Motivation was reconstruction in Cherenkov detectors:  $L(x,y,z,t,\vec{p},ID) \sim \prod_{i=1}^{N_{PMT}} p_i(t_i^{res},Q_i \mid x,y,z,t,\vec{p},ID)$ Why not use complete MC simulation to generate p<sub>i</sub>s?

i.e., for a hypothesized x,y,z,t,p,ID simulate N complete events and tally up the  $p_i$  based on MC prediction

Then fitter moves along in the 7 dimensions (for a given ID) and tries a new point in that space and continues until L is maximized...

This should in principal be the best one could do. But

- Waaaay too slow: I event would take ~few years
- Likelihood space is stochastic---how to find minimum?



Chroma is a GPU-accelerated raytracer and Monte Carlo photon simulation written in a mixture of Python and CUDA:

- Uses GEANT4 or your own software to create initial photon vertices. (Included generator does Cherenkov light; bolt on your own for other light production.)
- Up to 200x faster than GEANT4 at simulating I GeV electrons in an LBNE-sized detector. (millions of photons steps/sec)
- Designed to be used either as a library for other Python applications, a server for communication with existing C++ programs, or standalone use.



Can be used for many things:

- An interactive 3D geometry exploration and event visualization application.
- A standalone Monte Carlo simulation of electrons, muons, and  $\pi_0$  events.
- A "Monte Carlo photon propagation server" that can be used by existing GEANT4-based simulations.
- A PDF generation tool
- A time/hit likelihood calculator
- Hypothesis testing of hit patterns

S. Seibert

To win 200x in photon propagation, we had to combine two different lines of technological development:

• Better software: Computer graphics researchers have developed many techniques for efficiently tracing the paths of photon rays. These techniques focus on *surfaces*, rather than *solids*.

Existing rendering libraries try to avoid physics whenever possible! Can't just download Blender/Maya/POV-Ray...

 Better hardware: Standard graphics processing units (GPUs) are now fully programmable, massively parallel vector machines. Moreover, the exponential growth of computing power in GPUs is currently faster than CPUs.
S. Seibert

<u>Very</u> fast photon ray-tracing using graphics cards (GPUs)

To make this work, Seibert and LaTorre had to re-invent the way geometry is handled in particle physics simulations



`Triangle mesh' surfaces (CAD) rather than volumes (GEANT4)

#### Chroma Ray Tracer Describing detectors is relatively easy:



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## Inside 140 t dark matter detector

Side benefit: very nice detector displays....





#### Side benefit: very nice detector displays....







#### With `physics' turned on:



This is not what your videogame or (probably) CAD program does

- "Ultra-fast" ray-tracing opens up new possibilities for photon-based detectors:
  - Fast simulations
  - MC-based reconstruction
  - Interactive event displays
  - Very fast design optimizations
- Has been made to work in RAT (as a ray-tracing "engine")
- Other experiments already using this, including LAr-TPCs, LXe  $0\nu\beta\beta$ , LS
- Open source including documentation!

# http://chroma.bitbucket.org

**Reconstruction/Simulation**  
$$L(x, y, z, t, \vec{p}, ID) \sim \prod_{i=1}^{N_{PMT}} p_i(t_i^{res}, Q_i | x, y, z, t, \vec{p}, ID)$$

#### But still:

Stochastic Gradient Descent (`Fuzzy Fitter') by Seibert

