# Recent Results of the Solid Exteriment Shingo Hayashida Imperial College London UK

Imperial College London on behalf of the SoLid collaboration

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# Outline

- SoLid physics goals
- The SoLid experiment at SCK CEN
- IBD analysis & Phase-I expected sensitivity
- Conclusion

# **Experimental Goals**

#### Probe the Reactor Antineutrino Anomaly (RAA)



#### 3+1 model



re precisely the antineutring spectrum with pure U-235 fuel



Unexpected bump around 5 MeV reported by antineutrino experiments at power reactor (<sup>235</sup>U, <sup>239</sup>Pu, <sup>241</sup>Pu and <sup>238</sup>U isotopes)

Recent indication in liquid scintillator detectors close to <sup>235</sup>U research reactors.

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## SoLid

# SoLid Experiment

## **Experimental site**

- SCK CEN BR2 research reactor (Mol, Belgium)
- Very close to the reactor core (6 9 m)
- Low overburden (~6 8 m.w.e)





## **BR2** reactor

- Compact core (50 cm in effective diameter)
- Highly enriched <sup>235</sup>U (>93.5%) is used as the nuclear fuel
- Low level reactor background (gamma, neutron)
- Licensed to operate at power up to 100 MW
  - Variable operating power (45 80 MW)
  - 6 cycles per year on average (140 days)





~ 1.1 m

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# **SoLid Phase-I Detector**

- Phase-I detector has been taking physics data since 2018
- 12,800 PVT cubes, 1.6 ton fiducial volume
- 3,200 read-out channels (WLS fibers + MPPCs)





modules

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# **Antineutrino Detection Principle**

- SoLid experiment detect the inverse beta decay (IBD) induced by antineutrino with combination of two scintillators
  - $\bar{v}_e + p \rightarrow n + e^+$
- PVT for prompt signal : Electron Signal (ES)
  - Energy deposit by a positron carrying the antineutrino energy
  - 2 annihilation gammas are emitted
- 6LiF:ZnS(Ag) for delayed signal : Neutron Signal (NS)
  - A thermal neutron is captured  ${\sim}64\mu s$  after
    - $n + {}^{6}Li \rightarrow {}^{3}He + \alpha$  (total energy = 4.78 MeV)

Both signals are read out through the wavelength shifting fibers in X and Y directions, then detected by MPPC.

IBD reaction identified using **delayed coincidence** (ES and NS).



Δt

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# Antineutrino Gamma Topology Classification



Identification of the back-to-back gammas Advantage of a highly segmented detector!

#### **Challenges:**

- Analysis channel threshold down to 100 keV
- Implies to understand detector response in deep details

#### Annihilation gammas reconstruction:

- Find the first gamma cluster then split the detector in two hemispheres and look for second detached cluster
- Tracking by minimizing likelihood function of cubes position according to X sections
- Classification based on 0, 1, 2 gamma cluster in event

# Phase-I Data & Detector Calibration

- Physics quality data is collected only during ideal conditions with chilled container, sufficiently low humidity in the container, no source in the container and full shielding.
- We run multiple data quality checks over the data to detect and reject faulty data.
- Selected ~326 days of Reactor-on and ~187 days of Reactor-off high quality data for oscillation analysis.
- **Gamma** sources used for energy calibration of the detector.
- Linearity and homogeneity of the detector energy response tested at a few percent.



# Inverse Beta Decay (IBD) Analysis

Three types of background (BG)

- Fast neutrons (External BG)
  - Fast neutron induced by cosmic-ray air shower & spallation
    - Neutron recoil events : ES
    - Neutron capture : NS

## • BiPo (Internal BG)

- Derived from <sup>238</sup>U/<sup>230</sup>Th series contaminated mainly in LiF:ZnS(Ag)
  - <sup>214</sup>Bi decay (e-, γ) : ES
  - <sup>214</sup>Po decay (α) : NS

## Accidental (External BG)

- Gamma rays from <sup>41</sup>Ar decay (reactor)
- Radon emanation from the building

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# **BiPonator : Sophisticated PSD Method (CNN)**

#### **CNN** Input





#### **CNN Factory**





#### GOAL:

Alpha / Neutron discrimination improvement to reduce more BiPo background

#### **CNN Output**



#### Ex : inference on Roff dataset (54.76% of alphas and 45.24% of neutrons)



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# **BiPonator : Performances**



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# **BiPo Background Studies**

- A high purity BiPo sample very close t the signal region for precise tuning of MC.
- Phase-I R-Off data of ~187 live data-taking days is used for comparison with MC.

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- Topological and energy variables are quite stable in background region.
- Systematics derived from any disagreement between data and MC.



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# Multivariate Analysis (MVA)

Two independent approaches are employed

- Gradient Boosted Decision Tree (BDTG)
  - Strong BDT trained by evaluating the gradient of the objective function

2-gamma



- Uniform Boosted Decision Tree (uBDT) arXiv:1305.7248
  - Keep the uniform efficiency at the specific variables

#### Training for each gamma category



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# **Event selection for antineutrino analysis**



#### Pre-selection to Signal and BiPo

- Correlation between ES and NS
  - Δ<sub>NS-ES</sub> X, Y : [-3, 3]
     Δ<sub>NS-ES</sub> Z : [-2, 3]
     Δ<sub>NS-ES</sub> R : [0, 4]

#### **Energy information of ES** •

• E<sub>prompt</sub> : [1.5, 7] MeV

# SoLid Extraction of antineutrino signal rate

### **Background subtraction process**

- 1. Subtract BiPo and accidental
- 2. Compute the pressure correction factor in Roff  $S_{Signal - BiBo} = \gamma^{Ref} (P_i - \overline{P})$

-Signal-BiPO, J -Signal-BiPO 
$$\lambda_{ATMN}(-)$$
 - J

3. Compute the excess rate for each day in Ron

 $S_{Signal-BiPo-ATMn,k} = S_{Signal-BiPo,k} - \chi_{ATMn}^{Ref}(P_k - \bar{P})$ 





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# **Antineutrino Signal**

Antineutrino event rate is assumed to be 1088 [event/day] in reactor-on



Good agreement between Data and MC Background subtraction method works well Systematic uncertainties have not been estimated yet

uBDT: ~90 event/day, S/B =0.21



#### **GBDT: Breakdown of Roff**





# **Oscillation Sensitivity**

- Feldman-Cousins construction to estimate sensitivity to sterile neutrino oscillations -> both raster scan (1D) vs and global scan (2D) methods
- **Systematic uncertainties** related to the light yield (LY), energy scale and neutron capture efficiency per module are currently taken into account
- **Ongoing effort** to assess impact of remaining systematics and improve sensitivity with new analysis techniques !





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# Two Gamma Antineutrino Topological Selection London



- New analysis  $\rightarrow$  based on event topologies (using maximally the detector segmentation)
- 2. Preliminary analysis with **both annihilation gammas** as complex pattern
- 3. Multivariate analysis for remaining background rejection

4. Each background component determined with **multidimensional simultaneous fit** (spatial and time Prompt-Delayed differences).

 $\rightarrow$  Good agreement between excess and prediction and S/B larger than one is obtained:

 $N(\overline{\nu}/\text{day}) = 21.8 \pm 2.1 \text{ (stat)} \pm 1.5 \text{ (syst)}.$ 

5. Beyond Phase-I data measurement this approach will benefit from the upgrade features (i.e. LY increase).





# Conclusion

- SoLid faces the BiPo and cosmic-induced background
  - These are reduced by the space and time coincidence, signal topology, waveform analysis by CNNs, multivariate analysis
- · The detector response is well understood
- Background subtraction method is working well
  - Systematic errors totally estimated pretty soon
- Dedicated analysis based on topologies are very promising
- Exclusion contour for SoLid Phase I coming soon!

#### **Detector Upgrade for Phase II**

Replacement of S12 series MPPCs with S14 series





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# Backup

# Classic PSD Method (BiPonisher)

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# Multivariate Analysis (MVA)

Two independent approaches are employed

## TMVA neural networks

Legacy but conservative method as well known

## Uniform Boosted Decision Tree (uBDT)

Customized BDT to uniform classification performance.
[arXiv:1305.7248]



Output of uBDT is uniform in selected parameters  $(m^2_{ab}, m^2_{ab})$ 

# SoLid Event Reconstruction



#### 3. Make correlations between ES and NS



2. Identifying cluster by using cluster length and integral of amplitude / amplitude ratio

"ES", "NS", "Muon track"

NS selection cuts

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#### An ES-NS coincidence candidate



ES energy is estimated by using Maximum-Likelihood Expectation Maximization (MLEM) algorithm

# SoLid Detector Upgrade

- Upgrading the detector with new MPPCs (S14 series)
  - 40% higher light yield compared to S12 series
  - Cross-talk will be half
  - Energy resolution & threshold will be improved
- Improvement of the annihilation gammas reconstruction is expected







Wavelength (nm)

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# BiPo Background in 0, 1 and 2 y Category Events

- Additionally, BiPo background stability is studied categorizing 0,1 and 2 γ events.
- These BiPo events are a proxy to IBD events with 2 annihilation gammas.



## 2 y Anti-neutrino Topological Selection



1. The signal definition in the current analysis is based on the topological properties of the ES

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2. The positron and gamma deposits are distinguished to remove the backgrounds (granularity of the detector is maximally used)

3. Further background rejection is tackled with a multivariate analysis. There are 2 tools based on the EM features + 1 based on the geometrical

4. 10-fold cross-validation is applied (to use the full ROff statistics). Overtraining checked.5. The 5D optimization aimed at signal significance maximization is used.

 The yields for each source are directly measured from the simultaneous unbinned ML fit
 Predictions, control plots and systematic uncertainties are determined following a blind analysis.







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## 2 γ Anti-neutrino Topological Selection

Syst source	Nominal	δ	$\sigma_{\mathbf{Y}\overline{ u}}$	$\sigma_{\mathbf{Y}\overline{\nu}}, \mathbf{\%}$	Comment
Light Leaks	11.7%	+3.0%	-1.27	4.73	To be improved with
		-3.0%	+0.95	3.54	the SM sampling
Light Yields	Saffron2	+3.0%	-0.68	2.55	To be improved with
	induced	-3.0%	+0.58	2.16	the SM sampling
$\Delta au$ BiPo	235.8µ <i>s</i>	+1.2µs	+0.03	0.12	
		-1.2 <i>µs</i>	-0.03	0.12	
$\Delta au$ Atm	62.0 <i>µs</i>	+0.5µs	+0.09	0.35	
		-0.5µ <i>s</i>	-0.15	0.58	
$\Delta  au$ FAtm	8.5 <i>µs</i>	+0.8 $\mu$ s	+0.02	0.08	
		-0.8µ <i>s</i>	-0.02	0.08	
$\Delta r$ ACC shape	FPNTs	Sampled	0.12	0.59	Uncertainty scales with
	sample p.d.f.				the ROff data statistics
$\Delta r$ ATM shape	Enr. sample	Sampled	0.21	0.98	Uncertainty scales with
	driven p.d.f.				the ROff data statistics
$\Delta r$ BIPO shape	Enr. sample	Sampled	0.15	0.70	Uncertainty scales with
	driven p.d.f.				the ROff data statistics
$\Delta r$ IBD shape	ROSim p.d.f.	Sampled	0.08	0.37	

# SoLi∂ 2 γ Anti-neutrino Topological Selection



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# 2 y Anti-neutrino Topological Selection

