



# R&D activities

Overview and plan of work

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Geant4 Technical Forum

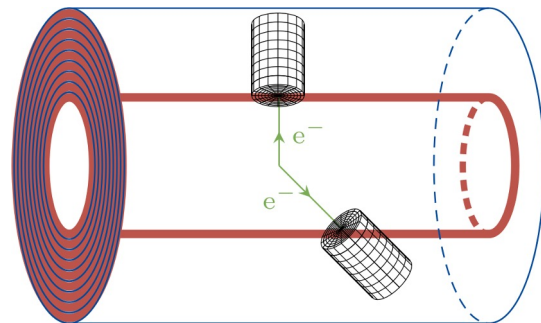
# Content

- fast simulation techniques
  - Machine-Learning based models
- exploration of new hardware (GPUs)
  - general transport code prototypes
  - domain specific application

# Fast Simulation: Overview 2022 (1/2)

## Geant4 example with ML fast sim model ([Par04](#))

- Example demonstrating use of ML models (inference within C++ framework)
- Inference libraries extended with LibTorch (additional to ONNX runtime, LWTNN)
- Used to produce EM shower data published on [zenodo](#)
- Work on optimisation strategies: [ACAT talk](#)
  - at training (parameter selection and visualization)
  - at inference (memory footprint)



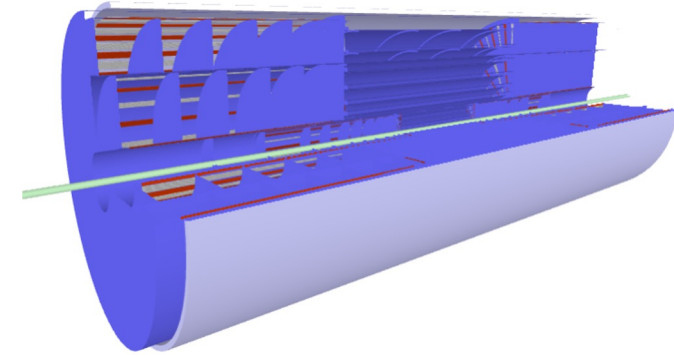
## MetaHEP

- Uses the same model architecture as in Par04
- Learning to learn approach (meta learning)
  - tested on simplistic calorimeters (Par04)
  - extended to realistic detectors (FCC-ee) [ACAT poster](#)
- Finalising paper in the Journal of Physics Letters B

## New ML architectures

- Exploration of transformers to build an accurate and general generative foundation model
- Collaboration with Openlab, CMS, and IBM
  - IBM expertise and (soon) resources
- First results discussed at [Workshop on Foundation Models for detector simulation](#)

# Fast Simulation: Overview 2022 (2/2)

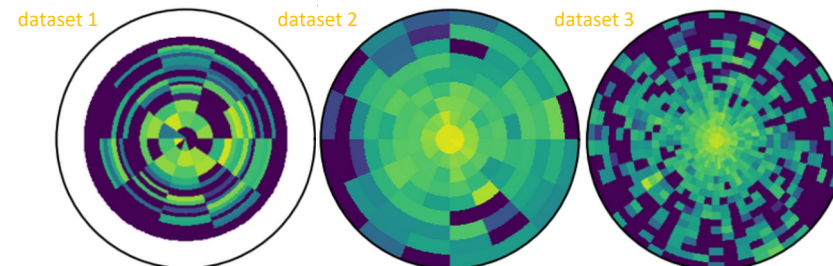


## CaloChallenge

- First fast calorimeter simulation ML challenge
- Aim: spur the development and benchmarking of ML fast shower models
- Introduces 3 datasets with increasing difficulty (dimensionality):
  - ATLAS open data [10.5281/zenodo.6234054](https://zenodo.org/record/6234054)
  - 2 granularities of EM showers produced with Par04 [10.5281/zenodo.6366270](https://zenodo.org/record/6366270) and [10.5281/zenodo.6366323](https://zenodo.org/record/6366323)
- First contributions were published and presented during ML4Jets conference

## Open Data Detector

- Benchmark detector for algorithmic studies
- Tracker is an evolution of a detector used in a Track-ML challenge
- Extension with EM calorimeter, performance tests in CI jobs completed



# Fast Simulation: Plans for 2023

## ML-based fast simulation

- Finalisation of **MetaHEP** paper, results
- Work on the new **generative foundation model**
- Focus on **accuracy of the model** (reference is our previous VAE included in Par04, and other existing models)
- Explore **quantitative metrics** for evaluating generated showers
- Checkpoint around CHEP (or mid-year) to determine status, accuracy of the model for high granularity calorimetry
  - if successful: (hopefully) continuation with several detectors, incl. LHC experiments
  - otherwise: review strategy, on-going activities/models in the community

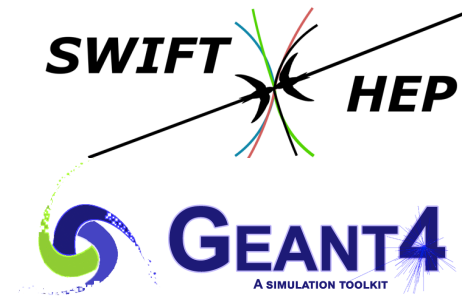
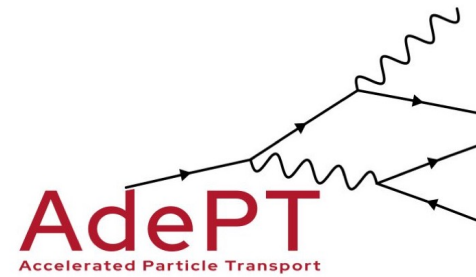
## Open Data Detector

- **Addition of HCal**, muon system for completeness
- Validation, documentation
- **Production and publication of Geant4 simulation data**, serving as input and benchmark to software algorithm development

## Geant4 code base (parameterisation)

- **Generalisation of GFlash** implementation using code developed for ML fast sim (common tools)
- **Updates to Par04 example** (realistic implementation of sensitive detectors)

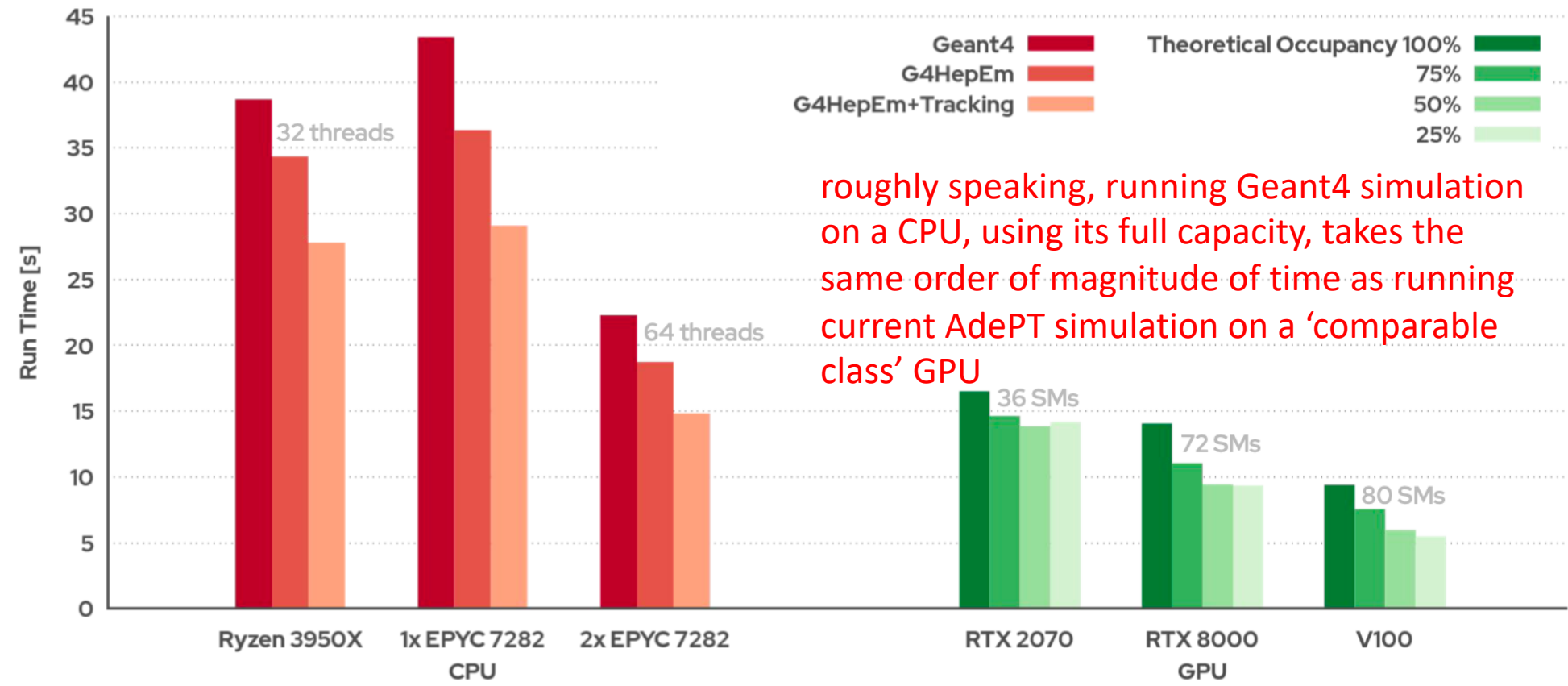
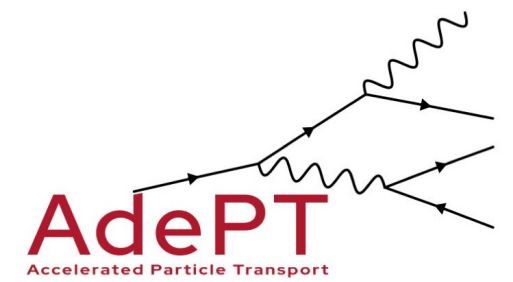
# AdePT 2022 status



- First prototype for e-, e+ and gammas shower on GPU presented and discussed at [HSF Detector Simulation on GPU Community Meeting](#)
  - Full set of interactions of e-, e+, gammas (implemented by **G4HepEm**)
  - Navigation in complex geometry models using **VecGeom** (from slabs to CMS, read from GDML)
  - Propagation of charged particles in a magnetic field using helix for constant B-field
    - first version of propagation in non-constant B-field available
  - Simple hit generation code, which is then transferred from GPU to host
  - HepMC interface for input events (Pythia, etc)
  - Implemented both **standalone** and **G4-integrated** workflows (using fast simulation interface)
- Performance studies
  - split kernels, refactoring, memory layout, etc, for smaller register footprint and better work balancing
  - main **performance bottleneck** - current geometry model

# CPU vs GPU Performance

(Sampling Calorimeter example)



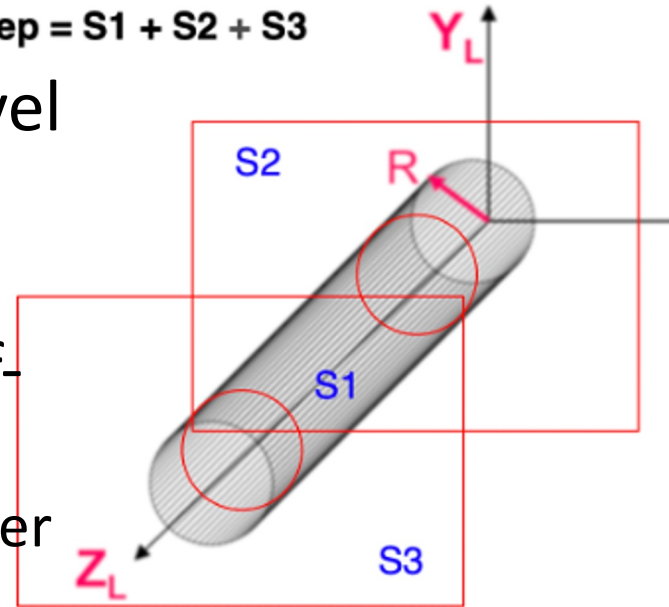
roughly speaking, running Geant4 simulation on a CPU, using its full capacity, takes the same order of magnitude of time as running current AdePT simulation on a 'comparable class' GPU

AMD Ryzen 3950X (16 cores, 32 threads, 3.5-4.7GHz), AMD EPYC 7282 (16 cores, 32 threads, 2.8-3.2GHz)

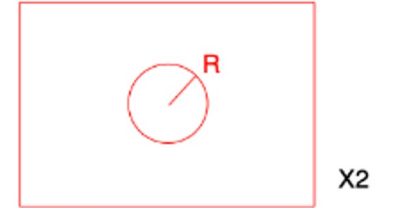
# Bounded surface modeling

- ▶ Decompose navigation at surface level
  - More simple and uniform code
  - Less branching/divergent sections
- ▶ Each face of a solid described as half-space + frame = **FramedSurface**
  - Accurate modeling (first + second order surfaces)
  - Frames defined in the simplest reference frame and carrying a transformation
- ▶ Carry hierarchy information for the object, mapping to the Geant4 geometry description

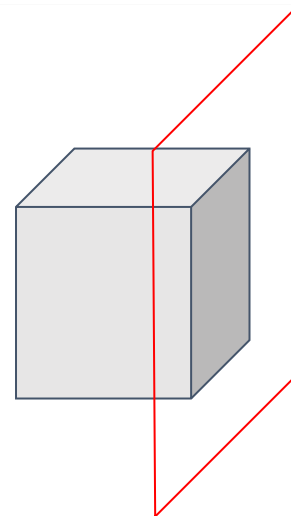
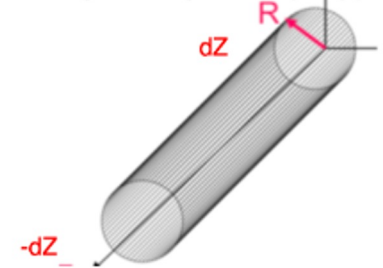
$$b\_rep = S1 + S2 + S3$$



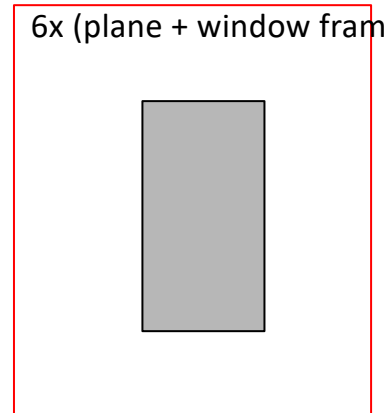
plane eq. + mask( $r < R$ )



cylinder eq. + mask( $abs(z) < dZ$ )



6x (plane + window frame)





# AdePT and GPU geometry 2023 plans

- validation and debugging of the current AdePT prototype
- non-constant magnetic field propagator with realistic (CMS) field map
  - validation and optimisation
- experimental AdePT integration into experiments' frameworks
- completion of the surface-based geometry model
  - support for all solid primitives
  - implementation of a complete demonstrator with AdePT and realistic geometry

# Celeritas: high-performance HEP detector simulation



- Motivated by HL-LHC computational challenges and by recent success in GPU MC (ECP ExaSMR)
- **GPU**-focused implementation of HEP detector simulation
- Multi-institution collaboration with external contributors (4–5 FTEs)
- Funded through US DOE ASCR/HEP (SciDAC 5, HEP base funding, leveraging ASCR ECP)

## *Core team:*

Philippe Canal (FNAL)  
Tom Evans (ORNL)  
Seth R Johnson (ORNL)  
Soon Yung Jun (FNAL)  
Guilherme Lima (FNAL)  
Amanda Lund (ANL)  
Paul Romano (ANL)  
Stefano Tognini (ORNL)

## *Active collaborations:*

Ben Morgan (Warwick)  
Geant4 SFT (CERN)  
Julien Esseiva (LBL)  
RAPIDS2 (ORNL)  
US CMS (FNAL)

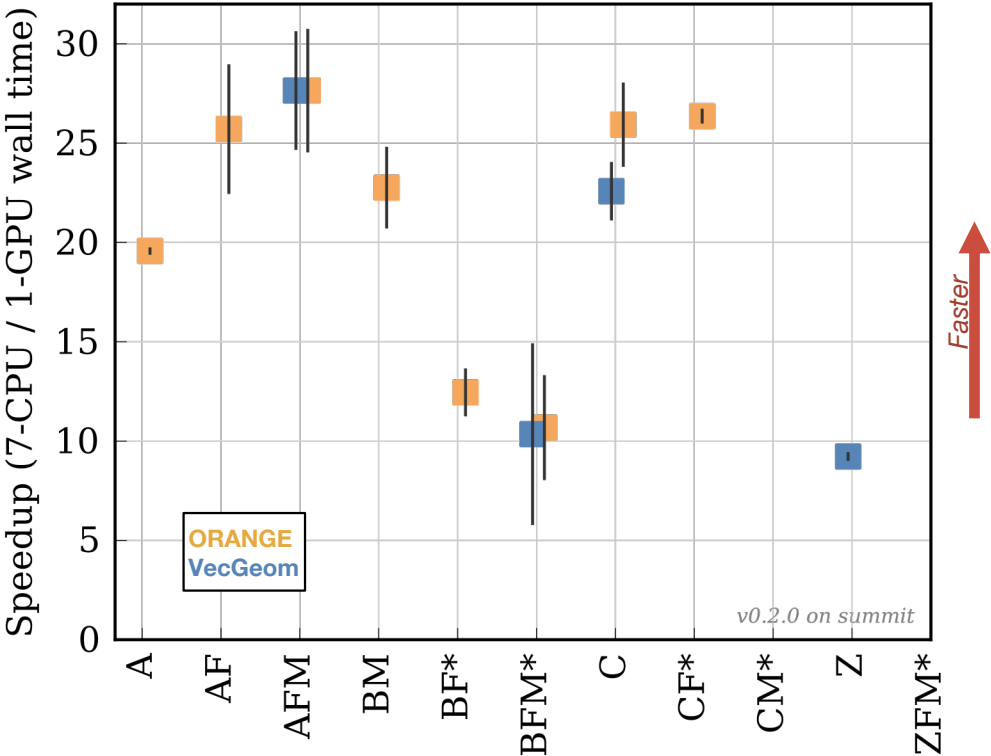
## *Upcoming collaborations:*

ATLAS, UKAEA, LZ,  
CalVision



# Celeritas: current capabilities

- Roughly 10–25× speedup for tested problems using Celeritas on GPU vs CPU on a full Summit node
- Good agreement with Geant4 for preliminary test problems (energy deposition and step length distributions)
- Support for standard EM physics, GDML geometry, magnetic fields
- “MC truth” output and other diagnostics
- Easy-to-use interface for integrating directly into Geant4 to offload EM tracks
- Version 0.2.0 released January 2023

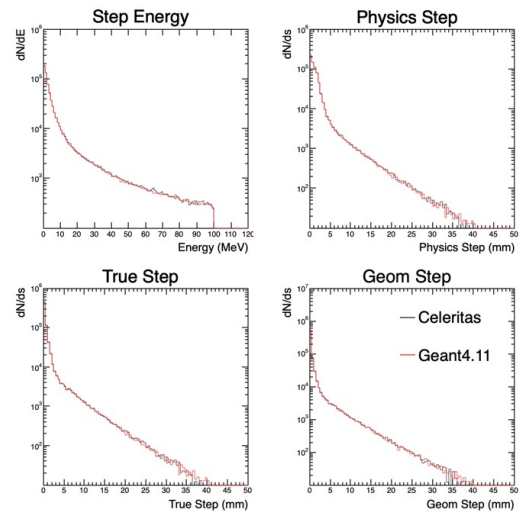


*Problem definition*

A	testem15
B	simple-cms
C	testem3
Z	cms2018

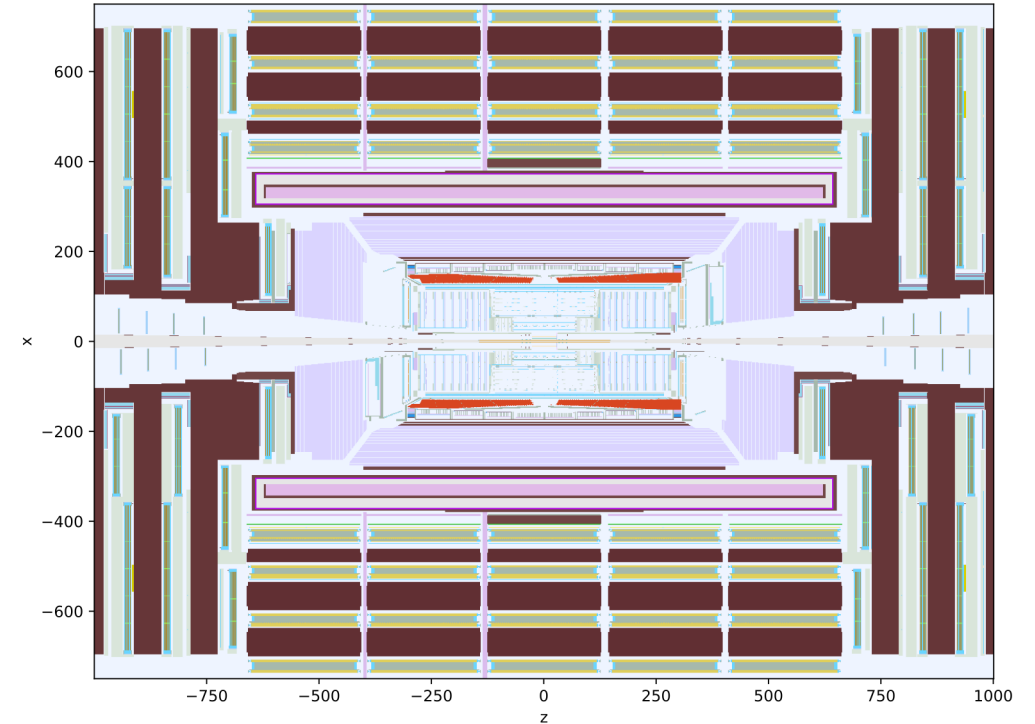
*Modifier*

F	1T field
M	MSC enabled
*	failures/unconverged



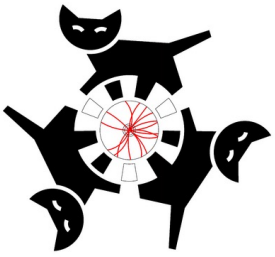
# Celeritas: near-term plans

- FY2023:
  - EM physics verification
  - Integration with CMSSW
  - Performance optimization
  - High-bandwidth MC truth (ADIOS)
- FY2024:
  - Photo/electro-nuclear physics
  - CMS readout optimization
  - Integration with ATLAS



*CMS ray-traced with Celeritas+VecGeom*

*Interested in trying Celeritas EM  
offloading with your Geant4  
application? Contact  
**johnsonsr@ornl.gov***



# Optical photon simulation on GPU using Opticks and CaTS

Opticks is an open-source project that accelerates optical photon simulation by integrating NVIDIA GPU ray tracing, accessed via NVIDIA OptiX.

Developed by Simon Blyth:

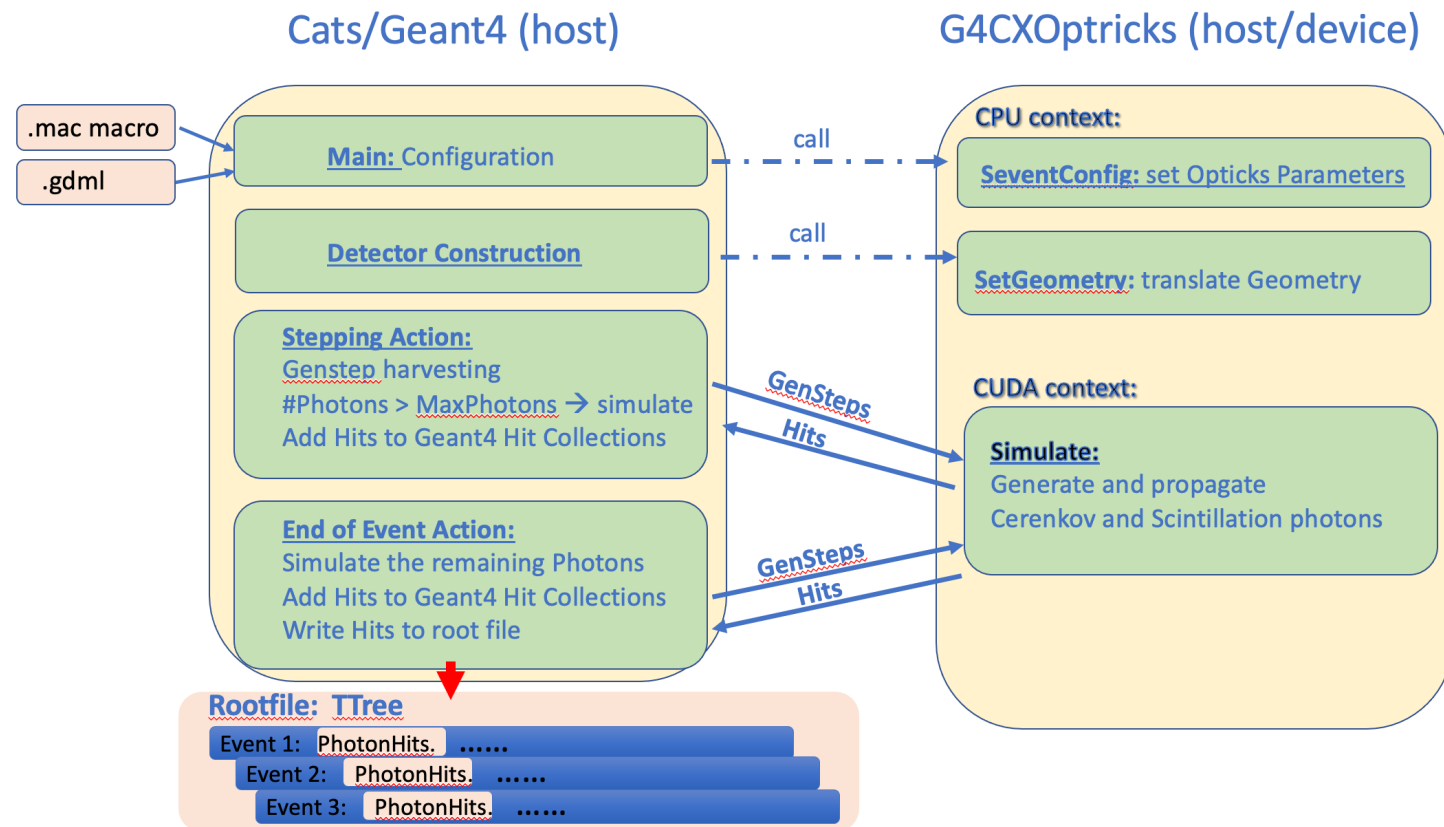
<https://bitbucket.org/simoncblyth/Opticks/>

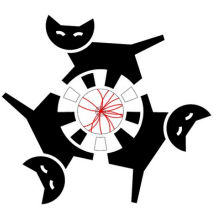
CaTS: interfaces Geant4 user code with Opticks using the G4CXOpticks interface provided by Opticks. It defines a hybrid workflow where **generation and tracing of optical photons is offloaded to Opticks (GPU), while Geant4 (CPU) handles all other particles**. CaTS was included in Geant4 11.0 as an advanced example:

<https://geant4.kek.jp/lxr/source/examples/advanced/CaTS/>

<https://github.com/hanswenzel/CaTS> (development)

CaTS workflow using the new version of Opticks based on OptiX (7.x):



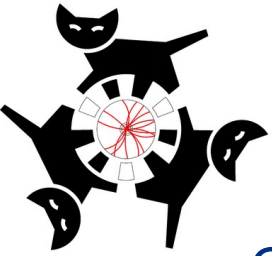


# Recent developments

Re-implementing Opticks for OptiX 7<sup>1)</sup> required huge changes due to the new and very different OptiX API (>7.) → So good time to rethink the simulation code. Goals of re-implementation : **flexible, modular GPU simulation, easily testable, less code.**

- COMPLETED: Full Simulation re-implementation for OptiX 7 API.
- Many packages were removed or are planned to be removed.
- Move code that doesn't require OptiX or Cuda out of GPU context.
- Rather monolithic .cu was replaced by small GPU+CPU headers.
- **CaTS has been modified to use the new Opticks** based on the new OptiX API. The CaTS workflow has been adjusted accordingly. User actions were utilized → no changes to Geant4 itself required.
- Very preliminary benchmarking results with the new workflow: ~ 200 fold speed up compared to single-thread Geant4 (11.0.p3). Results vary depending on geometry, photon yield, computing hardware ... Here:
  - Simple Geometry: Liquid Argon: 1x1x2 m<sup>3</sup>.
  - Photon yield: 50000  $\gamma$ /MeV.
  - Incident particle: single 2GeV electron.
  - CPU: Intel(R) Core i7-9700K 3.6GHz, GPU: GeForce RTX 2070.

<sup>1)</sup>[https://simoncblyth.bitbucket.io/env/presentation/Opticks\\_20220718\\_towards\\_production\\_use\\_juno\\_collab\\_meeting.html](https://simoncblyth.bitbucket.io/env/presentation/Opticks_20220718_towards_production_use_juno_collab_meeting.html)



# Plans

## CaTS:

- Make the latest developments and documentation available in the Geant4/CaTS advanced example.
- Achieve true concurrency by using G4Tasking. Allow to configure jobs to fully utilize CPU and GPU resources.
- Change to use in-memory Root file merging (TBufferMerger) when using multi-threading.

## G4CXOpticks/Opticks:

- Use the same implementation of the scintillation process on CPU (Geant4) and GPU (Opticks), use the same optical properties/keywords.
- Implement Wavelength shifting process (WLS).

## Integration of Opticks with experimental frameworks:

- Starting with framework used by liquid Argon TPC community.

# Conclusion

- progress along all ongoing R&D directions
- ML-based models getting more matured with more advanced techniques involved
  - general approaches applicable to different detectors now available
- GPU-based prototypes providing valuable insights into their application for general HEP transport
  - several bottleneck identified and are in the plan of work for next year
- specializes GPU applications (optical photons) showing excellent results