

Advances in atomistic modeling for predictive TCAD applications

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Abstract— Atomistic simulations are rapidly becoming critical building blocks for predictive TCAD, and are increasingly utilized in the expanding coverage of applications way beyond the original TCAD scope. This paper aims to give an overview on some of the key aspects of material engineering and physical process optimizations. The continuous evolution in methodology for more accurate and realistic atomistic modeling, as well as improvements in computational efficiency such as automation to deal with large amount of data generation and analysis, are covered. An overall comprehensive hierarchical approach to move TCAD toward true virtual fab is also proposed.

Keywords—Atomistic, predictive TCAD, material optimization, ferroelectric, hierarchical simulations, virtual fab, chemical etching

I. INTRODUCTION

Semiconductor technology scaling has overcome many anticipated brick-walls, thanks to multi-fronted innovations [1]. Along the way, TCAD has also evolved and expanded toward the function of a true virtual fab [2-4], which can be used to study numerous architectures, device and process options, to identify root-causes of issues and to provide improvement suggestions during various R&D stages. Realizing values of such functions depends critically on TCAD's predictive-ness, which could be boosted by incorporation of *ab initio* atomistic simulations. Atomistic modeling has seen early adoption in advanced device simulations [5,6] and has also been employed in a few limited process modeling cases [7-9]. Since material and physical process engineering is being increasingly included in the TCAD virtual fab flow, it is pertinently needed to advance the methodology to enable seamless integration. Progress in this aspect is showcased in sections A and B. Bridging atomistic simulations to feature scale, another piece of the virtual fab puzzle, has only been partially addressed in previously reported works mainly limited to electrical simulations [10], or material modeling up to nanoscale [11]. Finally, from a forward looking perspective, a systematic approach to address the integration of atomistic modeling into the virtual fab flow is proposed.

II. ENGINEERING MATERIAL PROPERTIES

Inclusion of engineered materials to serve specific functions is among the many innovations driving continued technology scaling. Some of the functions, such as high-k/low-k dielectrics, etch-resistant materials, used as integration building blocks, are governed predominantly by bulk properties. On the other hand,

many functions, such as advanced interconnects, contacts, magnetic or ferroelectric (FE) components, rely on operation properties such as contact resistance, magnetization or polarizations, which are additionally influenced heavily by non-bulk, e.g. grain formations [12], surface or interfacial properties. These important aspects will be discussed in the context of rigorous atomistic model frameworks employing a combination of *ab initio* simulation tools [13-17].

It is especially noted that these types of simulations, particularly tailored to identify major bottlenecks in material engineering and to reveal improvement pathways, comprising high degree of automation combined with data mining, can be well suited to integrate into the TCAD virtual fab workflow.

1. Optimizing BN as low-k dielectric

Recently published experimental research raised the potential applications of amorphous BN [18-20] as low-k dielectric

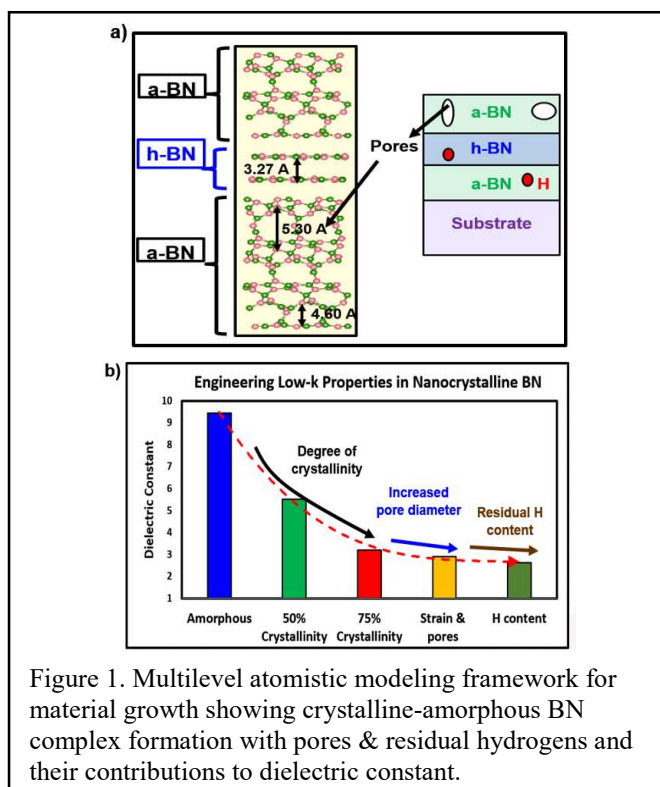


Figure 1. Multilevel atomistic modeling framework for material growth showing crystalline-amorphous BN complex formation with pores & residual hydrogens and their contributions to dielectric constant.

material. However, up to date detailed understanding on the governing physical mechanisms is still lacking. To study

intrinsic k-value effects, a comprehensive atomistic level model is required to simultaneously consider multiple effects. Shown in Figure 1 is a case of such systematic approach to address dielectric property engineering aspects of BN. Starting with detailed material growth simulation to identify the key enhancing factors of desired properties, a structure-property map is generated. Such a comprehensive atomistic workflow is comprised of the following elements: 1) growth of BN nanocrystals embedded in amorphous matrices; 2) formation of pores and their size dependencies; 3) characterization of the combined effects of pores and strain. As illustrated in Figure 1, the prediction by atomistic simulations of the pores formation and equilibrium pore sizes serve as a first level approach in the conquest of identifying and engineering viable pathways to achieve desired k-values. The impact of H impurities is also addressed within the same framework and is shown to further affect the calculated dielectric properties.

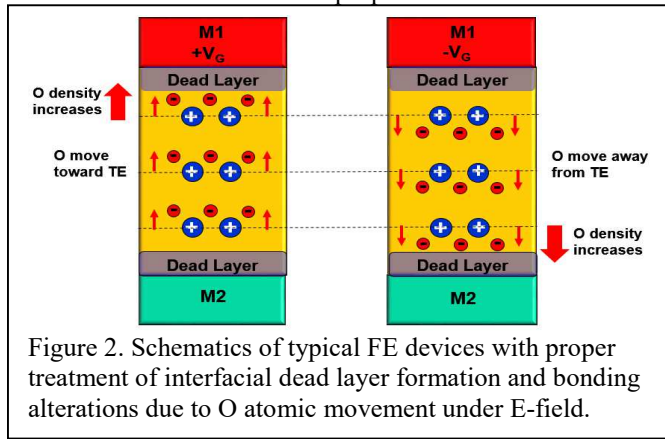


Figure 2. Schematics of typical FE devices with proper treatment of interfacial dead layer formation and bonding alterations due to O atomic movement under E-field.

2. Optimizing interfacial property of MFM

As shown in Figure 2, the MFM (Metal/FE/Metal) device characteristics not only depends on FE film's bulk property [21-23], but also M/FE interfacial property, which can influence overall MFM polarization behavior significantly. Optimizing M/FE interfaces to establish desired strain which can impact FE phase stability and FE switching characteristics, is an example

next level engineering beyond material bulk property. In addition, defect engineering also needs to be considered to further account for possible interfacial inter-diffusion processes. In the following, interfacial engineering to enhance charge screening at electrode interfaces for better performance of ferroelectric based devices, is illustrated in the context of *ab-initio* simulations. Particular interfacial interactions with metals including dead layer considerations are depicted in Figure 2. Such studies need to allow for multiple interfacial coordination conditions to develop a realistic description of their impact and proper comparison with experimental polarization data.

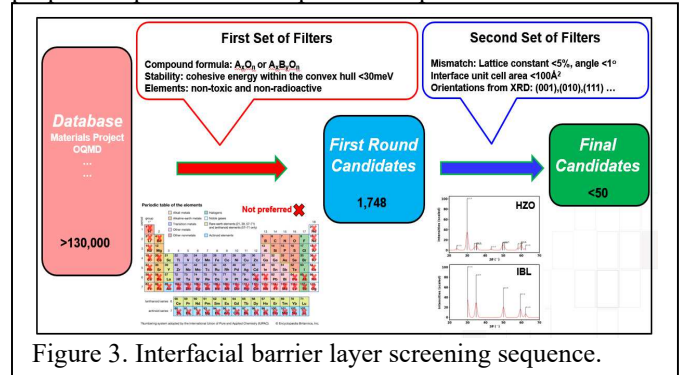


Figure 3. Interfacial barrier layer screening sequence.

Adding to the arsenals for further enhancing and leveraging beneficially the interfacial impact, an interfacial barrier layer (IBL) is introduced. Finding the right candidate IBL can be cumbersome by traditional simulation methods. Novel approaches based on material screening, and incremental property optimizations can prove significantly more efficient. In the following, a prototypical methodology is presented, that starts by mining commonly available material databases such as Materials Project [24] for particular bulk properties such as desired band gap, formula, elements, etc. As illustrated in Figure 3, the above-mentioned properties may yield the first set of candidates which likely is too large. A second set of filters is thus applied, including more advanced properties that need further calculations, such as XRD spectra, lattice mismatch, interfacial area with the FE substrate, as depicted in Figure 4. Next, stacking consideration is addressed that is important

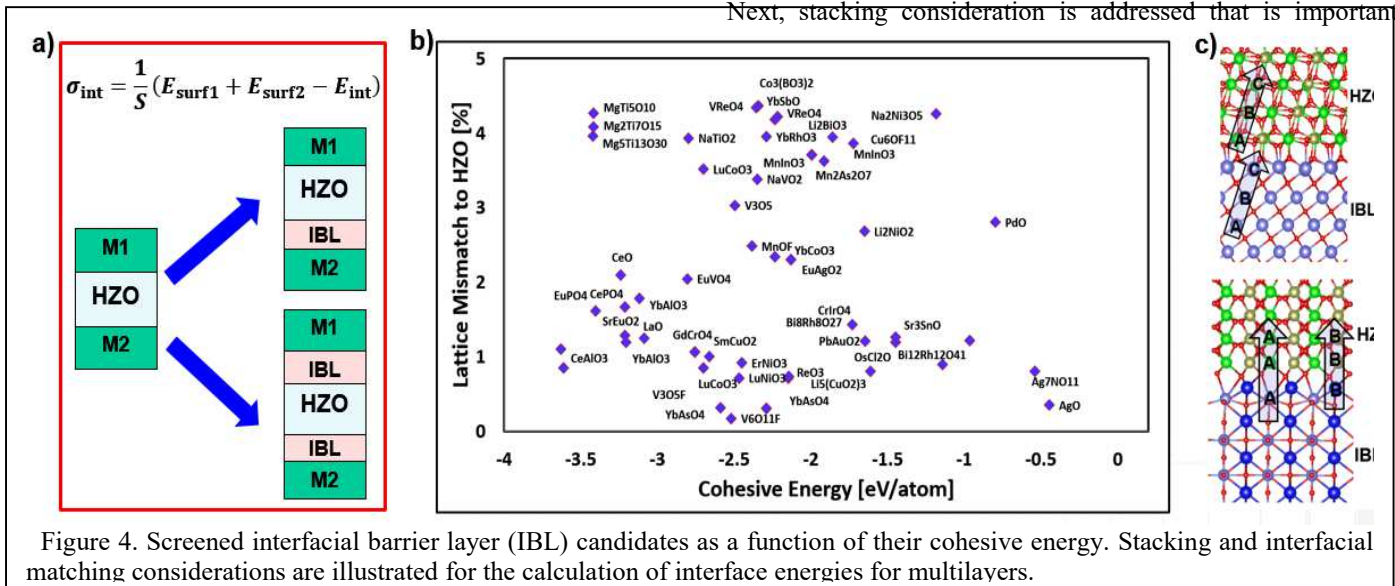


Figure 4. Screened interfacial barrier layer (IBL) candidates as a function of their cohesive energy. Stacking and interfacial matching considerations are illustrated for the calculation of interface energies for multilayers.

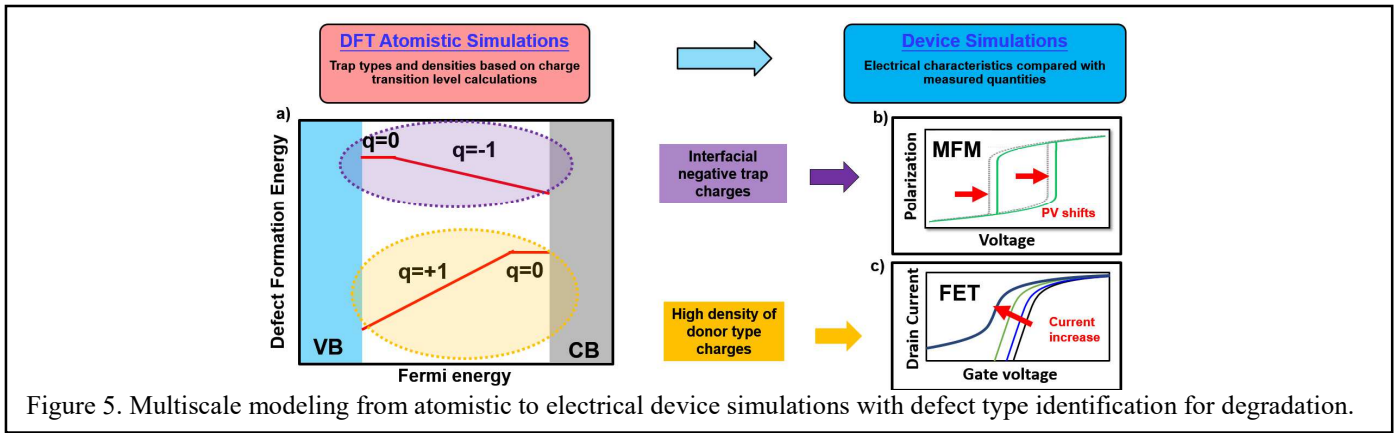


Figure 5. Multiscale modeling from atomistic to electrical device simulations with defect type identification for degradation.

to assure the materials can be grown on each other. Two different possible stackings are illustrated in Figure 4 c), ABCABC, and AAA/BBB for arbitrary IBL layers. Finally, a down selected smaller set of material candidates can be studied by rigorous atomistic simulations for further validation.

Besides interfacial effects, the trap level positions of intrinsic and extrinsic defects may account for multiple device shortcomings such as fatigue, SILC, dielectric breakdown, etc. As shown in Figure 5, a hierarchical coupling between the atomistic and device scale simulations can be used to address and characterize the influence on device electrical behaviors by various defects of different flavors and their combinations.

III. ATOMISTIC SIMULATIONS FOR PROCESS OPTIMIZATION

Optimizing semiconductor process modules such as deposition and etching is becoming increasingly difficult due to their complexity which entails larger number of input parameters coupled with costly and time consuming TEMs needed to characterize the 3D natured results. To guide experimental development, feature level simulations are more and more leveraged, based on thermal dynamics or MC (Monte-Carlo) simulators which model process events representing interactions of particles (such as ions, molecules or radicals) with various material substrates. Input parameters to feature level simulations previously depended mostly on experimental calibrations, can now systematically employ *ab-initio* atomistic

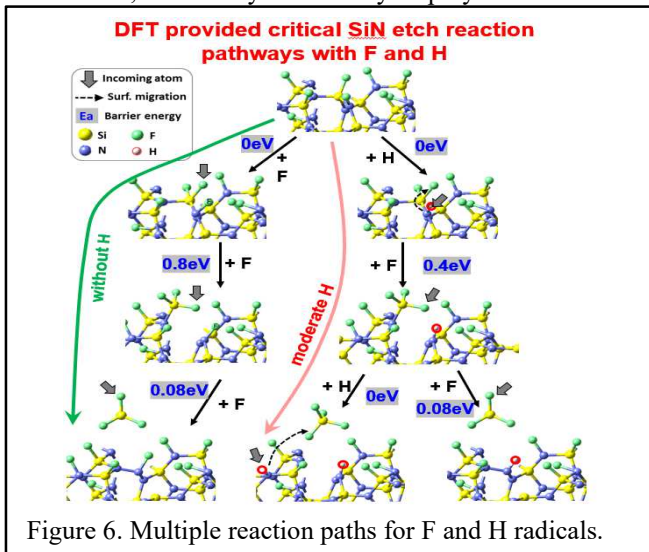


Figure 6. Multiple reaction pathways for F and H radicals.

simulations. In the following, an example application in chemical etching process modeling is presented.

1. Reaction paths of SiN etching

In the following, optimization of the SiN etching, a common semiconductor process module, is illustrated with multi-level simulations. Atomistic simulations are first carried out to identify potential surface reaction paths of SiN etching with a mixture of F and H radicals, as shown in Figure 6. The reaction energy barriers E_a 's are calculated for multiple reaction paths including subsequent situations with the F and H mixture already adsorbed on the surface. The net etch rate that depends on the delicate balance of multiple reactions, is then obtained by the higher level models presented in the next subsection.

2. Net etching rate modeling

ChemKin [25] simulations are set up such that multiple reaction paths with E_a 's and pre-factors derived from atomistic surface reaction are accounted for. The non-monotonic etch rate vs. H ratio can be correctly predicted, as shown in Figure 7. This example serves as an illustration on the first two level coupling in the hierarchical simulation strategy.

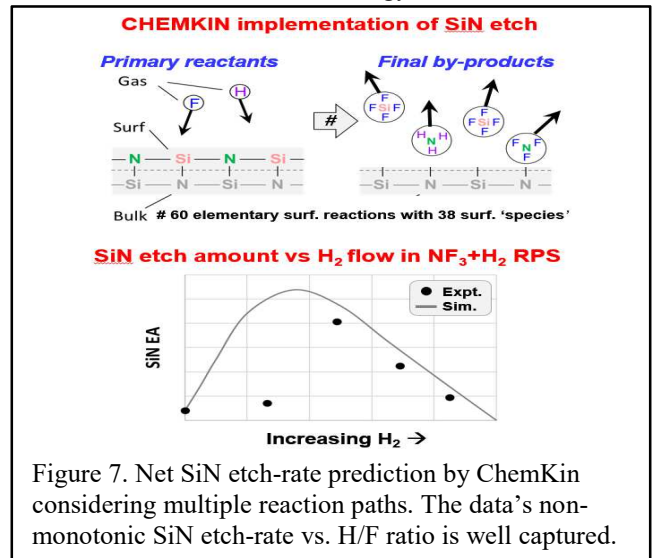
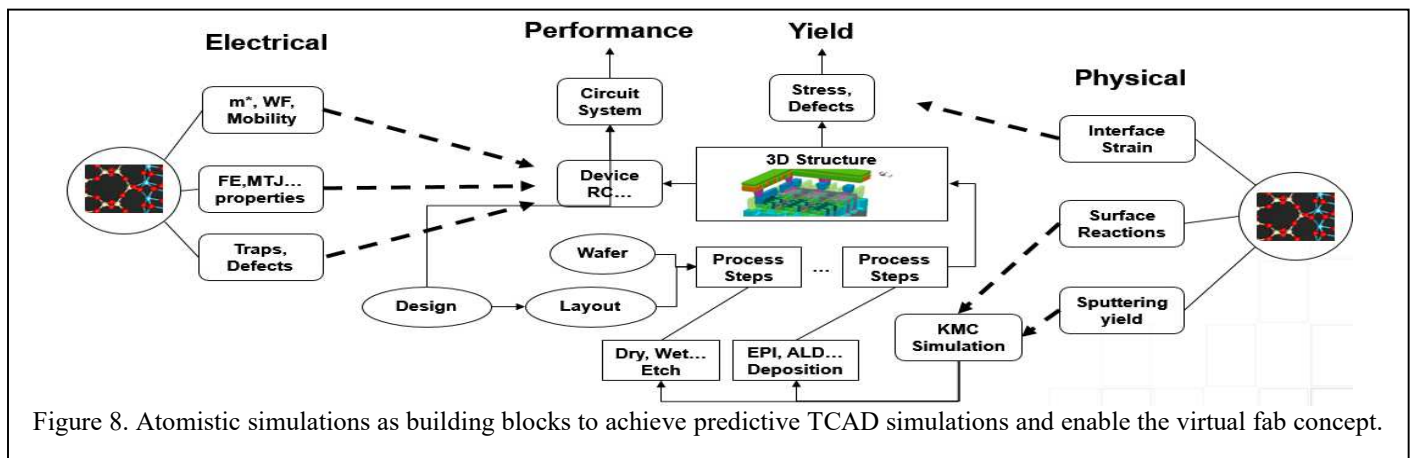


Figure 7. Net SiN etch-rate prediction by ChemKin considering multiple reaction paths. The data's non-monotonic SiN etch-rate vs. H/F ratio is well captured.

IV. ATOMISTIC SIMULATION INTEGRATION IN THE VIRTUAL FAB

TCAD has expanded way beyond its original scope of device-oriented simulations. Various components composing the full wafer flow, such as 3D structural evolution at various chip locations with different layouts can be predicted by emulating



the step-by-step process flow. The output of TCAD simulations can include not only transistors or electrical devices, but also any 3D structures covering interconnections at middle or back end of lines, full cell layout, and etc. The modeled steps composing the process flow are no longer limited to dopant diffusion, but expanded to cover deposition, etch and other structural modification processes. The comprehensive coverage of TCAD flow is only one of the foundations, predictive-ness is the other important basis for TCAD to enable the true virtual fab. As illustrated in Figure 8, atomistic simulations can be integrally employed to afford predictive-ness to various simulation components linking starting wafer to final chip's structural, yield and electrical performances.

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