







### GooStats,

### a GPU-accelerated package for multi-variate spectral fitting analysis

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# What is GooStats?

GitHub, Inc. [US] https://github.com/GooStats/GooStats

E README.md

### GooStats

#### ⁰ GooStats is an open source statistical analysis framework using GPUs.

- It provide handful tools to configura input parametrs, datasets, spectrums, pdfs etc.
- It also provide flexible text/plot/TTree output class.
- The backend is GooFit on nVidia GPU, and the code is tuned and validated on GPU.

### With a few lines of code, you will be able to use GooFit as low level engine and produce nice plots

- with a few more lines, you will be able to do joint analysis of multiple datasets.
- Look at Modules/naive-Reactor as an example.
- Here are some screen shots of the text/TTree output and plot produced, as well as user code.



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### Example output

### pdf-format output



root [1] .ls TFile\*\* test\_tree.root TFile\* test\_tree.root Fit result of GooStats KEY: TTree fit\_result;1 root [2] fit\_result->Show(0) ====> EVENT:0 default.NReactor = 3.02987 $default.NReactor\_err = 0.0159146$ default.Nbkg = 1.02405 $default.Nbkg_err = 0.0162459$ default.U235 = 0.5default.U235 err = 0default.U238 = 0.2 $default.U238\_err = 0$ default.Pu239 = 0.1default.Pu239\_err = 0default.U241 = 0.2default.U241\_err = 0default.LY = 1300default.LY\_err = 0default.qc1 = 2.78788 $default.qc1_err = 0$ default.qc2 = -0.528003 $default.qc2_err = 0$ default.v1 = 0.3default.v1\_err = 0 default.vT = 5  $default.vT_err = 0$ default.Reactor\_dEvis = 1078.28 $default.Reactor_dEvis_err = 13.2291$ chi2 = 390.448NDF = 397likelihood = 1883.96

TTree-format output

SCHOOL OF ADVANCED STUDIE



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## Example output

		Checking GPU [0]/[2]
		Running on [Tesla K20m] with compute capability of 3.5
		Warning: ParSyncManager not set, default strategy are used.
FIT PARAMETERS		Warning: RawSpectrumProvider not set, default strategy are used.
NReactor = 3.030 #pm 0.016 cpd/ktons Nbkg = 1.024 #pm 0.016 cpd/ktons ^{235}U = 0.5 [Fixed]		Loading from <ibd.cfg></ibd.cfg>
		********Dump options parsed************************************
		EvisVariable => <p.e.></p.e.>
		Evis_max => number: [11000]
$\sqrt{230}U = 0.2$ [Fixed]		Evis_min => number: [800]
^{239}Pu = 0.1 [Fixed]		Evis_nbins => number: [400]
^{241}U = 0.2 [Fixed]		Huber_Pu239_0 => number: [1.162]
LY = 1300 [Fixed]		Huber_Pu239_1 => number: [-0.392]
$^{1}ac = 2.78788$ [Fixed]		Huber_Pu239_2 => number: [-0.079]
$\sqrt{2}ac = -0.528003$ [Fixed]		Huber_Pu241_0 => number: [0.852]
(2) qc = -0.528005  [Fixed]		Huber_Pu241_1 => number: $[-0.126]$
$^{1}v = 0.3$ [Fixed]		Huber_Pu241_2 => number: [-0.1037]
vT = 5 [Fixed]		Huber_U235_0 => number: $[0.904]$
Reactor dEvis = 1078.3 #pm 13.2		Huber_U235_1 => number: $[-0.184]$
		Huber_U235_2 => number: $[-0.0878]$
chi∧2	- 390 4	Huber_U238_0 => number: $[0.976]$
chi A2 /NL DOE	0,025	Huber_U238_1 => number: $[-0.162]$
CITE/2/N-DOP	= 0.9855	Huber_U238_2 => number: $[-0.079]$
p-value	= 0.583	$LY_{err} => \langle 0 \rangle$
Minimized Likelihood Value	= 1883.96	$LY_{init} => number: [1300]$
		LY_max => humber: [2000]
		$LT_min \Rightarrow number: [800]$
text output on the screen		Number: $[() = 1000 \text{ mm} \text{ mm}$
		$\frac{1}{10} = 2 < 0 >$

#### NI h init . number. FA 2001EET Log message



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## Example code

#include "ReactorAnalysisManager.h"
#include "InputManager.h"
#include "ReactorInputBuilder.h"
#include "ReactorSpectrumBuilder.h"
#include "OutputManager.h"
#include "SimpleOutputBuilder.h"
#include "SimplePlotManager.h"

```
int main (int argc, char** argv) {
    AnalysisManager *ana = new ReactorAnalysisManager();
    InputManager *inputManager = new InputManager(argc,argv);
    InputBuilder *builder = new ReactorInputBuilder();
    builder->installSpectrumBuilder(new ReactorSpectrumBuilder());
    inputManager->setInputBuilder(builder);
    ana->setInputManager(inputManager);
    OutputManager *outManager = new OutputManager();
    outManager->setOutputBuilder(new SimpleOutputBuilder());
    outManager->setPlotManager(new SimplePlotManager());
    ana->setOutputManager(outManager);
```

```
ana->init();
ana->run();
ana->finish();
```

#### return 0;



}



### **Object-orieneted Fully written in C++11**



# Installation guide

GitHub, Inc. [US] https://github.com/GooStats/GooStats/blob/master/docs/INSTALL.md

### Installation guide for GooStats

1. First, you should install the GooFit shipped with this package. I have done some modification and it's not compatible with the original GooFit project

```
# suppose you create a folder GooStats-release
cd GooStats-release
git clone git@github.com:DingXuefeng/GooStats.git
mkdir build_GooFit
cd build_GooFit
cmake ../GooStats/GooFit -DCMAKE_INSTALL_PREFIX=../GooFit-install
make -j4
make -j4
make -j4 install
export GOOFIT_DIR=$(readlink -f ../GooFit-install)
# you can put this sentence to your .bashrc
echo "export GOOFIT_DIR=$(readlink -f ../GooFit-install)" >> ~/.bashrc
```

Tips:

- for sure remember to compile it on a machine with GPU. if you work on a cluster, use qsub -I
- I have turned off OpenMP in GooFit. GooFit can run on GPU, OpenMP and MPI mode. However GooStats is only
  optimized for the GPU mode. Sometimes you work on a cluster with one GPU and only one CPU, if you turn on
  OpenMP, the code will be super slow. I might solve it in the future, currently I just turn off the OpenMP in GooFit.



# Response function

- Based on my thesis on Borexino analysis
  - Use charge (or Evis) instead of non-linearity corrected energy to be able to use physics parameterization -> important for solar Be7 nu fitting (conclusion of my thesis)
  - Generalized gamma instead of Gaussian
  - Resolution dependence with physics parameterization
    - $v1 = (1+v1)^* \mu + \sigma_T^2 \mu^2$
    - v1: PMT single p.e. charge resolution
    - $\sigma_T$ : residual non-uniformity





# Performance and result

40000 fit x4 (NH-NH, NH-IH, IH-NH, IH-IH), on K20m GPU, ~10 hours



- Likelihood based fit.
- 0.1% residual nonuniformity assumed
- No LY-related systematics
- No backgrounds
- 6 year x 20 ton, 36 GW,
  52.5 km
- For 99.9975% cases the rejection power would be stronger than 1/40000 G S SCIENCE INSTITUTE

# Future plan

- Add background (make it open source, like Barcall's website? or use zentoro?)
- worse non-uniformity assumed, say 1%?
- Include systematics from LY/non-linearity? quite strait-forward.





# Conclusion

- GooStats is a GPU fitter specifically for particle multi-variate spectral-fitting analysis. It's open source and welcome for co-operation.
- A hard-ware accelerated mass-hierarchy fitter based on GooStats is developed. throughout: 40000 x 4 fit per 10 hour, that is 0.23 s per fit
- Using likelihood rather than chi^2, we got a different view of MH determination.





Thanks for you attention