

GPU Supported Simulation of Transition-Edge Sensor Arrays M. Lorenz¹,



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Abstract

We present simulation software utilizing graphical processing units (GPUs) for the physics of detectors based on arrays of transition-edge sensors (TES). With the support of GPUs it is possible to perform simulations of large pixel arrays, making the software a powerful tool in detector development. Comparisons with TES small-signal and noise theory confirm the representativity of the simulated data. In order to demonstrate the capabilities of this approach we present its implementation in xifusim, a simulator for the X-ray Integral Field Unit (X-IFU), a cryogenic X-ray spectrometer on board the future *Athena* X-ray observatory.

Introduction

TES Array Simulation



- The X-IFU instrument on board *Athena* will operate a large array of more than 3000 TES pixels [1, 2]
- To study and optimize the instrument performance during design we are developing xifusim, a simulator of the X-IFU detection pipeline (C++, Linux/macOS)
- Here we describe our implementation of the first module in the simulation chain, a **generic software** for the **simulation of TES pixel arrays** under incident radiation



- Input: Pixel parameters and list of photon impacts on the array
- Output: Current *I*(*t*) in each pixel during simulation interval
- Code numerically solves Eqs. (1) and (2)
- Photon absorption modeled as delta-function impulse
- Simulation includes various **noise sources**, modeled as Gaussian noise



Figure 3: Individual signals of a four pixel configuration during a 30 seconds simulation with random impacts, using the current best estimate X-IFU pixel parameters. Currents are flipped and normalized.

GPU Implementation

• Run time on single-core processor sufficient for small array simulations and



Figure 1: Data flow in xifusim. A list of photon impacts is propagated to the TES array where the pixel responses are calculated. Their signal is amplified in a set of SQUIDs, either using a simple, fast SQUID model or a model implementing the nonlinear SQUID response and baseband feedback. An Analog-Digital-Converter maps the measured current into a digital signal which is passed to a trigger that detects the individual pulses in the datastream and writes them to the output file.

Model Description

- We implement a generic mathematical model of the TES electro thermal system
- Evolution of temperature T(t) and current I(t) in a single TES pixel described by [3, 4]

$$C\frac{dT}{dt} = -P_{\rm b} + R(T, I)I^{2} + P_{\rm in} \quad (1)$$
$$L\frac{dI}{dt} = V - IR_{\rm L} - IR_{\rm TES}(T, I), \quad (2)$$

- Modular code design: Individual parts of the model can be exchanged or refined as needed
- Here: Assuming linear resistance model for $R_{\text{TES}}(T, I)$ surface and



Figure 2: The TES model we implement in our software, consisting of the Thevenin-equivalent representation of the bias circuit coupled to the TES.

- short time intervals
- To enable long simulations for large arrays with thousands of pixels like the X-IFU we also implement a GPU accelerated version of the code using the Nvidia CUDA platform [5]
- ⇒ Speedup by factor 3000 for full array – now five times faster than real-time



Figure 4: Run time comparison between singlecore and GPU accelerated version on an Nvidia GeForce GTX 1080 Ti for different array sizes simulated for one second each.

Verification of the Simulation Output

- Started investigating different means to verify our simulation output
- Power spectral density of current noise in simulation matches theoretical levels derived with linear equilibrium ansatz [3]
- We also find good agreement with small-signal approximation [3] of Eqs. (1) and (2) for low photon energies



Figure 5: Comparison between predicted and simulated noise levels. Included noise sources are

power-law dependence for $P_{\rm b}$

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 Comparisons with measured data will be performed next Johnson noise of the TES and load resistor, thermal fluctuation noise and noise from the bias line.



Figure 6: Pulse shape comparison between simulation and TES small-signall model [3] for different photon energies. The pulses match very well for small energies. For higher energies they start to deviate as expected due to the non-linearities in the system.