

# Status of GERDA, LEGEND and BAT

Oliver Schulz

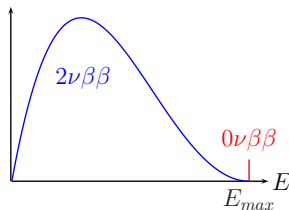
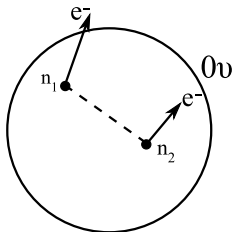
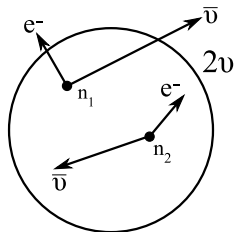


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MPP Project Review, December 14, 2020

## $0\nu\beta\beta$ Decay, very short recap

- ▶ Single  $\beta$  decay not allowed for some isotopes, only double  $\beta$  decay
- ▶ Also  $0\nu\beta\beta$  decay, due to Majorana- $\nu$  ( $\nu = \bar{\nu}$ )?



$$(T_{1/2}^{0\nu})^{-1} = G(Q, Z) |M_{\text{nucl}}|^2 \langle m_{ee} \rangle^2$$

- ▶ Discovery of  $0\nu\beta\beta$  decay would
  - ▶ Imply lepton-number violation
  - ▶ Tell us about nature of  $\nu$  (Majorana component?)
  - ▶ Give information about absolute Neutrino mass / hierarchy?

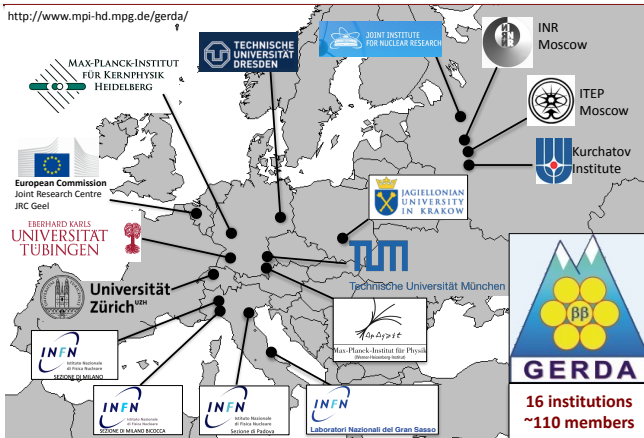
# Low-Background Challenge

- ▶ Expected  $0\nu\beta\beta$  decay half lives very long ( $\geq 10^{26}$  years):  
[Agostini et al., Phys. Rev. D 96, 053001 (2017)],  
[Caldwell et al., Phys. Rev. D 96, 073001 (2017)]
- ▶ Ideal experiment (almost) background-free:  
< 1 counts within 1 FWHM of  $Q_{\beta\beta}$  up to design exposure
- ▶ Need
  - ▶ underground location
  - ▶ excellent shielding
  - ▶ radio-pure materials
  - ▶ good energy resolution
  - ▶ high source mass
- ▶ For sensitivity  $10^{28}$  yr:  
need < 1 event per 10 years per ton of detector

# The GERDA Experiment

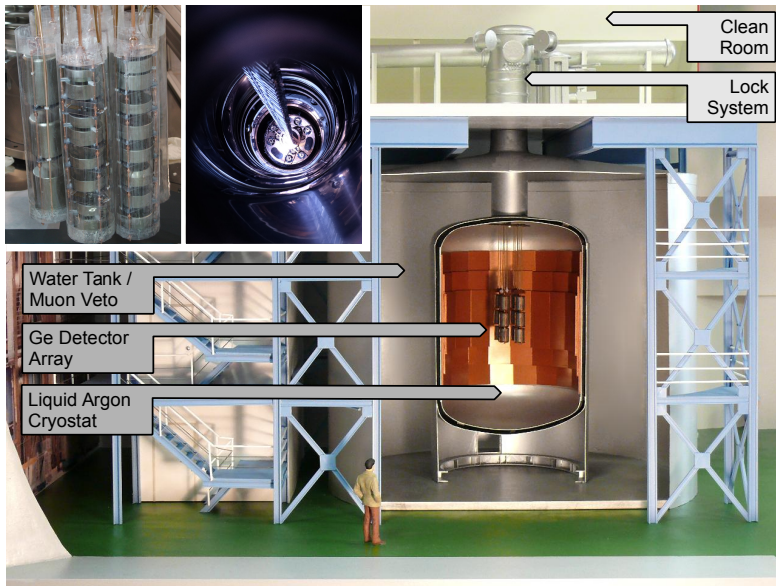
- ▶ Search for  $0\nu\beta\beta$  decay in  $^{76}\text{Ge}$  at  $Q_{\beta\beta} = 2039$  keV
- ▶ Array of isotopically enriched HPGe detectors, suspended in liquid argon
- ▶ Ultra-low background setup, located underground at LNGS (1400 m rock overburden, 3500 m water equivalent)
- ▶ Phase I from 2011 to 2013
- ▶ Phase II: Increased target mass (BEGe detectors), lower background, active LAr veto, from 2015 to 2019
- ▶ Current status: Transfer of infrastructure to ...
- ▶ ... successor: LEGEND-200

## The GERDA Collaboration

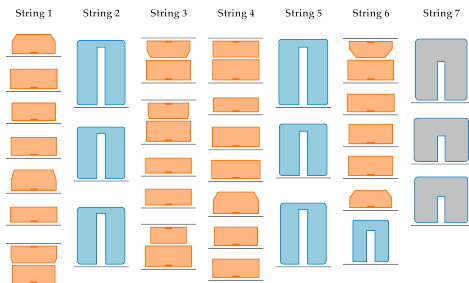
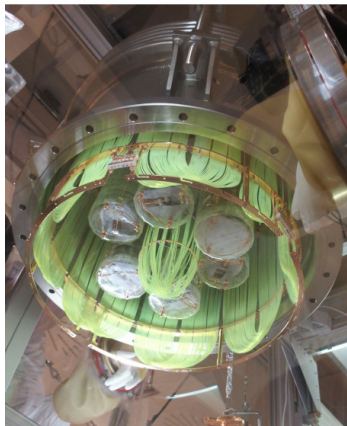


- MPP GERDA Group: B. Majorovits (group leader), F. Fischer, L. Manzanillas, O. Schulz, A. Zsigmond

# GERDA (and future LEGEND-200) Setup

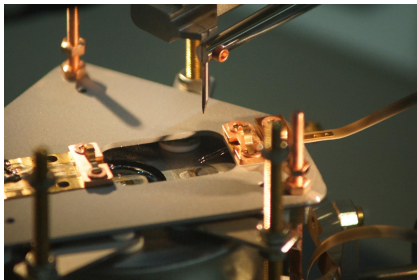


# Final GERDA Phase-II Detector Array



- ▶ 7 string, 40 detectors in total:
  - ▶ 7 enriched coax-type (15.8 kg)
  - ▶ 30 enriched BEGe-type (20 kg)
  - ▶ 4 enriched IC-type (9.5 kg)
- ▶ Array enclosed by LAr veto

# Radiopure Detector Surroundings

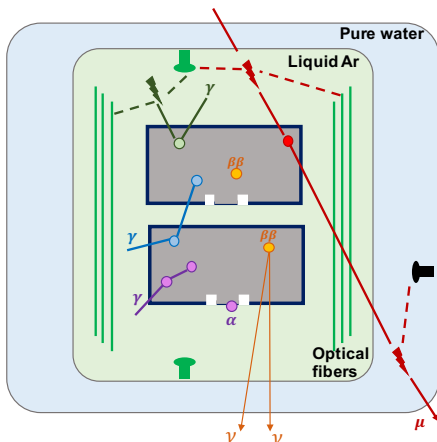


- ▶ Lightweight detector holders, built from monocrystalline silicon and OFC copper
- ▶ Detectors contacted by wire-bonding
- ▶ Holders connected to form strings



# Background Reduction Strategy

$\beta\beta$  decay signal:  
single energy  
deposition in  
a  $1\text{ mm}^3$  volume



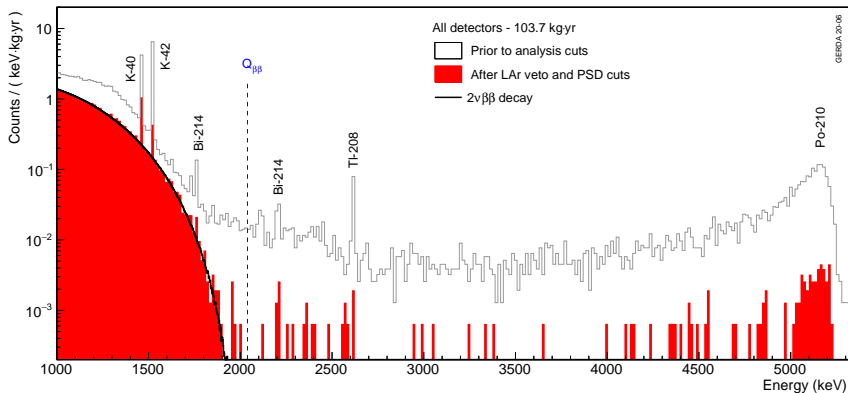
Pulse shape  
discrimination (PSD)  
for multi-site and  
surface  $\alpha$  events

Ge detector  
anti-coincidence

LAr veto based on Ar  
scintillation light read  
by fibers and PMT

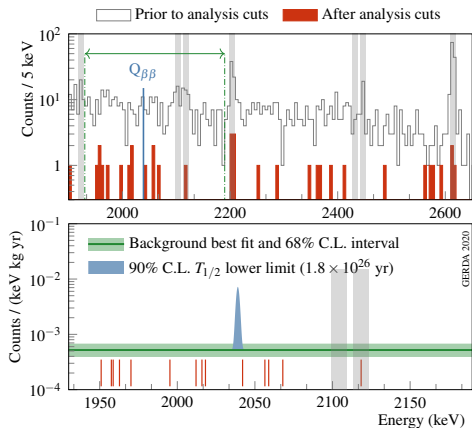
Muon veto based on  
Cherenkov light and  
plastic scintillator

# GERDA Background Reduction Efficiency



- After LAr veto and PSD, unprecedented low background in ROI:  $\approx 5 \times 10^{-4}$  cts/(keV·kg·yr)

# Final GERDA Result



Phase I plus Phase II:

- ▶ Total exposure: 127.2 kg yr
- ▶  $T_{1/2}^{0\nu} > 1.8 \times 10^{26}$  yr (Frequentist)
- ▶  $T_{1/2}^{0\nu} > 1.4 \times 10^{26}$  yr (Bayesian, using BAT.jl)

(all limits: 90% CL/CI)

Accepted Paper

Final results of GERDA on the search for neutrinoless double- $\beta$  decay

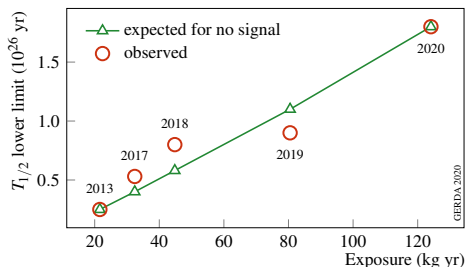
Phys. Rev. Lett.

M. Agostini et al.

Accepted 11 November 2020



# GERDA Summary

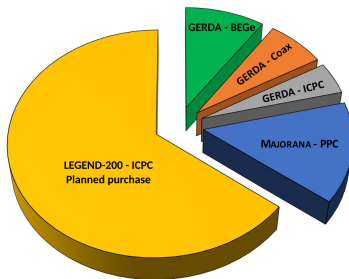


- ▶ 2013: PRL 111 (2013) 12, 122503
- ▶ 2017: Nature 544 (2017) 47
- ▶ 2018: PRL 120 (2018) 13, 132503
- ▶ 2019: Science 365 (2019) 144
- ▶ 2020: PRL, release imminent

(all limits: 90% CL/CI)

- ▶ Total exposure 127.2 kg yr
- ▶ World-record low background:  $\approx 5 \times 10^{-4}$  cts/(keV·kg·yr)
- ▶ Limit on  $0\nu\beta\beta$ :  $T_{1/2}^{0\nu} > 1.8 \times 10^{26}$  yr
- ▶ Surpassed design goals
- ▶ Time for the next step in the story ... LEGEND-200

# Changes from GERDA to LEGEND-200



- ▶ Increased detector mass: GERDA + MAJORANA + new
- ▶ ROI background target:  $< 0.6 \text{ cts}/(\text{FWHM t yr})$
- ▶ Use ultra-pure electroformed copper
- ▶ Low-mass electronics frontend on detector holders
- ▶ New lock system and cables
- ▶ Detector holders made from PEN (led by MPP)

# LEGEND-200 Status of Preparations

- ▶ Fully funded
- ▶ Have most of enriched Ge already in hand
- ▶ Detector production and characterization underway  
goal 140 ICPC detectors, first detectors delivered
- ▶ LNGS infrastructure transferred, water tank drained
- ▶ Cryostat, lock and cleanroom modifications under way
- ▶ Post-GERDA-tests finished: Feb. to August 2020, max 17 detectors (Majorana PPC and L200 ICPC, 15 operational), yielded valuable insights
- ▶ Intense MC simulation campaign ongoing
- ▶ New analysis software stacks in Python and Julia (complementary)
- ▶ With luck, might be able to start (partial) operation in late 2021

# New technology: Scintillating PEN



- ▶ Polyethylene Naphthalate (PEN) is both a scintillator and wavelength-shifter, emits blue light (around 450 nm)
- ▶ Mechanically strong and cryo-compatible
- ▶ Injection molding allows (almost) arbitrary shape
- ▶ Good radiopurity plus self-vetoing
- ▶ LEGEND-200: Detector holders made from PEN replace GERDA silicon plates
- ▶ LEGEND-1000: Detector encapsulation in PEN?
- ▶ Concept of PEN in LEGEND originated at and led by MPP

# PEN in LEGEND-200 and at MPP



- ▶ PEN detector holders successfully deployed in post-GERDA-tests
- ▶ Detailed scans of test holders at MPP, crucial for accurate L-200 simulation
- ▶ MPP coordinates PEN holder production

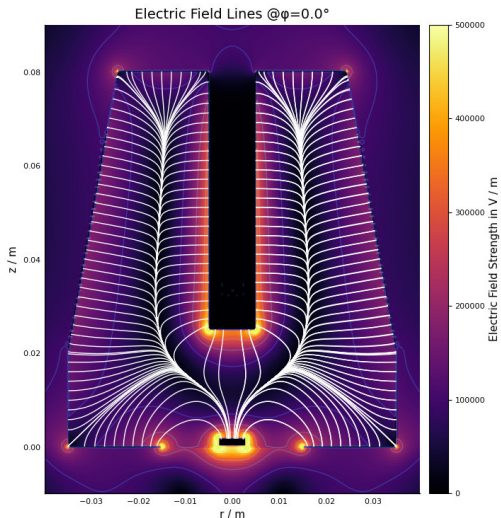


# HPGe Detector Simulation



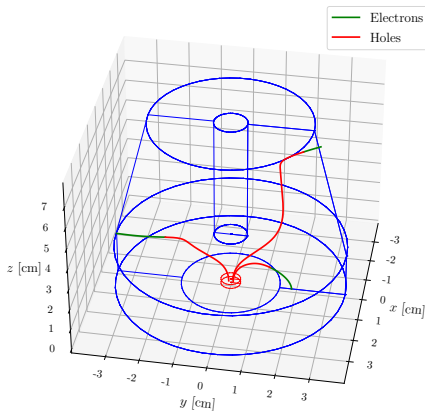
- ▶ LEGEND goals require ultra low background and advanced PSD, confidence in results will depend on quality of detector simulation
- ▶ Novel HPGe detector simulation framework SolidStateDetectors.jl (SSD), developed at MPP, written in Julia
- ▶ Uses multi-threading and SIMD parallelization
- ▶ Takes detector environment into account, supports arbitrary detector geometries and segmented contacts
- ▶ Ongoing developments: GPU support, charge diffusion, self-repulsion, advanced visualization

# SSD Detector Field Calculation



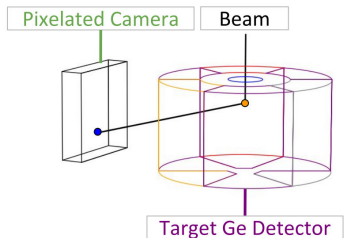
- ▶ Only free 3D package that can simulate environment beyond detector boundaries

# SSD Charge Drift Simulation



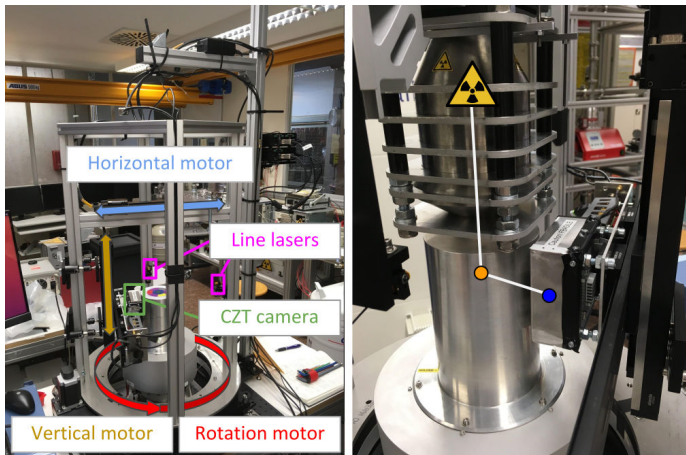
- ▶ 3D electron and hole charge drift simulation
- ▶ Modular design, can study different drift models
- ▶ HPGe detectors are complex beasts - how to check if we're right?

# Detector Compton Scanning at MPP



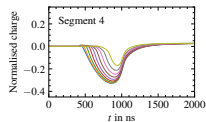
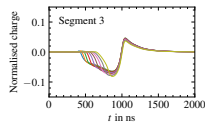
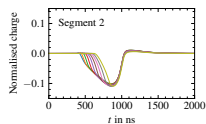
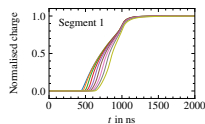
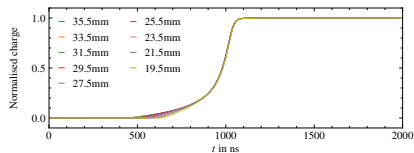
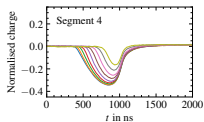
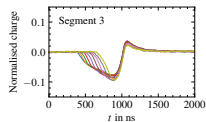
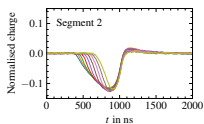
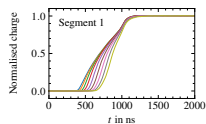
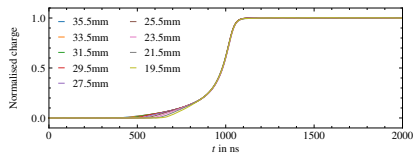
- ▶ Want to measure detector signals with known interaction point
- ▶ Common approach: Strong collimated  $\gamma$ -source,  $90^\circ$  Compton scattering with collimator, very low efficiency
- ▶ MPP compton scanner uses pixelated CdZnTe detector as Compton camera as sensor, no collimator
- ▶ Not limited to  $90^\circ$  scattering, increased efficiency

# Detector Compton Scanning at MPP



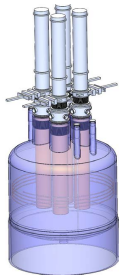
- ▶ 740 MBq Cs-137 Source, collimated to 1 mm over 100 mm, 2-3 kHz event rate in detector
- ▶ Motorized rotary and linear stages for automated scanning

# Compton Scanning and SSD Simulation

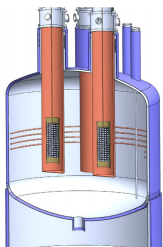


- ▶ Starting to achieve very good match between Compton Scanner data (left) and SSD simulation (right)
- ▶ Gives us access to charge carrier mobilities, crystal axes effects, drift temperature dependence, and detector bulk impurity density

# LEGEND-1000



- ▶ Aim: 10 ton-years exposure with 1 ton detector mass to reach  $10^{28}$  year limit,  $< 0.1$  cts/(FWHM t yr) in ROI
- ▶ Baseline design: 4 arrays (payloads) in reentrant tubes filled with depleted Ar
- ▶ DOE portfolio discussion April 2021 (LEGEND, NEXO, CUPID)
- ▶ Host lab: Several options (e.g. SNOLAB or CJPL) but politics will play a role
- ▶ MPP involvement: PEN encapsulation and PEN vessels for payloads with frozen Argon
- ▶ Larger MPP commitments depend on future structural decisions at MPP



# LEGEND Summary

- ▶ LEGEND-200 fully funded, detector production and installation preparations under way
- ▶ Important contributions from MPP: PEN technology, detector studies, Julia software including (SSD)
- ▶ LEGEND-1000 pCDR close to final
- ▶ LEGEND at MPP:
  - ▶ MPP Project lead: I. Abt, also LEGEND institute-board and speakers-bureau chair
  - ▶ Ge detectors and simulation:  
C. Gooch, F. Hagemann, L. Hauertmann, X. Liu, O. Schulz, M. Schuster, A. Zsigmond, D. Hervas (guest for a year)
  - ▶ PEN L200/R&D:  
F. Fischer, M. Guitart, B. Majorovits, L. Manzanillas, O. Schulz
  - ▶ We thank the workshops for all their support!



# The Bayesian Analysis Toolkit (BAT)

- ▶ Software package for Bayesian inference
- ▶ Typical tasks: Given a set of data and prior knowledge
  - ▶ estimate parameters
  - ▶ compare models (Bayes factors)

according to Bayes theorem

$$P(\vec{\lambda}|\vec{D}) = \frac{P(\vec{D}|\vec{\lambda})P_0(\vec{\lambda})}{\int P(\vec{D}|\vec{\lambda})P_0(\vec{\lambda}) d\vec{\lambda}}$$

- ▶ Functionalities
  - ▶ Posterior space exploration via Markov chain Monte-Carlo (MCMC)
  - ▶ Integration of non-normalized posterior (i.e. evidence calculation)
  - ▶ User-friendly plotting and reporting

# BAT.jl, the new BAT

- ▶ Original: BAT-C++, developed at MPP
- ▶ Very successful over the years, > 250 citations (INSPIRE)

[Caldwell et al., DOI: 10.1016/j.cpc.2009.06.026 (2009).]

- ▶ Written in C++, based on CERN ROOT
  - ▶ Proven in many real-life use cases
  - ▶ Wide user base, esp. in high-energy, nuclear and astro-physics
- ▶ By now reached flexibility limit of original software design
  - ▶ Started complete re-design in 2017
  - ▶ Successor: BAT.jl, written in Julia. Team:
    - ▶ MPP (A. Caldwell): O. Schulz (project lead), V. Hafych, S. Hayashi, L. Shtembari
    - ▶ TU-Dortmund (K. Kröniger): C. Grunwald, S. Lacagnina
    - ▶ ORIGINS ODSL: F. Capel, P. Eller, J. Knollmüller

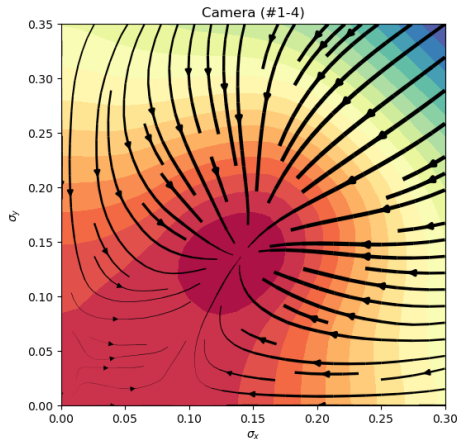
# Design goals for new version of BAT

- ▶ Core philosophy: User provides likelihood (typically expensive, high data volumes, etc.)  
BAT does the rest
- ▶ Easy to use with defaults, but allow for detailed fine-tuning
- ▶ Multiple MCMC algorithms (BAT-C++ only supports Metropolis-Hastings)
- ▶ Deep support for parallel operation:
  - ▶ Parallelize both likelihood and MCMC chains
  - ▶ Local (multiple threads) plus distributed (compute clusters)
- ▶ Auto-differentiation for mode-finding, HMC, etc.
- ▶ Choice of programming language?

# BAT.jl Features

- ▶ MCMC sampling via Metropolis-Hastings, Hamiltonian Monte Carlo, Sobol and importance sampling
- ▶ New ARP sample weighting scheme
- ▶ Posterior integration with novel AHMI algorithm (Caldwell et. al, MPP) and Cuba (T. Hahn, MPP)
- ▶ Automatic space transformations cast target density into space suitable for algorithm
- ▶ Julia brings auto-differentiation, excellent package management and unmatched code composability via multiple dispatch (and much more)
- ▶ Released BAT.jl version 2.0 last night.
- ▶ <https://github.com/BAT/BAT.jl>

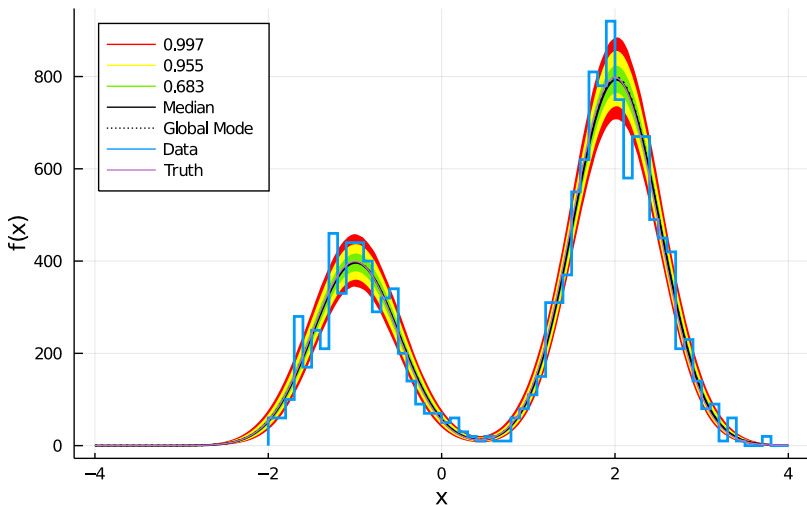
# Auto-Differentiation in Julia



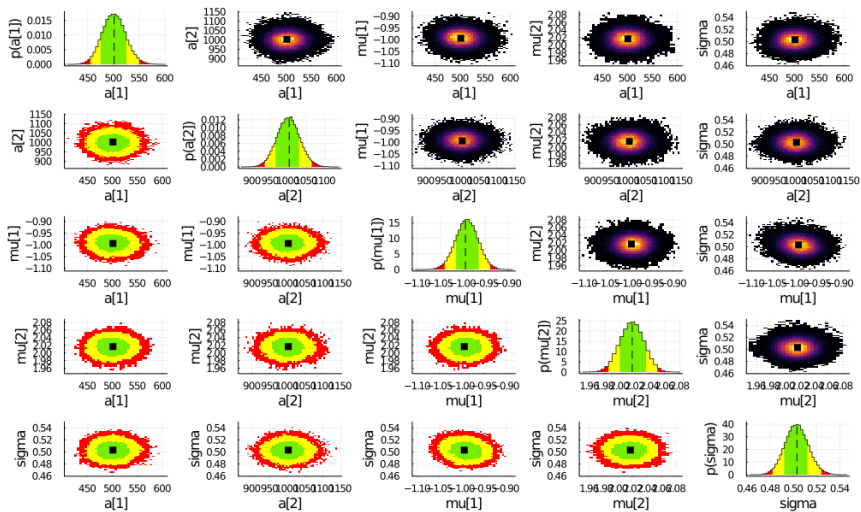
Julia powerful enough to auto-diff (almost) arbitrary code.  
Example above: Complex posterior for AWAKE, likelihood  
uses image processing and lookup tables.

# Simple BAT.jl example: Histogram Fit

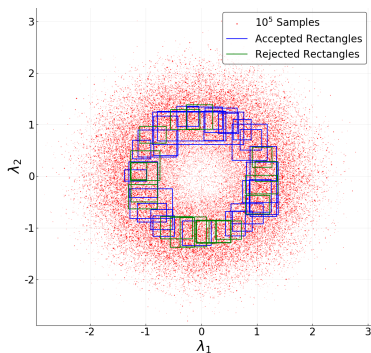
## Data, True Model and Best Fit



# BAT.jl plotting: Posterior projections



# Adaptive Harmonic Mean Integration (AHMI)



- ▶ Computes posterior integral/evidence from samples via harmonic mean [Int.J.Mod.Phys.A 35 (2020) 24, 1950142]
- ▶ Operates in hyper-rectangles with limited posterior variance to control integral variance

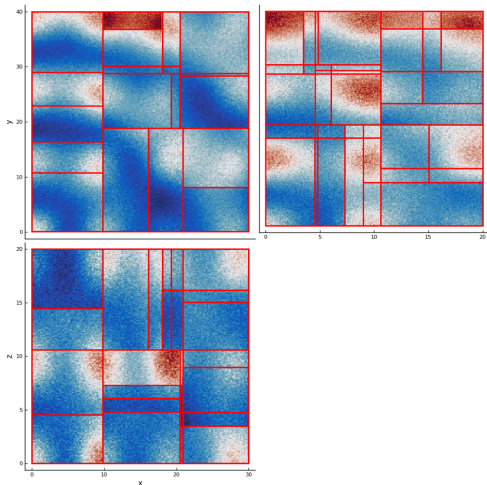


# Parameter space partitioning (Experimental)

- ▶ MCMC expensive, need maximum parallelization
- ▶ Parallelization potential of likelihood often limited
- ▶ Increasing number of chains doesn't help (burn-in cost)
- ▶ New concept: partition parameter space  
run separate set of chains in each subspace
- ▶ Rationale: posterior in small subspaces simpler,  
fast burn-in
- ▶ Challenge: find good partitioning for given posterior,  
work in progress

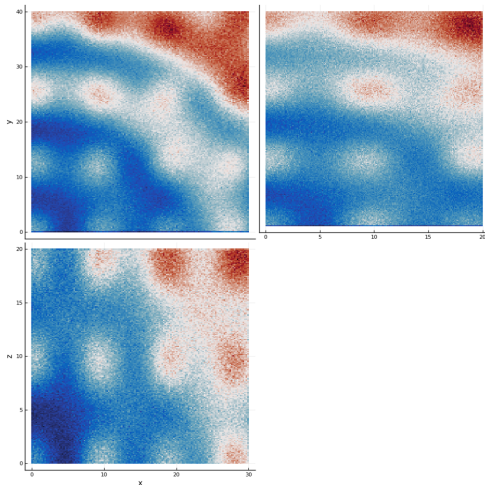
[arXiv:2008.03098]

# Parameter Space Partitioning, Raw



- ▶ Subspaces contains unequal probability mass:  
can't just stitch MCMC results together

# Parameter Space Partitioning, Reweight



- ▶ Solution: Use AHMI to integrate posterior in each subspace, then reweight by integral

# BAT Summary

- ▶ BAT concept:  
user brings domain knowledge and likelihood,  
BAT provides robust sampling, integration and visualization
- ▶ Current BAT (C++) is a success story,  
but flexibility limit reached
- ▶ Just released BAT.jl (Julia) v2.0,  
focus on ease of use, parallelization and modern algorithms
- ▶ Future improvements: Lot's of ideas, also interesting  
computing/numerical technology on the horizon