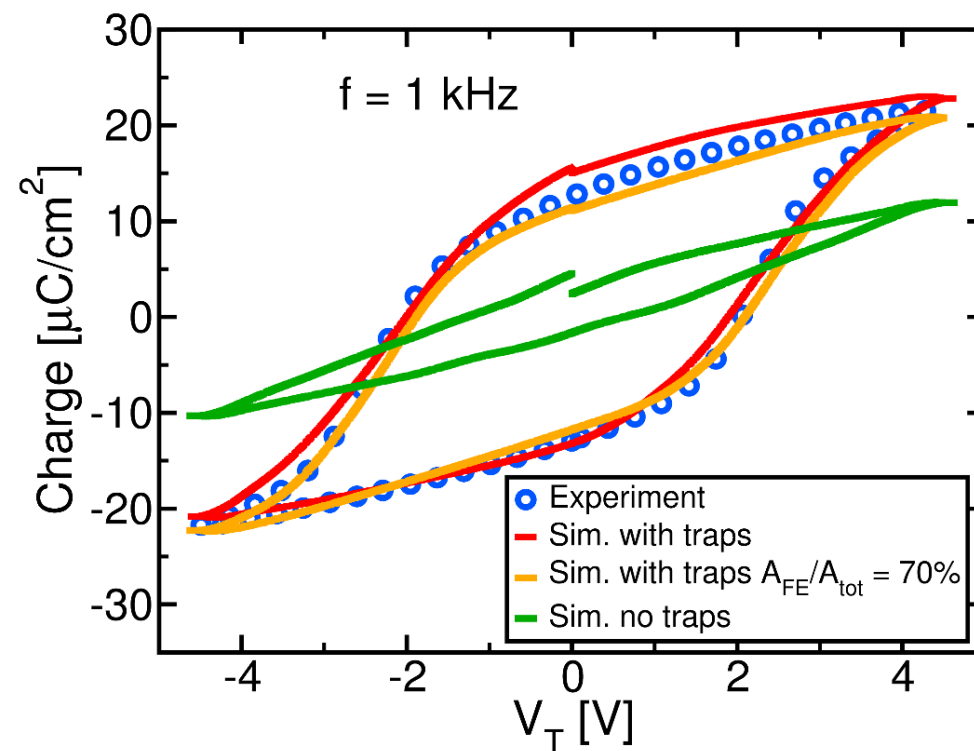
[M. Segatto et al., JEDS 2022](#)

- **Tunnelling current influenced by band bending of the structure**
- **Conduction band at FE-DE interface regulated by net charge:**
Polarization + trapped charge
- **Sweet spot for trap density:** too low → depolarization, too high → low tunnelling current
- **Open issue:** how can we engineer the **trap density** in **actual devices**?

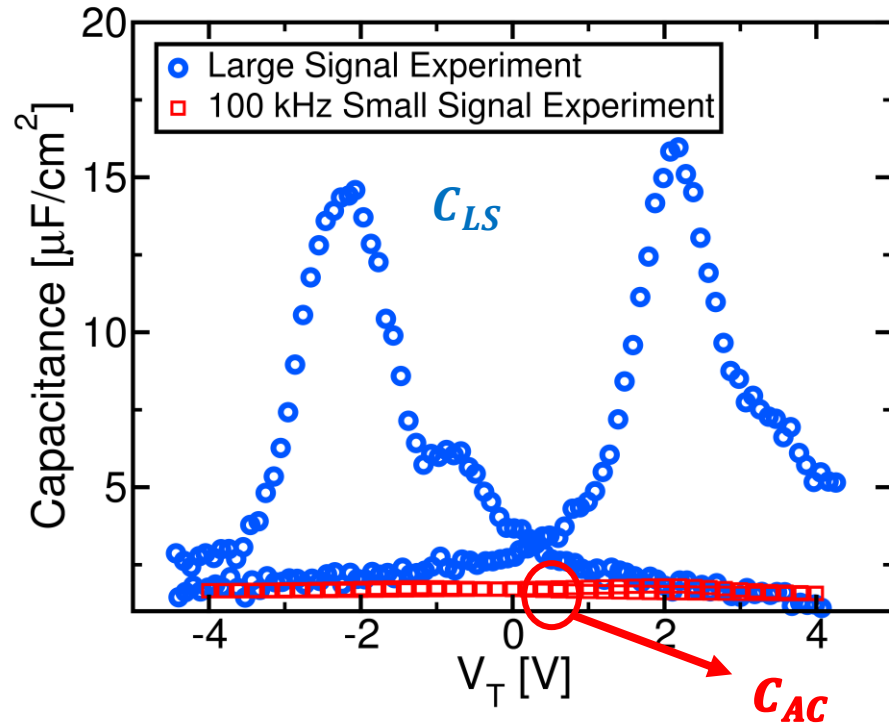


- ✓ Ferroelectric materials
- ✓ Ferroelectric Tunnel Junctions (FTJs)
 - ✓ Large signal operation
 - Small signal operation
- Ferroelectric Field Effect Transistors (FeFETs)
- Conclusions

- Simulations with traps show good agreement with large-signal P-V characteristic
- Simulated P-V characteristic without trapping is much more tilted and narrower [1]
- Agreement is maintained even if we consider that only a fraction of the HZO layer is ferroelectric FE area ($A_{FE}/A_{tot} < 1$)

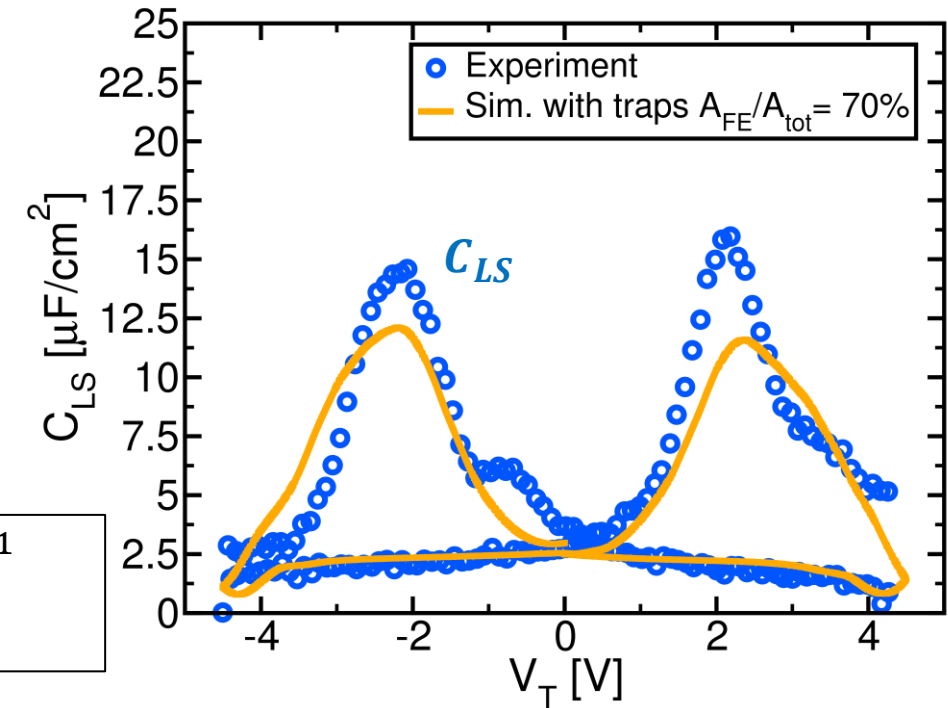


[1] HW Park *et al.*, Nanoscale 2021



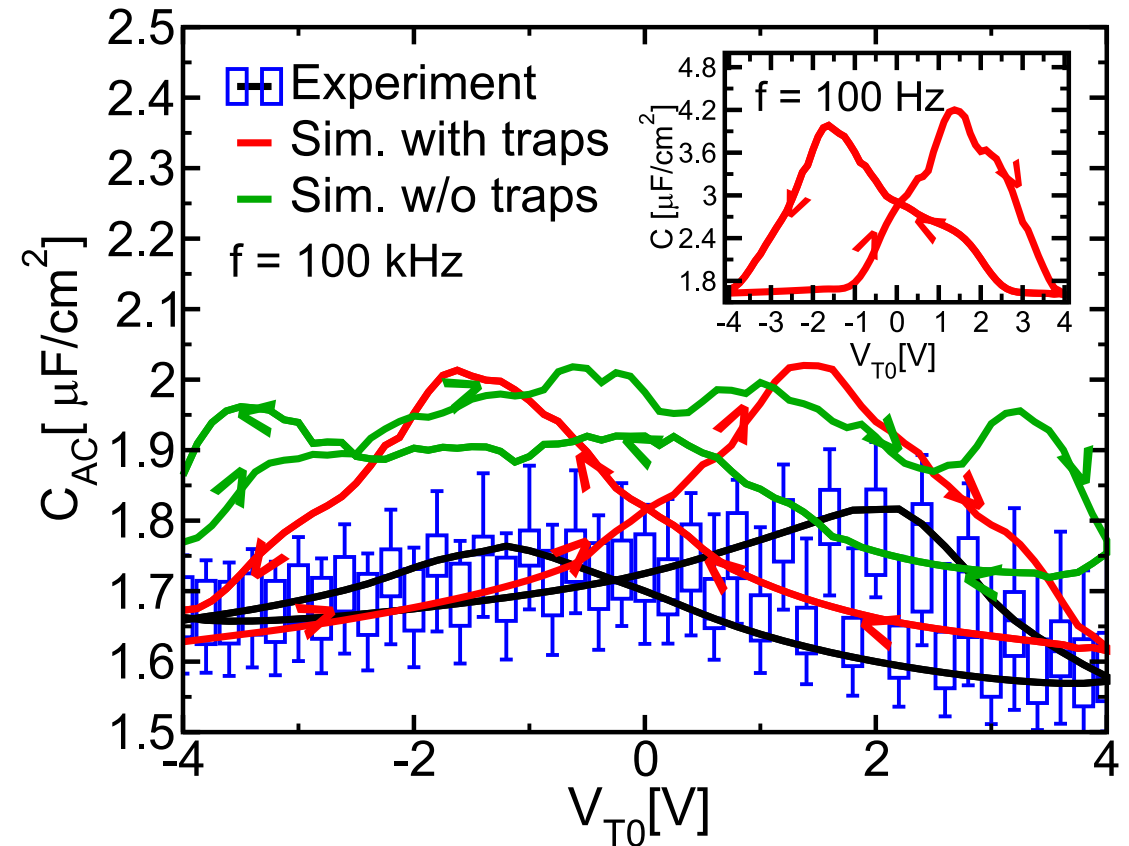
$f = 1 \text{ kHz}$

$$C_{LS} = I_{FTJ} \left[\frac{dV}{dt} \right]^{-1}$$



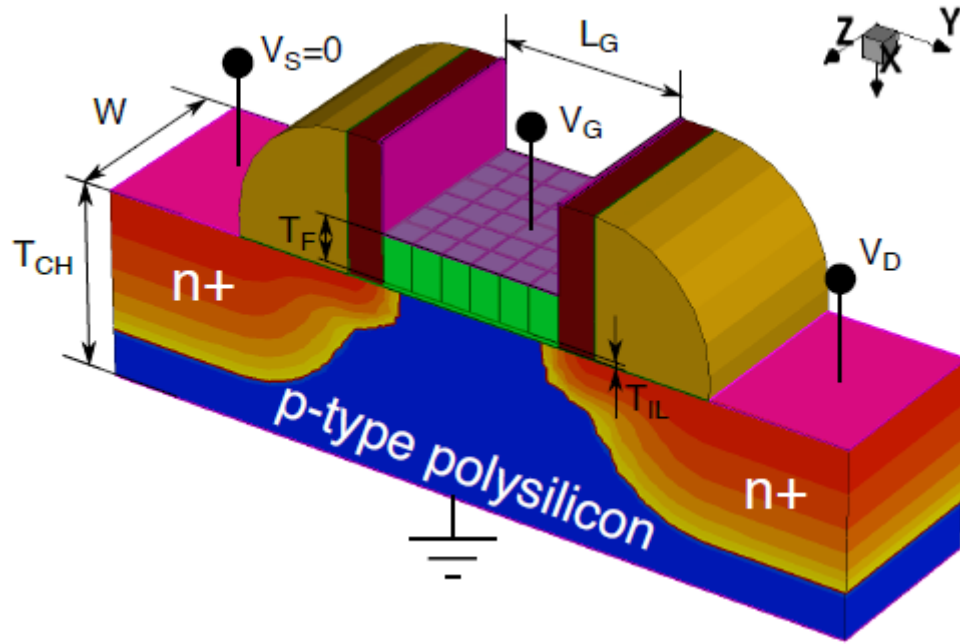
- Large-signal *equivalent capacitance* (C_{LS})
- Agreement between experiments and simulations is good
- Large signal capacitance is much larger than small-signal capacitance (C_{AC})

- Simulations without traps report a **significant discrepancy** with experimental data
- Simulated AC capacitance C_{AC} at high f shows **qualitative agreement** with experiments
- At **low f** the **agreement** is **worse** due to **traps effect** (inset)



- **Ferroelectric Tunnel Junctions** are a **promising hardware candidate** to enable **Neuromorphic Computing**
- The **dielectric layer** present in MFDM stacks plays a **key role** for **charge trapping** and **depolarization field**
- **Charge trapping** is **necessary** to explain **experimental behaviour** of **FTJs** in large and small signal regimes

- ✓ Ferroelectric materials
- ✓ Ferroelectric Tunnel Junctions (FTJs)
 - ✓ Large signal operation
 - ✓ Small signal operation
- Ferroelectric Field Effect Transistors (FeFETs)
- Conclusions



- **Ferroelectric Transistors (FeFETs):** ferroelectric layer integrated in the gate stack of a transistor above the dielectric
- **Non-destructive** readout of the **ferroelectric polarization** by probing the **source to drain current**

- **Link between potential and charge is non-linear in the semiconductor** → superposition of effects can't be used as in MFIM FTJs



TCAD solver

In TCAD solvers, usually, two models are available to simulate the ferroelectric materials behaviour:

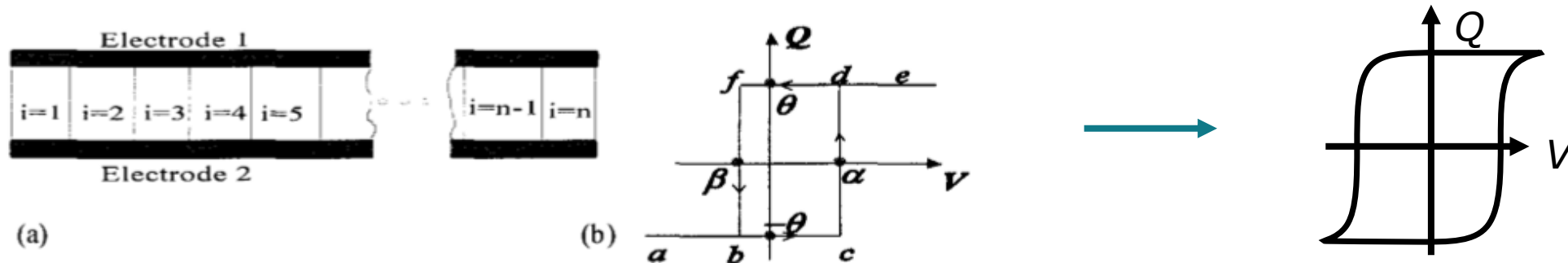
- **Preisach model**
- **Landau-Ginzburg-Devonshire (LGD) theory and Landau-Khalatnikov (LK) model**

TCAD tool Sentaurus-Device package [1] couples:
Preisach/LGD-LK+Poisson Equation+Drift Diffusion

[1] Synopsys Inc., Sentaurus Device User Guide, V-2023.12

Preisach model

- Phenomenological model of ferroelectric hysteresis
- Describe a macroscopic system that can be represented as a superposition of simple hysteresis units (a), and each unit has a rectangular hysteresis loop (b): switching charge Q , and the coercive voltages a and B , for each unit can be different



B. Jiang *et al.*, Computationally Efficient Ferroelectric Capacitor Model for Circuit Simulation, 1997 Symposium on VLSI Technology Digest of Technical Papers, p.141

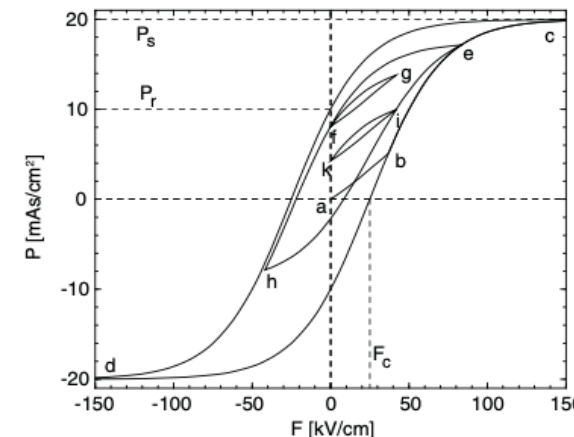
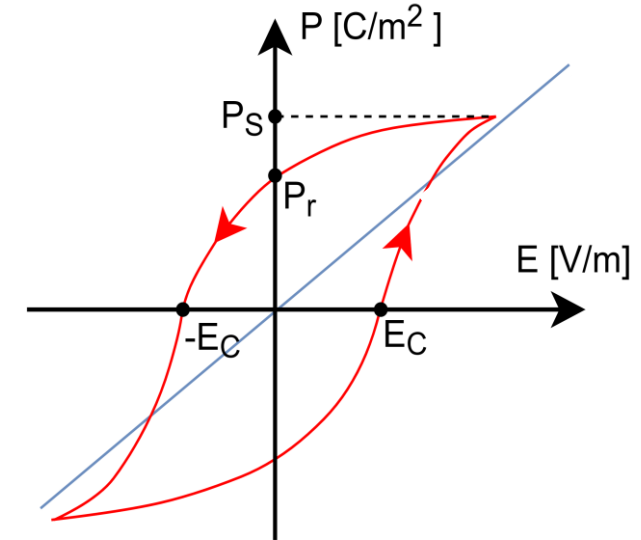
Preisach model

- Relation between electric field E_{FE} and spontaneous polarization P described with **hyperbolic tangent**:

$$P(E_{FE}) = m \cdot P_S \cdot \tanh[w \cdot (E_{FE} \pm E_C)] + P_{off}$$

$$w = \frac{1}{2E_C} \ln \frac{P_S + P_r}{P_S - P_r}$$

- The model also correctly accounts for the history dependence of ferroelectric capacitor (memorizing turning points) and can simulate minor loops nesting (thanks to m and P_{off} parameters) [1]



[1] Synopsys Inc.,
Sentaurus Device User
Guide, V-2023.12

Landau-Ginzburg-Devonshire (LGD) theory and Landau-Khalatnikov (LK) model

- Ferroelectric behavior is described in the continuum space [1]

Total potential energy of the system

$$U = \int_{vol.} \alpha_i \mathbf{P}_i^2 + \beta_i \mathbf{P}_i^4 + \gamma_i \mathbf{P}_i^6 +$$

Landau Free energy

$$+ \nabla_i \psi \mathbf{P}_i - \frac{\epsilon_0}{2} |\nabla \psi|^2 + \psi \rho_S$$

Electrostatic energy

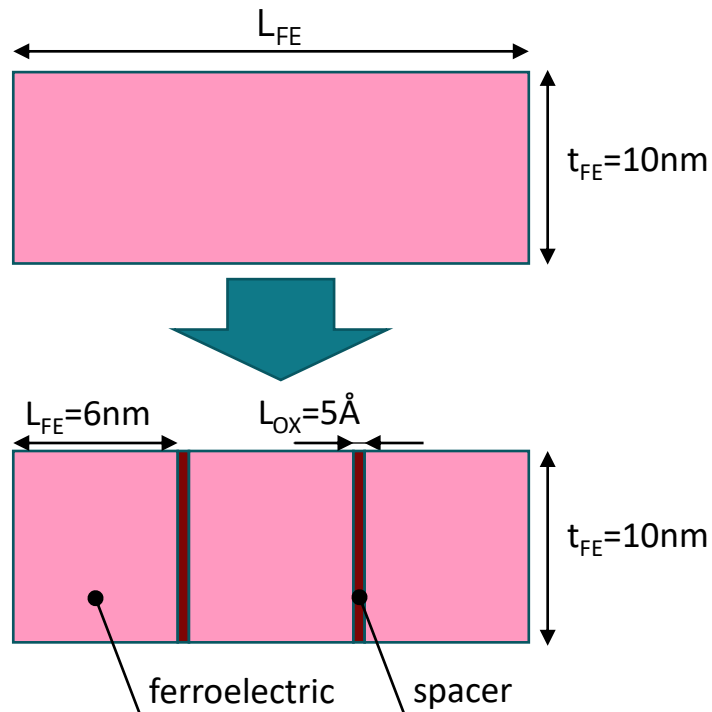
$$+ \frac{k_i}{2} |\nabla \mathbf{P}_i|^2 dx_i$$

Domain wall energy

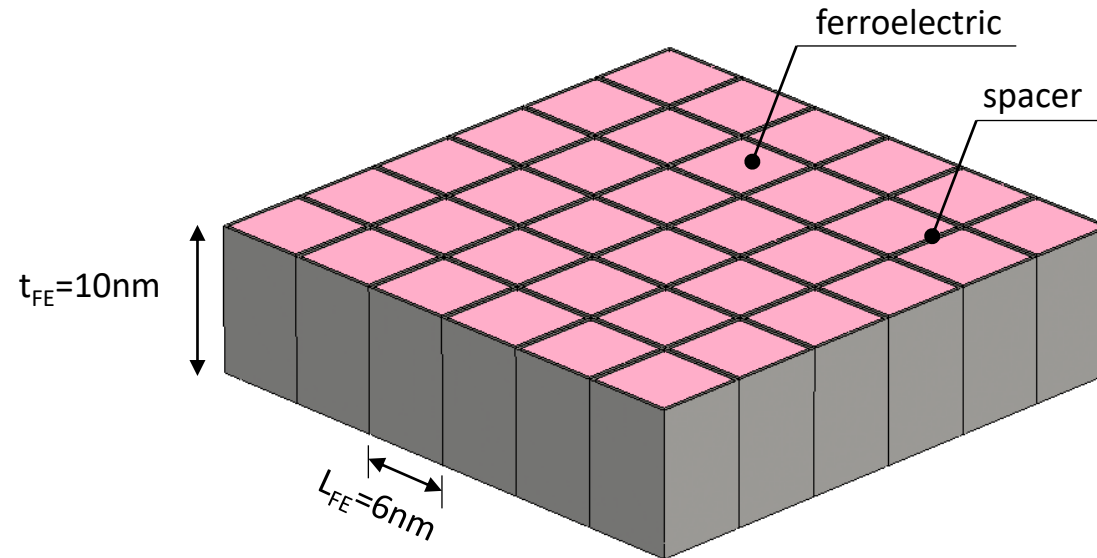
Kinetic equation
(Landau-Khalatnikov equation: LKE)

$$\rho \frac{\partial P_i}{\partial t} = - \frac{\delta U}{\delta P_i}$$

P : spontaneous polarization
 ρ : ferroelectric resistivity [$\Omega \cdot m$]



3D view

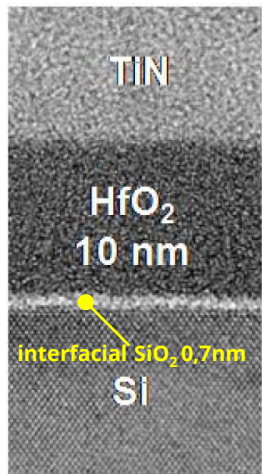


- As seen before, inside each grain the ferroelectric polarization is constant
 - relaxed constraints on the real space discretization
- Due to the presence of the interlayer oxide, the coupling between different grains is given by the electrostatic energy term only

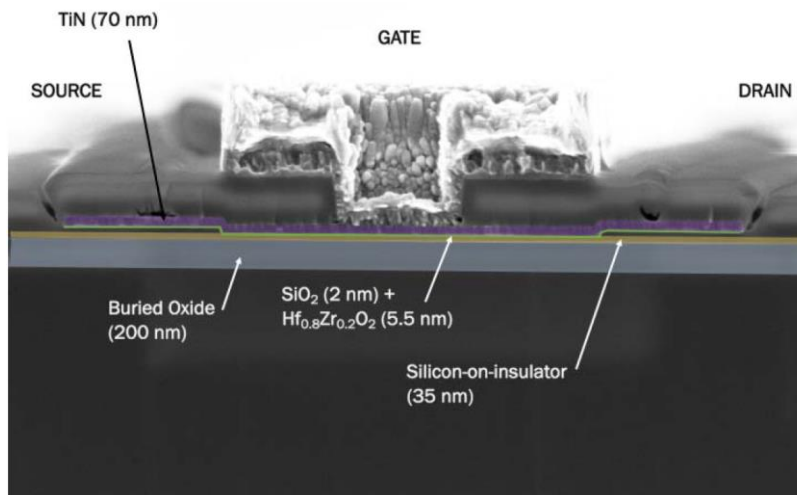
INTERFACIAL SiO_2 OXIDE LAYER (IL)

FIXIT

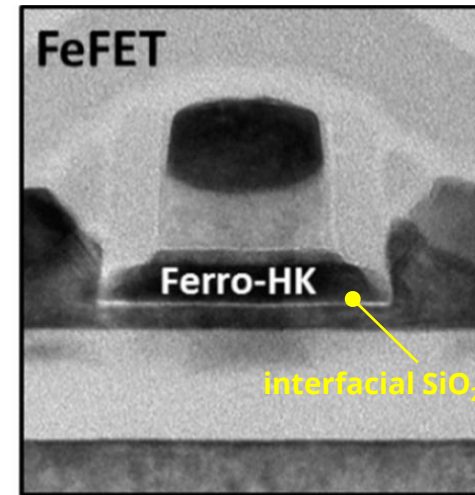
- In between the ferroelectric material and the semiconductor channel there is a thin SiO_2 interfacial layer that must be included in simulations



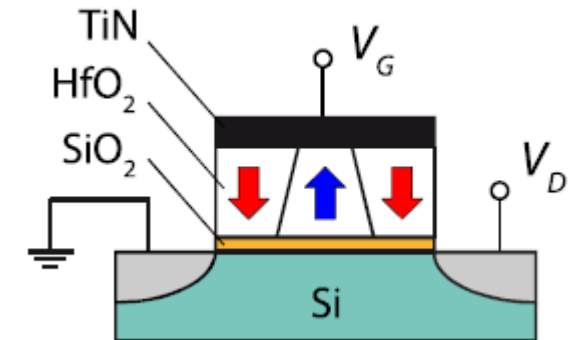
Toprasertpong et al., Proc. IEEE, 2019



Chatterjee et al., IEEE EDL, vol.38, n.10, 2017

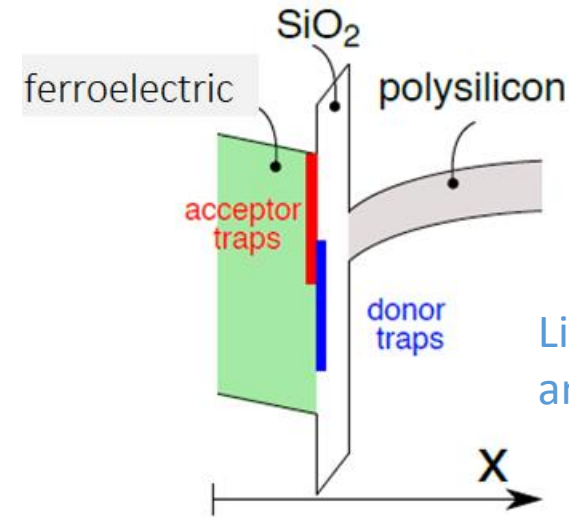
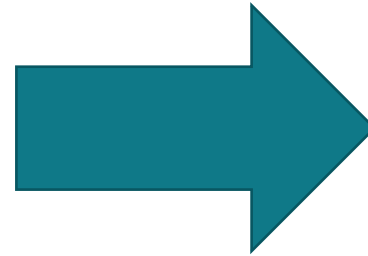
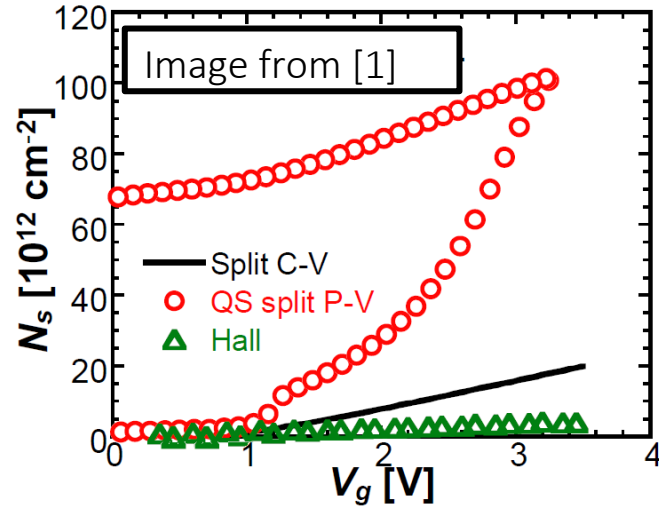


Dunkel et al., Proc. IEEE, 2017



Mulaosmanovic et al., IEEE TED, vol. 68, n.9, 2021

The introduction of a dielectric IL plays an important role in the operation and in the modelling of the device



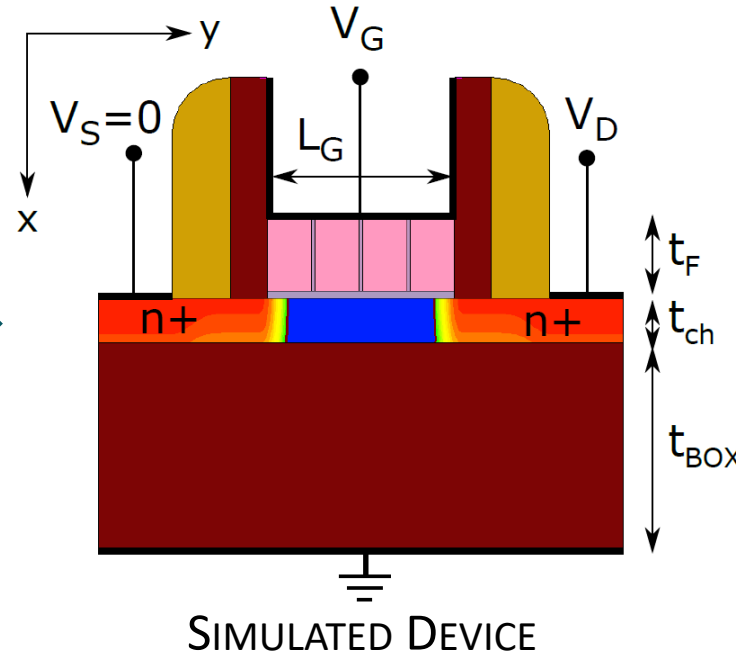
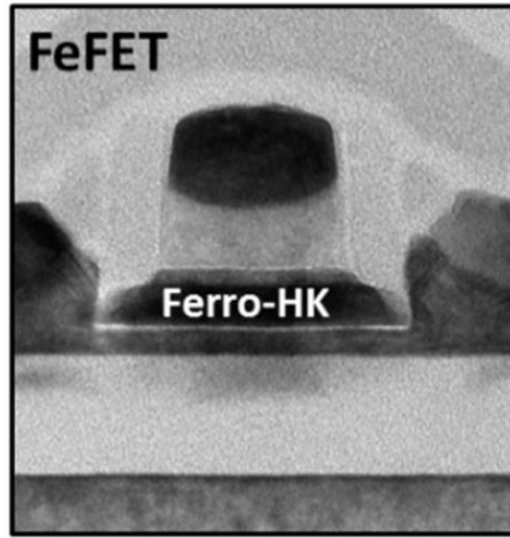
Lizzit *et al.*, ESSDERC 2021 and ESSDERC 2022

- Experimental results based on Hall and split-CV measurements suggest that most of the trapped charge compensating the ferroelectric polarization is located in the IL (or at the FE-DE interface) [1].

- We introduce interfacial traps
 $D_{it,acc} = 8 \times 10^{13} \text{cm}^{-2} \text{eV}^{-1}$
 $D_{it,don} = 1 \times 10^{14} \text{cm}^{-2} \text{eV}^{-1}$
- Traps exchange carriers with the silicon channel via tunneling (Nonlocal Tunneling [2]).

[1] K. Toprasertpong *et al.*, Proceed. of IEDM 2019.

[2] Synopsys Inc., Sentaurus Device User Guide, Q-2019.12.



$T_{Fe}=10$ nm
 $T_{ch}=6$ nm
 $L_G=24$ nm
 $T_{IL,SiO2}=1$ nm

- Fully Depleted SOI experimentally demonstrated in [1][2].
- Simulated FeFET (**2D simulation**) with 4 ferroelectric grains of 6 nm length [3].

[1] H. Mulaosmanovic *et al.*, IEEE Electron Device Letters, pp.294-297, 2020.

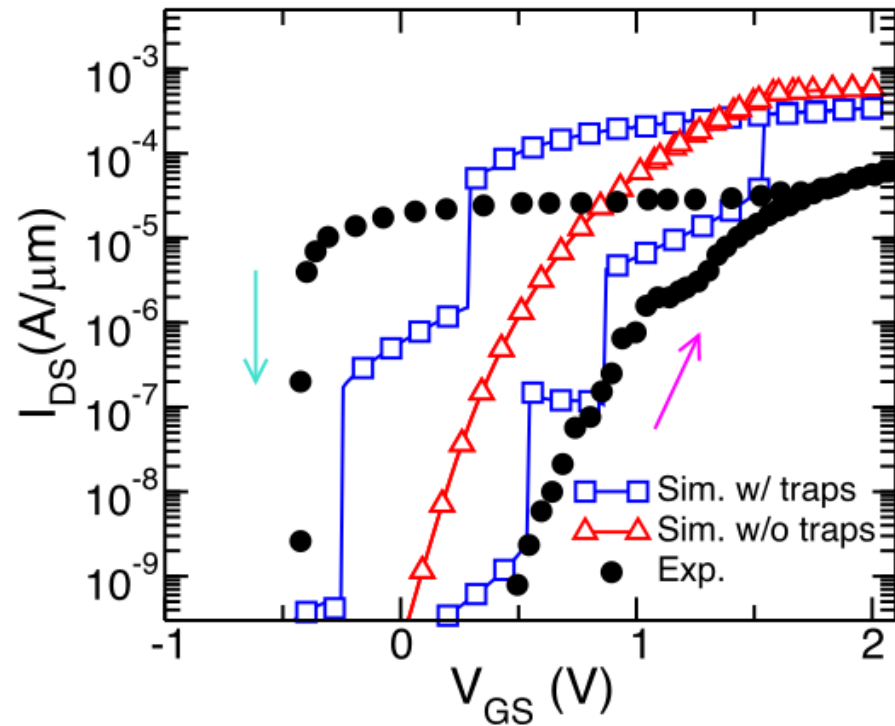
[2] Dünkel *et al.*, IEDM, 2017.

[3] D. Lizzit *et al.*, ESSDERC, 2021.

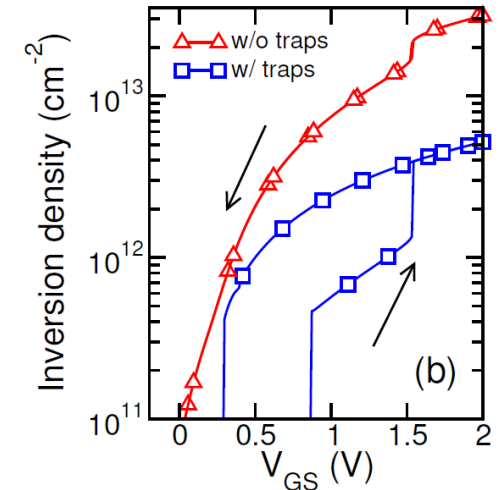
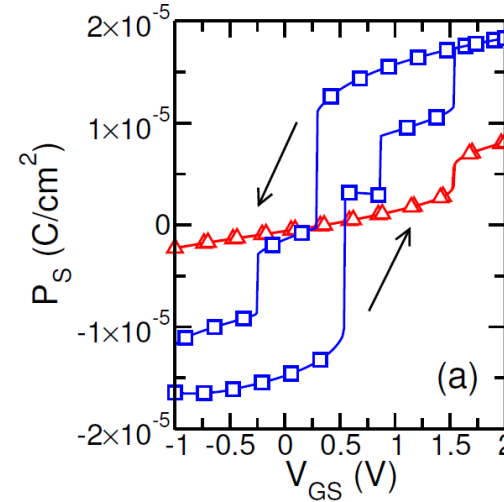
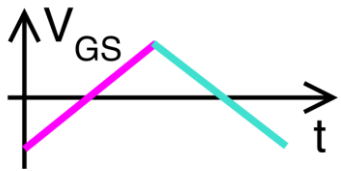
ANALYSIS OF EXPERIMENTAL FEFETS (2/2)

FIXIT

D. Lizzit *et al.*, ESSDERC, 2021

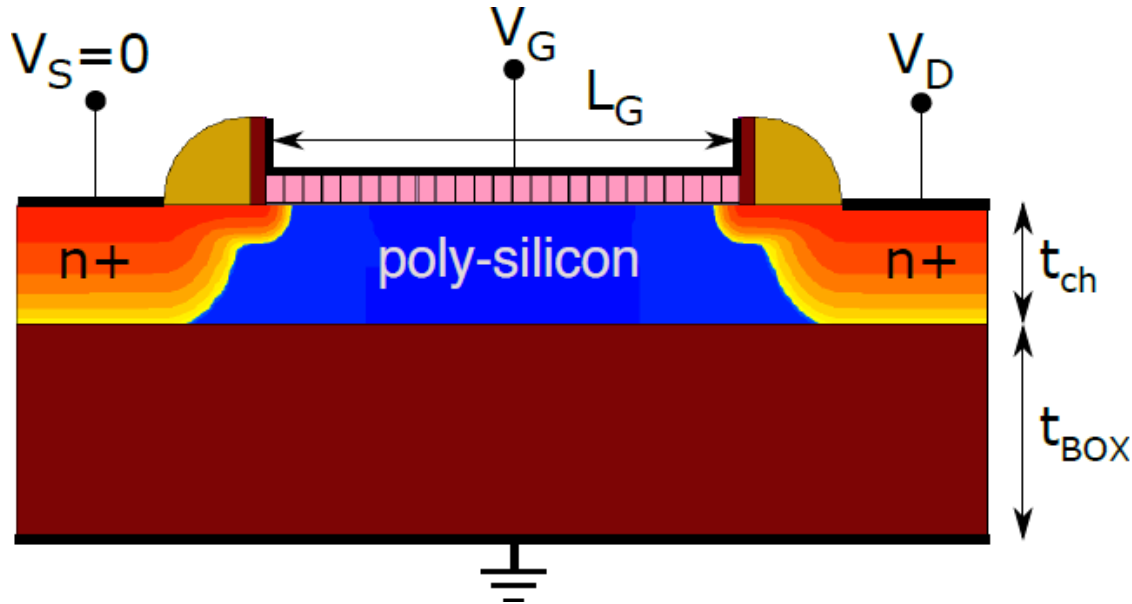


Experimental results obtained with forward and backward quasi-static V_{GS} sweep



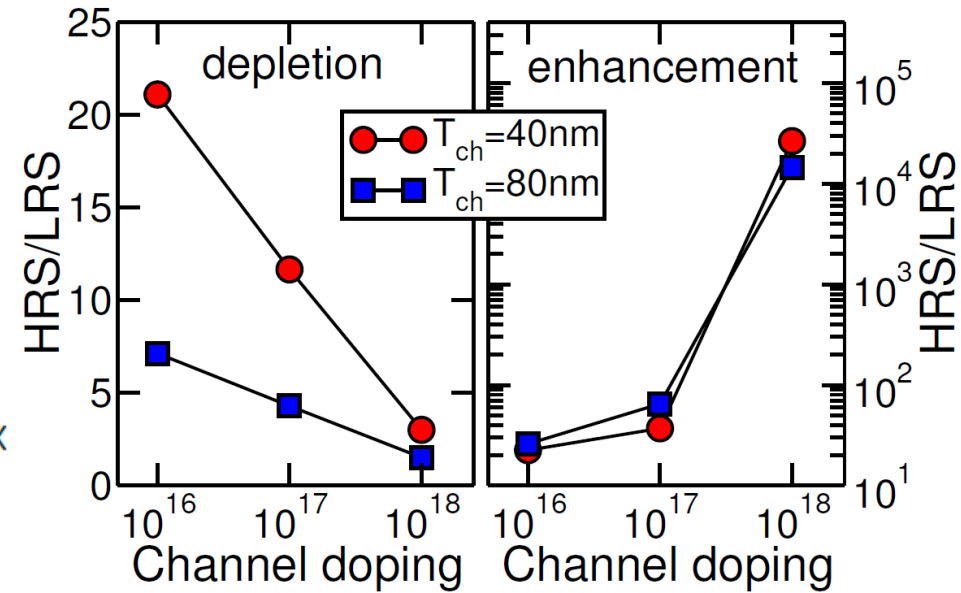
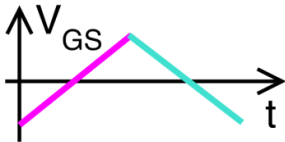
- The inclusion of traps in simulations strongly enhances the hysteresis of both the I_{DS} - V_{GS} and the P - V_{GS} curves.
- With traps the N_{INV} values are consistent with exper. estimates in silicon FeFETs [K. Toprasertpong *et al.*, *Proceed. of IEDM 2019*]

DESIGN OF BEOL COMPATIBLE FEFETS (2D SIM.) FIXIT



$T_{Fe} = 10 \text{ nm}$
 $T_{ch} = 40/80 \text{ nm}$
 $L_G = 150 \text{ nm}$
 $T_{IL} = 1 \text{ nm}$

quasi-static voltage ramps

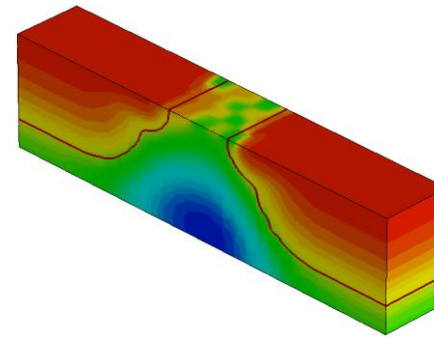
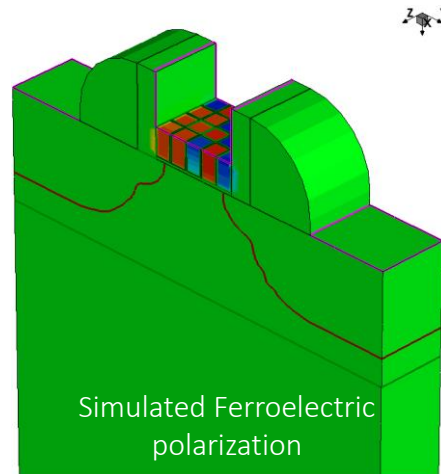
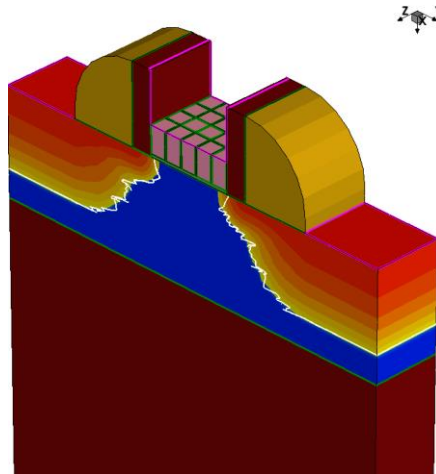


- HRS: high resistive state
 - LRS: low resistive state
- Evaluated at fixed V_{DS} and V_{GS}

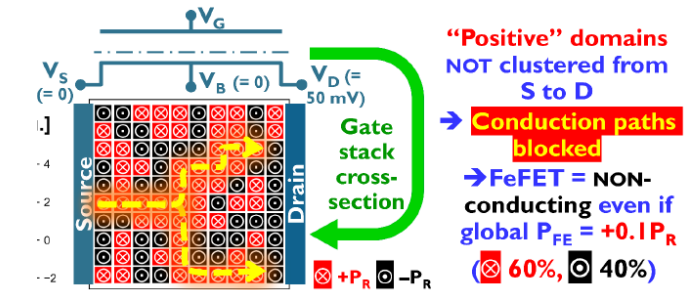
- For depletion-mode the HRS/LRS ratio decreases with T_{ch}
- the effective channel thickness of conductive channel increases with T_{ch} .
- Enhancement-mode is less sensitive to T_{ch} because I_{DS} is carried by the inversion layer.

SOME REMARKS (1/2): 3D VS 2D SIMULATIONS

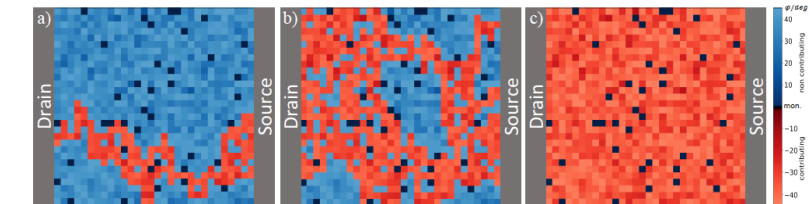
FIXIT



Simulated electron density in the poly-Si channel



Xiang et al., Proceedings of IEDM 2020

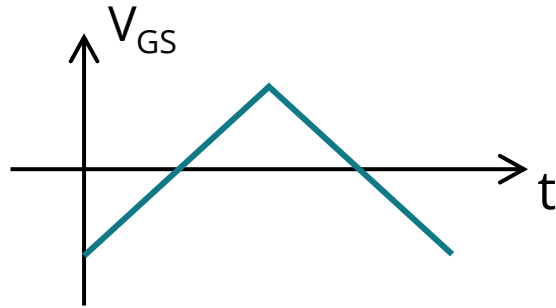


Müller et al., Proceedings of IEDM 2020

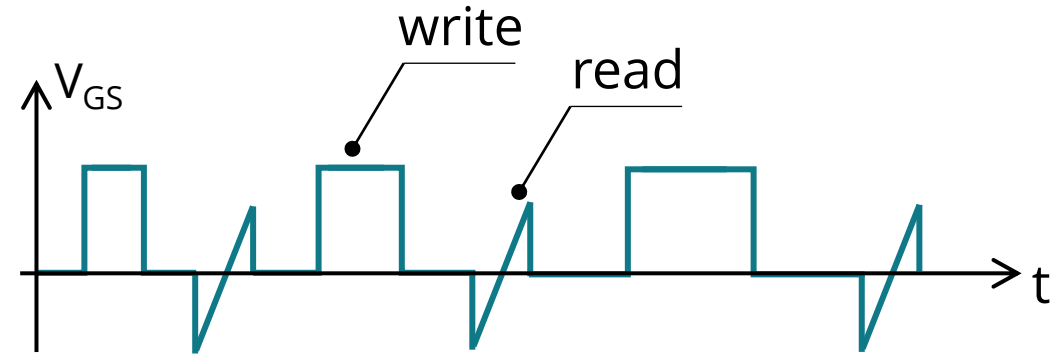
- Need for 3D FeFET simulations:
- to account for percolative conductive paths.
- 3D simulations wash abrupt steps in the I_{DS} curves observed in 2D simulations
- 3D simulations appear indispensable in order to investigate the multi-level operation of FeFETs

SOME REMARKS (2/2): GATE BIASING SCHEME

FIXIT



quasi-static
voltage ramps

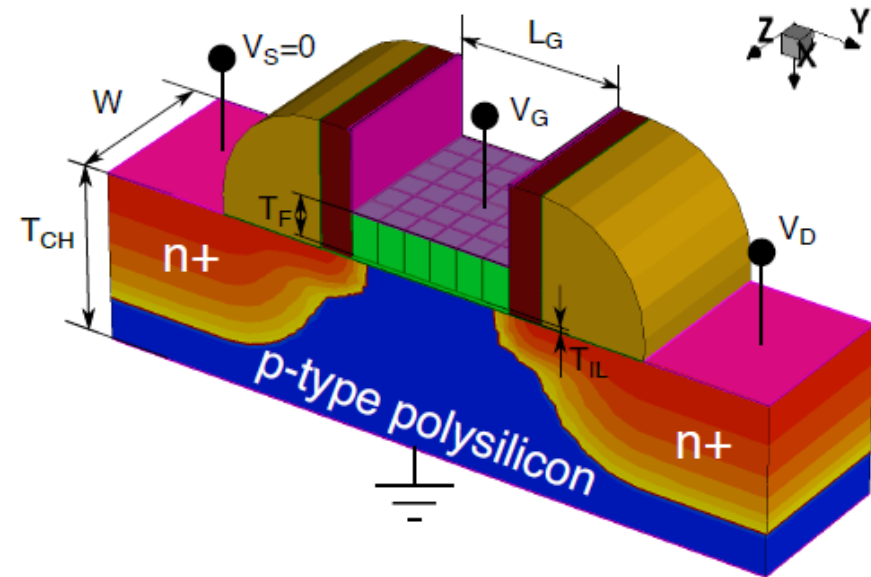


Pulsed

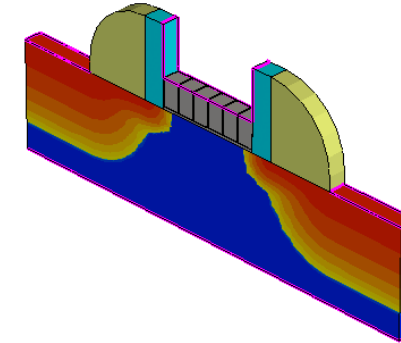
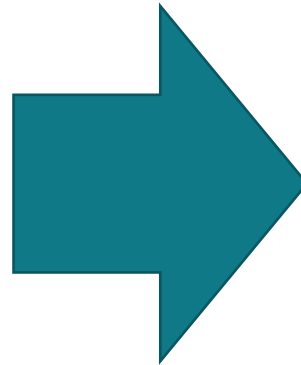
- To investigate how many resistive states we can accommodate in the device, we need a pulsed gate voltage biasing scheme

2D VERSUS 3D SIMULATIONS

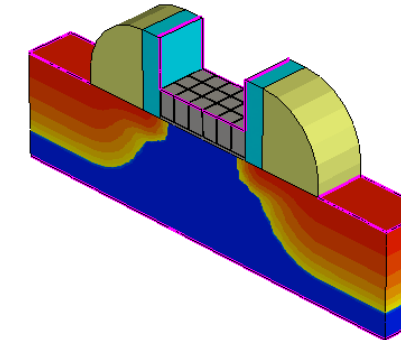
FIXIT



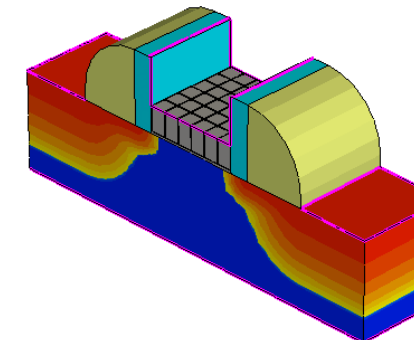
D.Lizzit *et al.*, IEEE
ESSDERC 2022



quasi 2D FeFET
(6x1 domains)

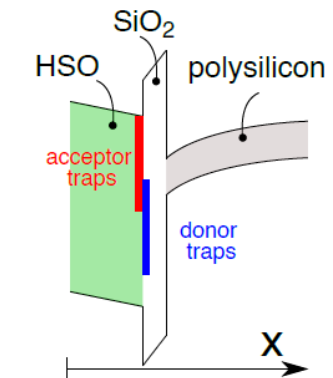


3D FeFET
(6x3 domains)



3D FeFET
(6x6 domains)

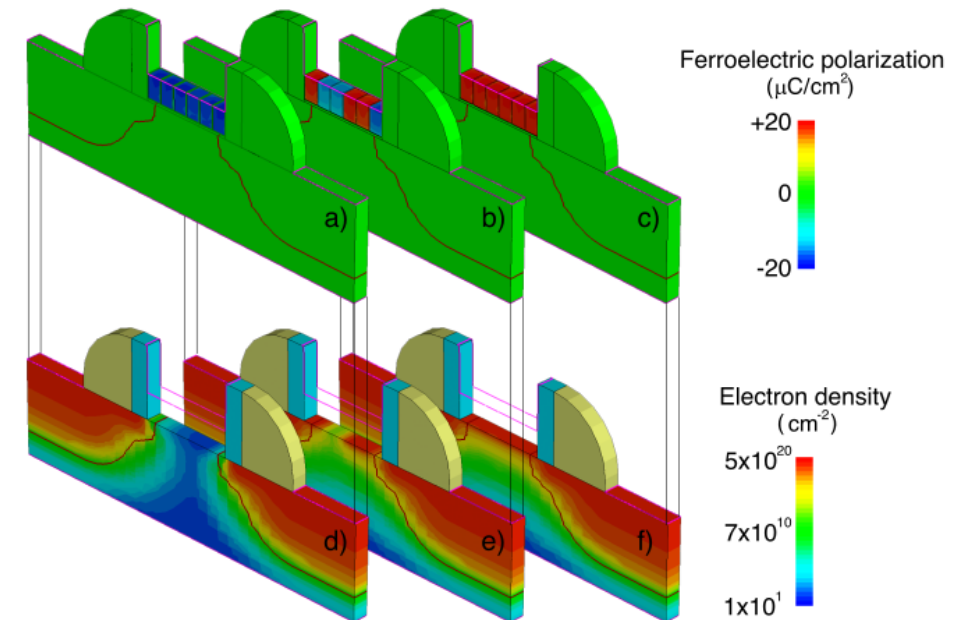
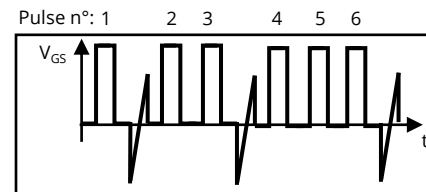
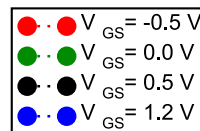
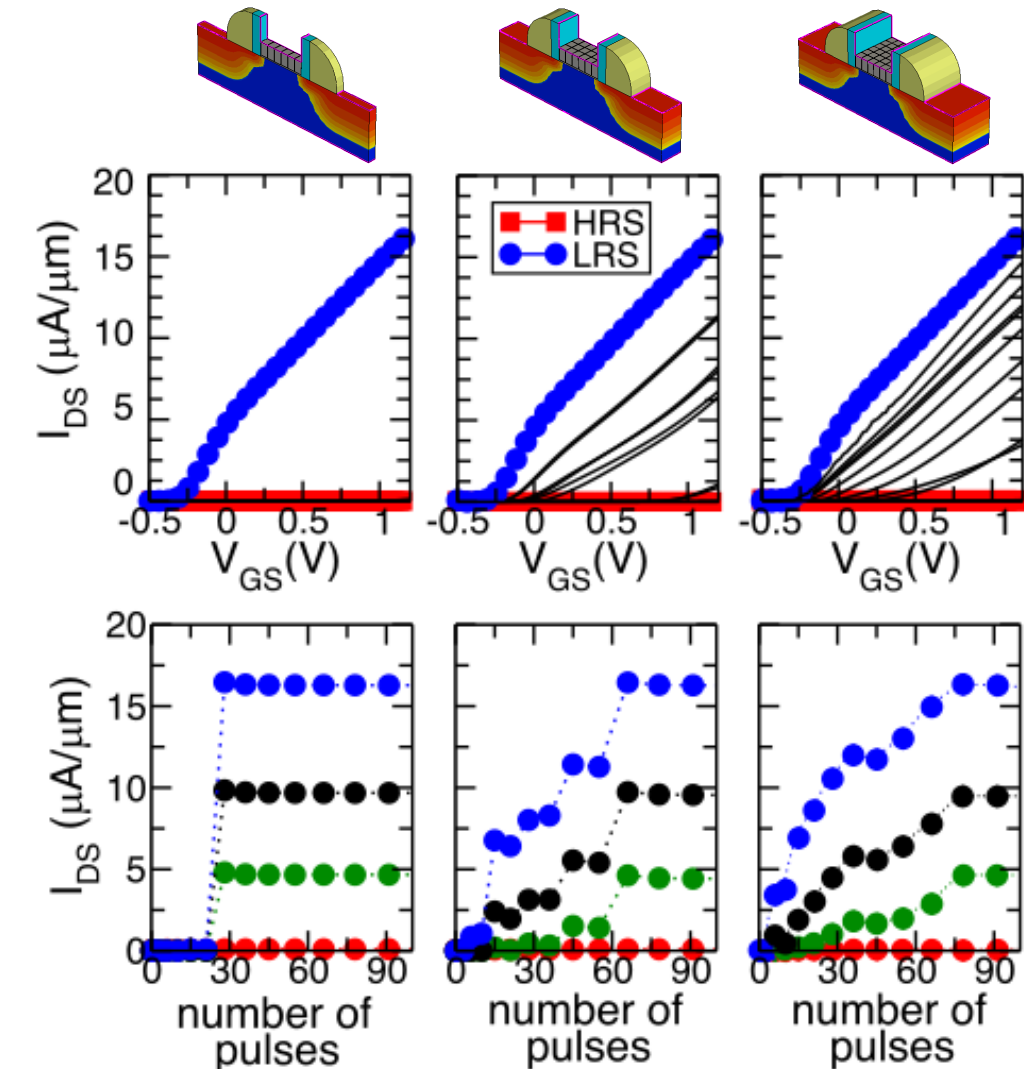
- Donor trap density
 - $D_{IT,donor} = 1 \times 10^{14} \text{ eV}^{-1} \text{ cm}^{-2}$
- Acceptor trap density
 - $D_{IT,acceptor} = 8 \times 10^{13} \text{ eV}^{-1} \text{ cm}^{-2}$



SETTING MULTIPLE CONDUCTANCE STATES (1) FIXIT

- The 6×1 FeFET exhibits a digital behavior $\rightarrow$ because any domain with negative polarization precludes the formation of a source to drain conduction path.

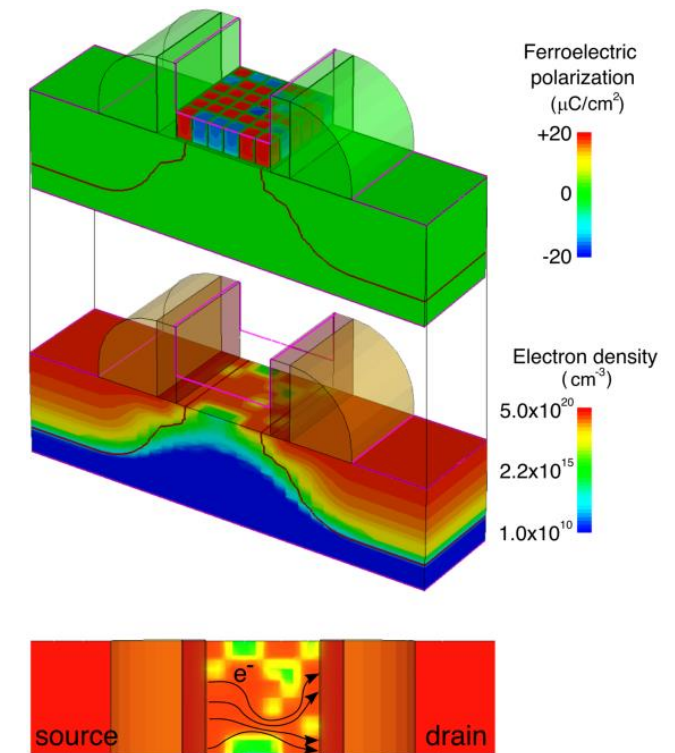
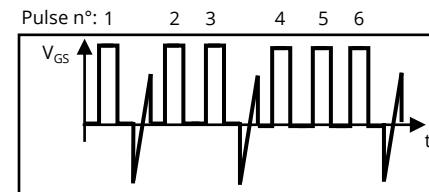
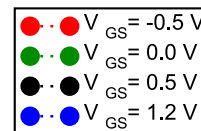
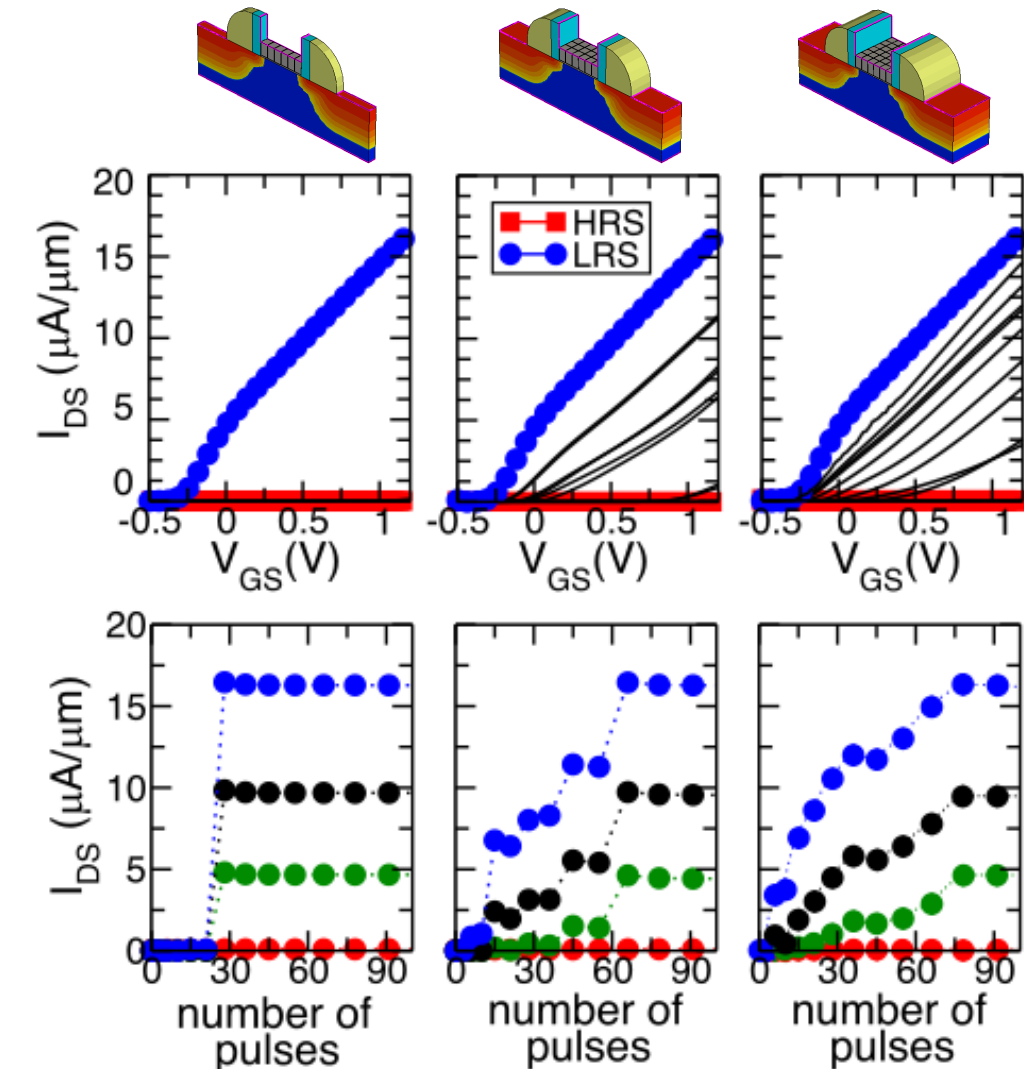
D. Lizzit *et al.*, IEEE
ESSDERC 2022



SETTING MULTIPLE CONDUCTANCE STATES (2) FIXIT

- FeFETs having 3 and 6 domains along the device width exhibit several intermediate V_{th} values or, equivalently, intermediate current levels in the readout mode.

D. Lizzit *et al.*, IEEE
ESSDERC 2022



- **FeFET architecture** allows to:
 - **decouple** the **readout** and **write** operations
 - obtain **read currents** that can be quite **higher than in FTJs**
- Accumulative switching behaviour and **percolation current paths** offer a **powerful pathway** for a **multi-level memristor operation**
- **Accumulative switching** depends on:
 - **density of traps** and their **emission** and **capture** rates
 - the **features** of the **V_{GS} waveforms**, including the **delay times** between the groups of **potentiation pulses**

- ✓ Ferroelectric materials
- ✓ Ferroelectric Tunnel Junctions (FTJs)
 - ✓ Large signal operation
 - ✓ Small signal operation
- ✓ Ferroelectric Field Effect Transistors (FeFETs)
- Conclusions

- **Ferroelectric-based devices** are **promising candidates** for **low-power neuromorphic computing applications**
- Understanding and modelling their operation is of **paramount importance**
- **Simulations** are essential to gain **insight** into the **behavior** and **design** of these **devices**