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Point-Spread Analysis of γ -Ray/Depth Spectra for Borehole Monitoring Applications

Soraia C. Elísio, Aliyu Bala, Manuel Bandala, James Graham, Alex Grievson, and Malcolm J. Joyce^(D), *Member, IEEE*

Abstract—An approach to the analysis of y-ray spectra that might arise as depth profiles from the characterization of 2 radioactivity in boreholes is described. A borehole logging probe, "ABACUS," has been designed and constructed, which comprises a cerium bromide detector and a built-in multichannel analyzer 5 (MCA). This has been tested in a bespoke, laboratory-based 6 testbed built to replicate the borehole environment. An established, semiempirical model has been applied to data arising from the cerium bromide scintillation detector to extract the number 9 of counts under the full-energy peak from each of the resulting 10 y-ray spectra (in this case the 662 keV line from 137 Cs) associated 11 with each depth position, which also enables this information to 12 be isolated from other contributions such as background and 13 the Compton continuum. A complementary approach has been 14 adopted to process the asymmetric and non-Gaussian trend that 15 concerns the full-energy peak count as a function of depth in 16 the borehole testbed for a given depth profile when the testbed 17 is subject to the activity provided by a sealed, ¹³⁷Cs source. 18 This comprises a modified, Moffat point-spread function (PSF). 19 The Moffat function is a continuous probability distribution 20 based on the Lorentzian distribution. Its particular importance 21 is due to its ability to reconstruct PSFs that comprise wings 22 that cannot be reproduced accurately by either a Gaussian or 23 Lorentzian function. This application of the Moffat formalism to 24 radioactive contamination assessment profiles enables an effective 25 26 and accurate assessment to be made of the position of localized radioactivity in the testbed wall. 27

Index Terms— *γ*-ray detection, curve fitting, Gaussian distribution, nuclear measurements, radioactive pollution.

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NOMENCLATURE

31 Glossary A Amp

Amplitude of Gaussian function applied to photopeak.

- *B* Amplitude of step function expressed as a fraction of *A*.
- *b* Offset representing the residual background count.
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- β Parameter governing the shape of a depth profile.
- C Tail function amplitude expressed as a fraction of A.
- *df* Number of degrees of freedom.
- f Spectrum fitting function.
- *G* Gaussian function.
- g Moffat point-spread function (PSF).
- γ Skew parameter of the peak of a depth profile.
- *I* Amplitude of a Moffat PSF.
- μ Centroid of the Gaussian function applied to photopeak.
- *m* Slope of the exponential in the tail function, *T*.
- *N* Number of counts in photopeak.
- *n* Constant in Gaussian integral ensuring 3σ coverage.
- *p* Peak depth position as per centroid components below.
- p_x Centroid in x of an image or depth profile.
- p_y Centroid in y of an image or depth profile.
- *S* Step discontinuity function in photon spectrum.
- *s* Sigmoid-type function describing *x*-axis asymmetry.
- σ Standard deviation of the Gaussian applied to photopeak.
- *T* Tail function applied to photon spectrum.
- w_x Parameter governing the width of a depth profile in x.
- w_{y} Parameter governing the width of a depth profile in y.
- x_0 Central x coordinate of an elliptic profile.
- y_0 Central y coordinate of an elliptic profile.
- *x* Abscissa denoting photon energy or depth.
- y Parameter orthogonal to depth in Moffat PSF.

I. INTRODUCTION

S OME facilities used for the interim storage of spent nuclear fuel, i.e., ponds and wet silos, were not designed to modern standards and, consequently, radioactivity has leaked from them to ground [1]. This migratory contamination poses a risk to groundwater, public health, and the environment. As a consequence, investigations are necessary to locate it in order to better understand its transport and fate, the associated radiological risk, and to inform site remediation programs.

Often, best practice to assess such situations includes 43 the installation of monitoring wells or boreholes to enable 44 groundwater sampling campaigns and subsequent radiological 45 analysis. Such boreholes usually extend into the ground to 46 intersect the groundwater table and can have, for example, 47 a slotted screen section at a specific depth to allow the water to 48 flow in. Samples are then collected from these penetrations and 49 sent for laboratory analysis; the latter can comprise purification 50 to isolate a target radionuclide followed by spectroscopy. 51

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However, such sampling can be laborious and can result in secondary wastes, whereas, in areas with high dose rates, it can present radiological risks that might be avoided otherwise; neither is it ideal where wells are susceptible to drying out as the opportunity for sampling can then be lost.

Borehole logging is an alternative to sampling to assess 57 radioactivity in the ground and has the potential to provide 58 an in situ, continuous, and real-time assessment of radioactive 59 source distributions. In this context, logging might comprise 60 recording ionizing radiation characteristics as a function of 61 depth in a monitoring well. However, since it was pioneered 62 for geophysical prospecting [2], most reported works have 63 focused on an active application in which radioactivity is used 64 as a tool rather than being the objective of the assessment. The 65 passive assessment of land contaminated with radioactivity via 66 boreholes has received less attention, with works focusing on, 67 for example, the correlation between measurements made on 68 core samples and in boreholes [3]; spectral-shape distinction of 69 cesium-137 and cobalt-60 [4]; high-resolution logging systems 70 [5], [6]; and the analysis radial distributions of cobalt-60 from 71 buried corrosion [7]. 72

Passive borehole measurements can be made either by 73 stepwise recording, while a measurement probe is stationary at 74 selected depths (such as at the water table level for example), 75 or by lowering the probe gradually into a well. In the former, 76 the probe is in direct contact with contamination that might 77 be entrained within water in the well; in the latter, the con-78 tamination is present in the ground (or within ground fluids) 79 surrounding the borehole and does not have to be in direct 80 contact with the probe. However, several limitations remain 81 concerning, for example, the easy recovery of energy spectra 82 with depth information that is accurate and consistent. 83

This article describes the design and test of a logging 84 probe [8] and an associated method to infer the depth of a 85 source of radiation in a borehole environment. A computer-86 implemented method to locate radioactivity in blind tubes 87 is presented, which combines the direct detection of the 88 cesium-137 Energy peak th an application of an astrophysical 89 seeing formalism. This is used to derive individual, radioactiv-90 ity depth-profile trends and, hence, enables an estimate for the 91 depth of isolated radioactivity in a laboratory-based, borehole 92 analog to be inferred. 93

II. BACKGROUND

The radiation detected with in situ detector probes in 95 boreholes on land contaminated by products of the nuclear 96 fuel cycle usually comprises γ rays (due to their characteristic 97 98 penetrative strength and the prominent yield of γ -emitting fission products such as cesium-137) and X-rays by way 99 of bremsstrahlung from high-energy β particles from the 100 decay of prominent β -emitters, such as strontium-90. These 101 photons contribute to characteristic, energy-specific lines in 102 a spectrum (full-energy peaks), the Compton background 103 because of scattering, and the lower-energy X-ray region due 104 to bremsstrahlung. 105

The volume investigated in situ approximates typically to a sphere centered on the sensitive volume of the detector in use. The radius of this sphere (corresponding to the depth of investigation) varies with photon energy and the 109 interaction properties of the associated media, i.e., reducing 110 with decreasing photon energy and increasing atomic number 111 of the intervening media. The finite size of the detector may 112 introduce variance from this spherical approximation, and it 113 is anticipated that the properties of the materials constituting 114 the monitoring system and borehole structure can influence 115 the detected bremsstrahlung yield. 116

Sensors used in logging probes have included gas-filled 117 detectors (Geiger-Müller tube-GM), scintillators (such as 118 thallium-doped sodium iodide-NaI:Tl), and semiconductors 119 (i.e., high-purity germanium detectors-HPGe), yielding 120 a range of capabilities from pulse-counting through to 121 spectroscopy. The data from deployment are often presented 122 as a γ -ray depth profile in terms of dose intensity, i.e., total 123 counts, or the proportion of the total γ radiation detected 124 associated with a particular energy (and therefore a specific 125 radionuclide) as a function of depth in the ground, where 126 spectroscopy allows. 127

 γ -ray spectroscopy data accrued as a function of depth are 128 generally more complex than dose or gross count data since 129 they contain more detailed information. This might comprise 130 a first profile based on a total γ -ray log (the sum of all types 131 of radiation contributions) and a second profile of calculated 132 abundancies associated with the radiation from each isotopic 133 contribution. Such a dataset might provide information about 134 spatial distributions of leaks in the ground as a function 135 of depth. The output data can also be presented as a time 136 series, where the logging probe is fixed at a specific depth, 137 recording at different times of the year. These data may 138 provide information about, for example, the temporal flow of a 139 radioactivity migrating in the vicinity of the borehole. A space-140 time compilation of datasets, as well as measurements with an 141 array of monitoring wells, can be essential to monitor local and 142 site-wide mobilization or the remobilization of leaks. 143

Often, downhole γ -ray logging surveys are conducted in 144 blind tubes, which, although having advantages over sam-145 pling methods that require subsequent laboratory analysis, 146 can be challenging due to deployment constraints, limitations 147 of the sensing apparatus, and radiological restrictions where 148 they arise. For example, long-established boreholes on some 149 nuclear sites are lined with carbon steel and can have screen 150 depths of up to 10 m below ground level. They are often 151 blinded (i.e., end-capped and thus sealed) to ensure that 152 direct contact of the probe with the contamination surrounding 153 the blind tube is prevented. While desirable operationally, 154 this arrangement complicates the detection of radiations from 155 α - and β -emitting radionuclides (notwithstanding the potential 156 for bremsstrahlung from the latter). Furthermore, a typical tube 157 radius of \sim 75 mm can limit the range of probes that will 158 fit, recognizing that some radial margin is essential given the 159 imperative that probes do not become stuck while in use. 160

Anthropogenic radioactivity in the ground is often dominated by cesium-137 and strontium-90, and the latter's daughter, yttrium-90. Hence, a system providing dual detection and discrimination of these radionuclides via their photon spectra can have advantages over dose-rate-only datasets. Empirical fitting procedures can be necessary to extract such spectroscopic features consistently across many spectra and
 to extract the corresponding depth of contamination from the
 depth profile: this is the focus of this work.

III. METHOD

171 A. Photopeak Fitting

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 γ -ray spectra arising from measurements in boreholes can require a model to cater for contributions comprising, for example, a *first* source of radiation that can be somewhat discrete (the predominant radionuclide) and a *secondary*, more continuous contribution representative of a relatively complex background.

Cesium-137 is relatively straightforward to quantify given 178 its 662-keV photopeak; a region-of-interest (ROI) in the energy 179 spectrum can be selected between lower L and upper U 180 energies defined to encompass this. The number of counts 181 within this region is obtained by summing the counts in this 182 histogram or (better) by fitting and integrating the mathemat-183 ical function that best describes it. The latter is usually a 184 Gaussian, depending on the complexity of the spectrum. 185

In addition to the contributions to γ -ray spectra that arise due to photoelectric absorption and the incomplete interactions of photons subsequently escaping the detector crystal, bremsstrahlung arising from β -particle interactions in a steel blind-tube liner might also be characterized.

The semiempirical model applied previously for peak-shape analysis of multichannel pulse-height spectra from highresolution germanium γ -ray detectors [9], [10], [11], [12] has been adopted here to describe and quantify spectra in the vicinity of a peak from a cerium bromide (CeBr₃) scintillator, as per the function, f, represented by a sum of terms defined as follows:

$$f(x) = G(x) + S(x) + T(x) + b$$
 (1)

where x is the abscissa corresponding to photon energy; 199 G(x) is the Gaussian function representing the photopeak; 200 S(x) represents a step discontinuity that may appear in the 201 continuum below the Gaussian peak on its low-energy side; 202 T(x) represents the exponential trend in counts that may 203 appear in the continuum below the Gaussian peak, again, 204 on its low-energy side; and b is an offset corresponding to 205 the residual background level. 206

G(x) is defined in (2) where A is the amplitude of the Gaussian function, μ is the mean, and σ the standard deviation

 $G(x) = Ae^{-\frac{(x-\mu)^2}{2\sigma^2}}.$ (2)

S(x) is defined as per (3) where *B* is the step function amplitude (expressed as a fraction of *A*) and erfc(*x*) is the complementary error function, and the tail function, T(x), is as per (4), where *C* is the tail function amplitude (expressed as a fraction of *A*) and *m* is the slope of the exponential

215
$$S(x) = ABerfc\left(\frac{x-\mu}{\sigma\sqrt{2}}\right)$$
(3)

²¹⁶
$$T(x) = ACe^{\frac{x-\mu}{m\sigma}} \operatorname{erfc}\left(\frac{x-\mu}{\sigma\sqrt{2}} + \frac{1}{m\sqrt{2}}\right).$$
(4)

The contribution due to the principal radionuclide over a complex continuum background of radiation is then calculated using (5), where N is then the number of counts corresponding to the photopeak, obtained by calculating the area under the Gaussian, G(x) 221

$$N = \int_{\mu-n}^{\mu+n} G(x) dx$$
 (5) 222

wherein *n* assumes a predetermined constant value indicative ²²³ of a photon-energy interval sufficient to cover 3σ either side ²²⁴ of the photopeak and the uncertainty in the *N* measurement ²²⁵ is obtained by error propagation considering the obtained ²²⁶ standard deviation in the fit variables (from the covariance ²²⁷ matrix). ²²⁸

B. Modeling γ -Ray Log Depth Profiles

The response of a γ -ray logging tool can be represented as 230 the total number of detected γ -ray counts due to the γ -emitting 231 radioactive material present in the volume of investigation or in 232 terms of the constituent proportions derived from analysis of a 233 corresponding γ -ray spectrum. The contribution of individual 234 isotopes can be evaluated and plotted as a function of depth 235 from this analysis, yielding depth profiles for specific γ -ray 236 lines. 237

Typically, a pulse function can be used to represent the 238 variation in response intensity of the logging γ -ray tool as 239 a function of depth in the vicinity of a radioactive anomaly in 240 the ground. This can be interpreted in terms of the hypothetical 241 response of a point detector at an infinitely slow logging speed 242 (depth series) for a uniform zone of contamination. However, 243 the boundaries of a pulse may not be defined sharply and 244 pulses may have irregular shapes due to factors such as logging 245 speed and measurement time, the size of the sensitive volume 246 of the detector, variation of the spatial distribution of the 247 source radioactivity in the bed formation, and changes in the 248 volume of investigation from one measurement to another. 249

Logging tools are often used in boreholes in radioactive 250 areas to locate contamination zones and to determine the 251 distribution of migrating radioactivity from a source, as well 252 as to identify and obtain relative proportions of specific 253 nuclides within a given medium. These objectives can require 254 careful analysis of the overall shape of the depth profile in 255 specific regions where changes in intensity, corresponding to 256 radioactive anomalies, are to be resolved to a sufficient degree. 257

Changes in shape of the intensity profile can be due to a 258 combination of influences such as changes in activity, source 259 dispersion, and the geometry of shielding materials. A source 260 of radiation in a medium can be theorized as an extended 261 homogeneous layer with a notional volume (extended depth 262 vertically and horizontally relative to the orientation of the 263 borehole) or as a point source (such as a "hot" particle) 264 at a vertical/horizontal position to the borehole), as well as 265 heterogeneous sources comprised of various point sources at 266 different positions but within a defined volume [4]. In practice, 267 the distribution of radioactivity in the ground is often complex 268 and may comprise several configurations. 269

A scenario approximating to a point source in the ground, 270 assessed with a single transit of logging system across a 271

range in depth spanning the position of the source, might 272 yield a single peak shape that can be described by simple 273 model with a small number of fitting parameters. A 1-D, 274 PSF is an attractive option for the analysis of discrete photon 275 depth spectra profiles of a point source near to a blind tube. 276 However, such a function should encompass the entire activity 277 profile, including an inner zone (corresponding to the core of 278 the profile) and an outer zone with low numbers of counts 279 present in its "wings:". While a Gaussian distribution might 280 serve as a first approximation, the extremities of a profile can 281 be more extensive than this is able to fit self-consistently. This 282 introduces important uncertainties as to the depth at which a 283 radioactive anomaly is discernible from the ambient. 284

An alternative to a Gaussian is the Moffat peak-like distri-285 bution because this accounts for the departure from Gaussian 286 shape in the extremities on either side of the peak. A Moffat 287 distribution is a Lorentzian continuous probability distribution 288 modified with a variable power index. It is often described 289 as a special case of the multivariate student-t distribution, 290 specifically a distribution of a bivariate random variable (x, y)291 centered at zero (or as of the corresponding radius in this con-292 text). It has been used in astrophysics applications [13] to cater 293 for seeing effects (see the following) in stellar profiles and for 294 synapse image analysis concerning the nonuniform scattering 295 of photons across the brain/cranial window of mammals [14]. 296 In astronomy, "seeing" refers to image degradation of an 297 astronomical object caused by atmospheric turbulence [13]. 298 This results in brightness distributions (or radial intensity 299 profiles) in captured, 2-D, ground-based images. Such abnor-300 mal radial intensities can manifest as irregular wings in the 301 point-spread profiles that neither Gaussian nor Lorentzian dis-302 tributions reproduce consistently, whereas a Moffat PSF can. 303 The standard, 2-D, Moffat PSF characterizes a spatial 304 distribution of photons under the assumption of circular sym-305 metry, i.e., a circular aperture, centered at the object centroid, 306 307 as per g, where

$$g(x, y) = I \left[1 + \frac{(x - p_x)^2}{w_x^2} + \frac{(y - p_y)^2}{w_y^2} \right]^{-\beta}$$
(6)

where x and y in this context denote position, I is the 309 amplitude, and p_x and p_y denote the centroid position of the 310 profile in the image. The parameters w_x , w_y , and β account 311 for the effect of photon scattering in a medium between the 312 object and the detector recording the image, often referred to 313 as seeing parameters that govern the width and the shape of a 314 profile, respectively: w is a scale parameter that determines the 315 width of the distribution and radius of a circle $(w = w_x = w_y)$ 316 in a 2-D image projection as per Fig. 1(a); β parameterizes 317 the extent of the wings on either side of the peak of the 318 distribution, correcting the anomalous slope for larger radii. 319 Note that larger values of β result in a steeper slope and, 320 when $\beta \to \infty$, the function tends to a Gaussian. Radii in one 321 axis projection can be calculated from the full-width-at-half-322 maximum as equal to (FWHM/2) = $2w(2^{1/\beta} - 1)^{1/2}$ 323 full-width-at-tenth-maximum or the as equal to 324 $(FWTM/2) = 2w(10^{1/\beta} - 1)^{1/2}$, based on the chosen 325 percentage of the amplitude signal (desired level of 326 significance). The parameter β influences the resulting radius. 327



Fig. 1. Computer-generated images with color schemes representing the varying intensity levels across (x, y) coordinates for (a) symmetrical, (b) elliptical, and (c) asymmetric 2-D Moffat PSFs.

Population studies of dense stellar fields have proposed the 328 use of modified 2-D Moffat PSFs because the spatial bright-329 ness of these distributions exhibits a degree of asymmetry. 330 Analytically, this arises because, for elliptical dispersion, the 331 parameter width is no longer equal for x- and y-projections 332 (and thus $w_x \neq w_y$), as per Fig. 1(b), where the semi-333 major and the semiminor axes (w_x, w_y) are referenced to 334 the central coordinates of the corresponding ellipse (x_0, y_0) . 335 The FWHM varies symmetrically for each axis projection 336 and at any specific inclination angle with the x-axis [15]. 337 Asymmetry in a single-axis projection can be introduced 338 via a position-dependent function in the corresponding width 339 parameter w_x given by a sigmoid-type function s(x) =340 $2w_x/(1+e^{\gamma(x-x_0)})$ for x-axis asymmetry (on the y-axis, the 34 profile is symmetrical). This asymmetric, 2-D, Moffat PSF 342 represents a complex nonelliptical object [16] [see Fig. 1(c)] 343 where $w_x \neq w_y$, and γ regulates the skewness of the peak 344 profile. 345

Considering the photon dispersion depth profile of a vertical, 1-D scan of the simplest, point radioactive source distribution, a 1-D PSF is sufficient. Any eccentricity in the wings (corresponding to a contaminated zone boundary) is characterized by a Moffat PSF; any asymmetry is accounted for via an additional factor to yield a revised expression for *g* as per 351

$$g(x) = I \left[1 + \frac{(x - p_x)^2}{\left(\frac{2w_x}{1 + e^{\gamma(x - p_x)}}\right)^2} \right]^{-\beta}$$
(7) 352

where γ can be positive or negative, to indicate skew to the 353 lower and higher values of a depth maximum, respectively, 354 and null if symmetric, with β and w_x defined as positive. 355 Higher values of β indicate a higher slope of the distribution 356 wings, and higher values of w_x indicate a wider distribution. 357 Note that the calculation of FWHM is more complex in non-358 symmetric cases, as an explicit isolated solution for $(x - p_x)$, 359 and the determination of the radius (in a x-axis projection) 360 requires the application of numerical methods, such as the 361 Newton–Raphson method [17]. However, in instances where 362 the fit yields a very small γ value, the previous FWHM 363 expression can be employed for a quick assessment of the 364 spread. This simplified scenario is used to define baseline 365 values for γ , β , and w_x . Any detraction from these baseline 366 values might suggest an extended or multicomponent source 367 of radioactivity or discrepancies due to photon scatter arising 368 due to density or structural changes of the ground surrounding 369 a given borehole. 370



Fig. 2. (a) Schematic of the approach showing the borehole (1), the probe (2), tether (3), the pulley unit of the deployment system (4 and 5), and the winch (6) and laptop (7). (b) ABACUS probe unit (size \emptyset 7 × 20 cm) (1) including the detector (size \emptyset 1.5 × 6.5 cm) (2) and MCA (size 7 × 4.5 × 2.6 cm) (3). (c) Laboratory setup including the testbed (1), the source ports (2), and the top view of the unit.

IV. MATERIALS AND METHODS

372 A. Blind-Tube Logging Probe Prototype

371

The blind-tube logging probe (BLP) used in this work, 373 "ABACUS;", as per Fig. 2, comprises a γ -ray spectrometer and 374 a digital multichannel analyzer (MCA) in an outer, cylindrical 375 case. The spectrometer is made up of an inorganic scintillation 376 detector and a silicon photomultiplier (SiPM) in a cylindri-377 cal, compact (physical size of $\emptyset 1.5 \times 6.5 \text{ cm}^2$) hermetic 378 unit (VS-1402-20, commercialized by Scionix, Netherlands). 379 The scintillator is a $\emptyset 9.5 \times 10 \text{ mm}^2 \text{ CeBr}_3$ crystal, and 380 the crystal readout is a $6 \times 6 \text{ mm}^2$ PM6660-SiPM (Ketek 381 GmbH, Germany). The SiPM output is conditioned by a 382 built-in preamplifier to cater for the effect of temperature; the 383 influence of temperature on its light output was not catered 384 for recognizing that the measurements were performed in 385 a laboratory with some temperature compensation. Cerium 386 bromide provides competitive γ -ray detection efficiency (with 387 an effective atomic number, Z_{eff} , of 46, and a density of the 388 material, ρ , of 5.2 g/cm³), energy resolution (3.2%–4% at 389 662 keV), high-count-rate capability (decay time = 17 ns), 390 and radiation hardness ($<10^5$ Gy) [18]. 391

The MCA used in ABACUS is a Topaz-SiPM supplied in a 392 rugged and pocket-size (physical size of $7 \times 4.5 \times 2.6 \text{ cm}^3$) 393 aluminum box with input and output connectors (commercial-394 ized by BrightSpec NV). It is among the smallest, full-featured 395 MCAs currently available and performs pulse-height analysis 396 of the signal from the scintillation detectors to provide energy 397 spectra. It operates on a 5-V low-ripple, low-noise supply for 398 the detector and can be interfaced to a laptop or notebook 399 easily via USB 2.0 communication interface for power supply 400 and data transfer. The unit includes a spectroscopy software 401 interface. Note that by installing the MCA unit in the probe 402 case, the detector output signal is digitalized before being sent 403 to the surface, enabling signal transmission with less noise, 404 distortion, and environmental interference [9]. 405

The probe case has a simple cylindrical geometry and physical dimensions compatible with the dimensions of existing blind tubes. The γ -ray spectrometer is fixed parallel to

the central axis of the case and centered at the bottom. 409 A collimator is not used, and hence, the detection response is 410 assumed isotropic apart from the top side of the crystal where 411 the electronics is housed. The signal processing module is 412 placed on top of the detector and connected to it via a LEMO¹ 413 connector. The case is made of plastic (\emptyset 70 × 211 mm long) 414 with a top lid with a hole for the USB cable and a hook to 415 aid deployment and recovery when in use. 416

B. Deployment System

A typical deployment system for the ABACUS probe com-418 prises a winch by which the tool is lowered and retrieved, 419 a sheave to add the change of the direction of the cable 420 between the winch and the hole, and a high-resolution encoder 421 for depth measurement. Typical logging cables (multicore 422 wired) provide a combined means of data transfer, power sup-423 ply, and mechanical support. Surface instruments, comprising 424 a data logger or control unit, store the data and are used to 425 control the winch system, to set the position of the probe 426 within a borehole. 427

In the context of this work, a simplified deployment system 428 has been used for laboratory-based tests in which a sheave and 429 encoder are not used, with the probe lowered/raised manually 430 with depth position measured using a hand-held, laser-based 431 distance meter at the top of the blind tube. The logging cable 432 then consists of two separate cables: a rope to support the 433 weight of the probe and a 3-m-long USB cable for data 434 transmission and power supply. 435

C. Blind-Tube Testbed

The blind-tube testbed used in this research is a ⁴³⁷ laboratory-controlled monitoring well designed for radiation ⁴³⁸ detection and photon depth-profile testing. It has been designed ⁴³⁹ to calibrate the BLP response for a variety of scenarios (e.g., ⁴⁴⁰ simple-to-complex spatial distributions of source and media) ⁴⁴¹ before conducting field measurements. ⁴⁴²

The testbed comprises an inner, vertical pipe at the center 443 of an outer pipe fixed in a base, with four smaller tubes 444 intersecting both pipes horizontally, fixed 80 cm from the top. 445 The inner pipe represents the blind tube in this arrangement 446 with the material and size of this pipe selected to replicate 447 legacy blind tubes at nuclear sites, i.e., Sellafield, as close 448 as possible; in this case, blind tubes lined with carbon steel 449 with inner diameters ranging from 75 to 80 mm and wall 450 thicknesses ranging from 6 to 10 mm. The carbon steel tube 451 (European Tubes Ltd., U.K.) is 1.5 m long with an inner 452 diameter of 75 mm and a wall thickness of 9.5 mm. The outer 453 pipe functions as a material retainer or tank. It is 1.5 m long, 454 320 mm in diameter, made of plastic, and designed so that the 455 space between the blind tube and the plastic outer pipe can be 456 filled with material (such as sand) to recreate a vertical ground 457 core, translating to about 113 mm of material surrounding 458 the blind tube (not done in this work). The horizontal tubes 459 create a void in the matrix material to enable sealed radioactive 460 sources to be inserted and removed quickly and easily. 461

In this research, a scenario has been assumed comprising a 462 single point source with the least degree of scattering possible 463

¹Registered trademark.

AO:5

464 between source and detector, with the test pit left empty of
465 material and a sealed source fixed close to the wall of the
466 blind tube.

467 D. Experimental Method

A cesium-137 source with an activity of 304 kBq was 468 inserted into the horizontal tube at position P1 (see Fig. 2). The 469 BLP prototype was then lowered into the blind-tube testbed 470 (described above) and fixed at various depth positions using 471 a rope attached to the top of the testbed. The position of the 472 probe in the pipe, d, relative to the top of the testbed, was 473 determined using a hand-held laser position meter. The meter 474 was placed on top of the tank, with its laser output directed 475 downward toward the top surface of the logging probe. 476

These data were then converted into distance, D, between 477 the top of the pipe and the center of the sensor element 478 by considering the internal dimensions of the probe. Each 479 spectrum was acquired for 1 h to achieve sufficient statistical 480 precision for peak evaluation. The data were transferred via 481 USB 2.0 to a laptop running the γ -ray spectroscopy software, 482 and each spectrum was saved in the text file format. The 483 following sections describes an algorithm written in python² 484 used to analyze each obtained spectrum for a variety of depth 485 positions. 486

487 E. γ-Ray Spectral Log Analysis

The analysis was divided into two stages. The photopeak model (1) is used first to characterize the γ -ray spectra recorded by the BLP. Each spectrum is the energy distribution of the photons (γ rays and X-rays) determined at a specific depth within the blind-tube testbed as per Fig. 3. Second, the depth profile fit is performed as per Fig. 4.

The photopeak model has been applied to each spectrum for 494 each depth position, *i*, where increasing values of *i* correspond 495 to increasing depth into the ground or, in this case, the testbed. 496 An ROI defined between a lower L and upper U energy 497 bounds is selected to initialize the method encompassing a 498 peak, i.e., the 662-keV line of cesium-137. Initial U and L 499 values were derived from a typical spectrum: L to the right of 500 501 the Compton edge and U to the right of the photopeak where the count level approaches the level of background noise. 502

Least-squares minimization was used to optimize the fit 503 of f [see (1)] to the data within the ROI at each depth i. The 504 fitting algorithm starts with an initial fitting iteration to obtain 505 initial values for the fit parameters (derived from a typical 506 spectrum) and this is then optimized to obtain the parameters 507 and their associated uncertainties. These values are saved, and 508 the process is repeated for the next position. The method 509 checks for errors in the fitting process (such as a failure of 510 the fit or to find optimal parameters), adjusts where necessary, 511 and repeats the process. 512

The ROI may be adjusted by reducing U by one channel to a lower energy until it equals μ (the centroid of the Gaussian). If the process still fails to fit the data, an error message is registered (since effectively no photopeak is detected) and the method moves on to the next position. Following the fitting



Fig. 3. Flowchart of the spectrum fitting process including the data flow.



Fig. 4. Flowchart of the depth-profile fitting process.

process, (5) is used to calculate the total number of counts N_i 518 corresponding to a number of counts under the photopeak, i.e., 519 indicative of the level of cesium-137 662-keV γ rays detected at each position *i*. 521

The aim of the fitting process is to find values of 522 unconstrained parameters based on a minimization using a 523 Lenvenberg–Marquardt algorithm. In python, this is performed 524 by the function scipy.optimize.curve_fit(); a chi-squared test of 526 independence is used to assess the consistency of a given fit. 526





Fig. 5. Depth versus total counts for a single profile exercise (left) and example spectra for three different positions (right): 30.7, 57.1, and 81.6 cm.

V. RESULTS AND DISCUSSION

The γ -ray spectra obtained with cesium-137 at P1, and with 528 the BLP prototype positioned at specific distances 30 up to 529 130 cm from the top pipe, are shown in Fig. 5. This illustrates 530 that the intensity of the 662-keV peak is greater when the 531 detector is close to the source and decreases when it is further 532 away, as expected, with the highest intensity observed at the 533 shortest possible source-detector separation. A wide scatter 534 535 continuum is observed due to the effect of the surroundings and incomplete photon absorption in the detector crystal. 536

The sum of counts may be obtained by direct summation 537 or by fitting an analytical function to the data. A Gaussian 538 with an additional component to represent the low-energy 539 tailing on the peak, f, was used, as per (1), with parameters 540 as defined earlier. χ^2_{ν} for the fits was ~1, but the algorithm 541 fails to fit peaks of small amplitude (<15 counts). This error 542 arises from the failure of the optimization algorithm to achieve 543 convergence within the specified number of iterations and may 544 be attributable to the model's complexity and the presence 545

of noise on a low amplitude photopeak. Note that applying 546 moderate smoothing techniques, such as the Savitzky–Golay 547 filter [19], on spectra with low photopeak amplitudes prior to 548 optimization process may address this issue and, consequently, 549 enhance the accuracy of the profile encompassing the limits of 550 the γ -ray depth profile (not done in this work). Fig. 6 shows 551 an example of a fit for cesium-137. The number of counts 552 under the peak N_p was extracted by integrating the Gaussian 553 component of the optimized function (1), between 3σ on either 554 side of the μ -peak value, plotted against the detector position 555 in the blind-tube testbed, as per Fig. 6. These data describe 556 an asymmetric PSF akin to astrophysical problems and have 557 been fit with a Moffat function, g, with a skew component, 558 as per (7), where the parameters are as defined earlier. Fig. 6 559 suggests an acceptable fit incorporating the asymmetric trend, 560 which is superior when compared to Gaussian-type models 561 (see Table I). 562

The amplitude term, I, can be used to estimate the activity or concentration of cesium-137 in the sample, provided that 564



Fig. 6. Schematic of the depth profiling process (left) with an example spectrum (right, top) including the combination of fits comprising (1) and the depth profile obtained from an experimental scan (right, bottom) with the modified Moffat PSF fit as per (7), with the corresponding fit parameters: *I* represents the amplitude, p is the peak depth position, w refers to the width, β refers to the shape, and γ refers to the skewness term of the profile. The reduced chi-squared, χ^2_{ν} , was 0.43, with the number of degrees of freedom (ν) of 6.

TABLE I
PSF MODELS AND FIT PARAMETERS

Parameter	Gaussian	Skewed Gaussian	1-D Moffat	1-D Skew Moffat
A / counts	14493 ± 397	11806 ± 1569	14924 ± 209	15024 ± 119
μ / cm	80.5 ± 0.3	78 ± 1	80.5 ± 0.1	80.7 ± 0.1
σ / cm	4.3 ± 0.2	5.3 ± 0.7	7.1 ± 0.8	6.0 ± 0.4
β	-	-	2.2 ± 0.3	1.7 ± 0.1
γ / cm ⁻¹	-	1.0 ± 0.5	-	0.015 ± 0.003
χ^2_{ν}	12.8	12.5	1.7	0.4
df	8	7	7	6

calibration is performed. The maximum peak height observed in this work was $(15\,024 \pm 119)$ cph (~4 cps) for a ¹³⁷-Cs point source of activity of 304 kBq. The position of the source is inferred from the fit in 568 Fig. 6 associated with the centroid parameter–, p, to give 569 (80.7 ± 0.1) cm. P1 was positioned at (79.8 ± 0.5) cm, 570 ⁵⁷¹ highlighting a consistent result within the uncertainties ⁵⁷² (relative error $\sim 1\%$).

The width term, w, can be used to estimate the vertical spa-573 tial resolution of the system defined at 50% of the signal and 574 given approximately by $2w_x(2^{1/\beta}-1)^{1/2}$, i.e., (8.5 ± 0.6) cm. 575 The shape terms β and γ determine the rate of change of 576 the width of the distribution (spread of radiation) in relation to 577 the peak position p along the x-axis. These suggest a relative 578 degree of attenuation that photons experience before reaching 579 the sensor, influenced by factors such as shielding or the 580 density of the surrounding media. Since, in this study, the setup 581 was designed to minimize attenuation, the values obtained 582 correspond to this scenario, as per (1.7 ± 0.1) and $(0.015 \pm$ 583 0.003) cm⁻¹ for β and γ , respectively, and are intrinsic to this 584 blind-tube testbed and detector system arrangement. Moreover, 585 the γ value obtained is positive, very small but nonzero, 586 indicating a slight asymmetry in the distribution (steeper on 587 the right side of the peak centroid than the left). This effect 588 may be due to an asymmetric attenuation, i.e., the presence of 589 sensor case, electronics, and the length of the probe case where 590 the MCA is positioned, on the back of the sensor crystal. 591

By analyzing the parameters $(I, p, w, \text{ and } \beta)$ and their corresponding three-standard deviations in both nonskewed and skewed Moffat models (Table I), the results indicate that all the corresponding parameters are similar within the 99.7% confidence range. This implies that the models yield similar fits to the data distribution, which is reasonable given that the obtained γ value is close to zero.

VI. CONCLUSION

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In situ borehole monitoring of radioactivity is an important 600 modality by which both the location and the composition 601 of radioactive contamination entrained in groundwater and 602 geological strata can be probed. However, photon spectra 603 arising from this approach can be complex and varied, and 604 hence, reliable analytical methods are necessary by which 605 individual contributions to them can be estimated. Likewise, 606 the point-spread distribution of photon count data that can arise 607 with depth concerning a particular anomaly can be asymmetric 608 due to inhomogeneities in the borehole surroundings and the 609 influence of the monitoring instrumentation on scatter while 610 in use underground. 611

In this research, the design and development of a prototype 612 borehole monitoring probe and bespoke testbed have been 613 described. The use of these is demonstrated in which the 614 semiempirical model developed by Phillips and Marlow [9] 615 has been combined with development of the Moffat PSF [13] 616 to extract spectroscopic features and localization information, 617 respectively. This approach, combined with the ABACUS 618 BLP, yields a consistent indication of the depth of radioactive 619 source positioned in a bespoke, blind-tube testbed. In future, 620 these approaches will be targeted toward understanding more 621 complicated source distribution scenarios, the proportion and 622 spatial distribution of ¹³⁷Cs and ⁹⁰Sr in aqueous media, and 623 progressing to active testing in the field. 624

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Point-Spread Analysis of γ -Ray/Depth Spectra for Borehole Monitoring Applications

Soraia C. Elísio, Aliyu Bala, Manuel Bandala, James Graham, Alex Grievson, and Malcolm J. Joyce[®], *Member, IEEE*

Abstract—An approach to the analysis of y-ray spectra that might arise as depth profiles from the characterization of 2 radioactivity in boreholes is described. A borehole logging probe, "ABACUS," has been designed and constructed, which comprises a cerium bromide detector and a built-in multichannel analyzer 5 (MCA). This has been tested in a bespoke, laboratory-based 6 testbed built to replicate the borehole environment. An established, semiempirical model has been applied to data arising from the cerium bromide scintillation detector to extract the number 9 of counts under the full-energy peak from each of the resulting 10 y-ray spectra (in this case the 662 keV line from 137 Cs) associated 11 with each depth position, which also enables this information to 12 be isolated from other contributions such as background and 13 the Compton continuum. A complementary approach has been 14 adopted to process the asymmetric and non-Gaussian trend that 15 concerns the full-energy peak count as a function of depth in 16 the borehole testbed for a given depth profile when the testbed 17 is subject to the activity provided by a sealed, ¹³⁷Cs source. 18 This comprises a modified, Moffat point-spread function (PSF). 19 The Moffat function is a continuous probability distribution 20 based on the Lorentzian distribution. Its particular importance 21 is due to its ability to reconstruct PSFs that comprise wings 22 that cannot be reproduced accurately by either a Gaussian or 23 Lorentzian function. This application of the Moffat formalism to 24 radioactive contamination assessment profiles enables an effective 25 26 and accurate assessment to be made of the position of localized radioactivity in the testbed wall. 27

Index Terms— *γ*-ray detection, curve fitting, Gaussian distribution, nuclear measurements, radioactive pollution.

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AQ:1

AQ:2

AQ:3

AQ:4

NOMENCLATURE

31 Glossary

A Amplitude of Gaussian function applied to photopeak.

- *B* Amplitude of step function expressed as a fraction of *A*.
- *b* Offset representing the residual background count.
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- β Parameter governing the shape of a depth profile.
- C Tail function amplitude expressed as a fraction of A.
- *df* Number of degrees of freedom.
- f Spectrum fitting function.
- *G* Gaussian function.
- g Moffat point-spread function (PSF).
- γ Skew parameter of the peak of a depth profile.
- *I* Amplitude of a Moffat PSF.
- μ Centroid of the Gaussian function applied to photopeak.
- *m* Slope of the exponential in the tail function, *T*.
- *N* Number of counts in photopeak.
- *n* Constant in Gaussian integral ensuring 3σ coverage.
- *p* Peak depth position as per centroid components below.
- p_x Centroid in x of an image or depth profile.
- p_y Centroid in y of an image or depth profile.
- *S* Step discontinuity function in photon spectrum.
- *s* Sigmoid-type function describing *x*-axis asymmetry.
- σ Standard deviation of the Gaussian applied to photopeak.
- *T* Tail function applied to photon spectrum.
- w_x Parameter governing the width of a depth profile in x.
- w_{y} Parameter governing the width of a depth profile in y.
- x_0 Central x coordinate of an elliptic profile.
- y_0 Central y coordinate of an elliptic profile.
- x Abscissa denoting photon energy or depth.
- y Parameter orthogonal to depth in Moffat PSF.

I. INTRODUCTION

S OME facilities used for the interim storage of spent nuclear fuel, i.e., ponds and wet silos, were not designed to modern standards and, consequently, radioactivity has leaked from them to ground [1]. This migratory contamination poses a risk to groundwater, public health, and the environment. As a consequence, investigations are necessary to locate it in order to better understand its transport and fate, the associated radiological risk, and to inform site remediation programs.

Often, best practice to assess such situations includes 43 the installation of monitoring wells or boreholes to enable 44 groundwater sampling campaigns and subsequent radiological 45 analysis. Such boreholes usually extend into the ground to 46 intersect the groundwater table and can have, for example, 47 a slotted screen section at a specific depth to allow the water to 48 flow in. Samples are then collected from these penetrations and 49 sent for laboratory analysis; the latter can comprise purification 50 to isolate a target radionuclide followed by spectroscopy. 51

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However, such sampling can be laborious and can result in secondary wastes, whereas, in areas with high dose rates, it can present radiological risks that might be avoided otherwise; neither is it ideal where wells are susceptible to drying out as the opportunity for sampling can then be lost.

Borehole logging is an alternative to sampling to assess 57 radioactivity in the ground and has the potential to provide 58 an in situ, continuous, and real-time assessment of radioactive 59 source distributions. In this context, logging might comprise 60 recording ionizing radiation characteristics as a function of 61 depth in a monitoring well. However, since it was pioneered 62 for geophysical prospecting [2], most reported works have 63 focused on an active application in which radioactivity is used 64 as a tool rather than being the objective of the assessment. The 65 passive assessment of land contaminated with radioactivity via 66 boreholes has received less attention, with works focusing on, 67 for example, the correlation between measurements made on 68 core samples and in boreholes [3]; spectral-shape distinction of 69 cesium-137 and cobalt-60 [4]; high-resolution logging systems 70 [5], [6]; and the analysis radial distributions of cobalt-60 from 71 buried corrosion [7]. 72

Passive borehole measurements can be made either by 73 stepwise recording, while a measurement probe is stationary at 74 selected depths (such as at the water table level for example), 75 or by lowering the probe gradually into a well. In the former, 76 the probe is in direct contact with contamination that might 77 be entrained within water in the well; in the latter, the con-78 tamination is present in the ground (or within ground fluids) 79 surrounding the borehole and does not have to be in direct 80 contact with the probe. However, several limitations remain 81 concerning, for example, the easy recovery of energy spectra 82 with depth information that is accurate and consistent. 83

This article describes the design and test of a logging 84 probe [8] and an associated method to infer the depth of a 85 source of radiation in a borehole environment. A computer-86 implemented method to locate radioactivity in blind tubes 87 is presented, which combines the direct detection of the 88 cesium-137 photopeak with an application of an astrophysical 89 seeing formalism. This is used to derive individual, radioactiv-90 ity depth-profile trends and, hence, enables an estimate for the 91 depth of isolated radioactivity in a laboratory-based, borehole 92 analog to be inferred. 93

II. BACKGROUND

The radiation detected with in situ detector probes in 95 boreholes on land contaminated by products of the nuclear 96 fuel cycle usually comprises γ rays (due to their characteristic 97 98 penetrative strength and the prominent yield of γ -emitting fission products such as cesium-137) and X-rays by way 99 of bremsstrahlung from high-energy β particles from the 100 decay of prominent β -emitters, such as strontium-90. These 101 photons contribute to characteristic, energy-specific lines in 102 a spectrum (full-energy peaks), the Compton background 103 because of scattering, and the lower-energy X-ray region due 104 to bremsstrahlung. 105

The volume investigated in situ approximates typically to a sphere centered on the sensitive volume of the detector in use. The radius of this sphere (corresponding to the depth of investigation) varies with photon energy and the 109 interaction properties of the associated media, i.e., reducing 110 with decreasing photon energy and increasing atomic number 111 of the intervening media. The finite size of the detector may 112 introduce variance from this spherical approximation, and it 113 is anticipated that the properties of the materials constituting 114 the monitoring system and borehole structure can influence 115 the detected bremsstrahlung yield. 116

Sensors used in logging probes have included gas-filled 117 detectors (Geiger-Müller tube-GM), scintillators (such as 118 thallium-doped sodium iodide-NaI:Tl), and semiconductors 119 (i.e., high-purity germanium detectors-HPGe), yielding 120 a range of capabilities from pulse-counting through to 121 spectroscopy. The data from deployment are often presented 122 as a γ -ray depth profile in terms of dose intensity, i.e., total 123 counts, or the proportion of the total γ radiation detected 124 associated with a particular energy (and therefore a specific 125 radionuclide) as a function of depth in the ground, where 126 spectroscopy allows. 127

 γ -ray spectroscopy data accrued as a function of depth are 128 generally more complex than dose or gross count data since 129 they contain more detailed information. This might comprise 130 a first profile based on a total γ -ray log (the sum of all types 131 of radiation contributions) and a second profile of calculated 132 abundancies associated with the radiation from each isotopic 133 contribution. Such a dataset might provide information about 134 spatial distributions of leaks in the ground as a function 135 of depth. The output data can also be presented as a time 136 series, where the logging probe is fixed at a specific depth, 137 recording at different times of the year. These data may 138 provide information about, for example, the temporal flow of a 139 radioactivity migrating in the vicinity of the borehole. A space-140 time compilation of datasets, as well as measurements with an 141 array of monitoring wells, can be essential to monitor local and 142 site-wide mobilization or the remobilization of leaks. 143

Often, downhole γ -ray logging surveys are conducted in 144 blind tubes, which, although having advantages over sam-145 pling methods that require subsequent laboratory analysis, 146 can be challenging due to deployment constraints, limitations 147 of the sensing apparatus, and radiological restrictions where 148 they arise. For example, long-established boreholes on some 149 nuclear sites are lined with carbon steel and can have screen 150 depths of up to 10 m below ground level. They are often 151 blinded (i.e., end-capped and thus sealed) to ensure that 152 direct contact of the probe with the contamination surrounding 153 the blind tube is prevented. While desirable operationally, 154 this arrangement complicates the detection of radiations from 155 α - and β -emitting radionuclides (notwithstanding the potential 156 for bremsstrahlung from the latter). Furthermore, a typical tube 157 radius of \sim 75 mm can limit the range of probes that will 158 fit, recognizing that some radial margin is essential given the 159 imperative that probes do not become stuck while in use. 160

Anthropogenic radioactivity in the ground is often dominated by cesium-137 and strontium-90, and the latter's daughter, yttrium-90. Hence, a system providing dual detection and discrimination of these radionuclides via their photon spectra can have advantages over dose-rate-only datasets. Empirical fitting procedures can be necessary to extract such

spectroscopic features consistently across many spectra and
 to extract the corresponding depth of contamination from the
 depth profile: this is the focus of this work.

III. METHOD

171 A. Photopeak Fitting

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 γ -ray spectra arising from measurements in boreholes can require a model to cater for contributions comprising, for example, a *first* source of radiation that can be somewhat discrete (the predominant radionuclide) and a *secondary*, more continuous contribution representative of a relatively complex background.

Cesium-137 is relatively straightforward to quantify given 178 its 662-keV photopeak; a region-of-interest (ROI) in the energy 179 spectrum can be selected between lower L and upper U 180 energies defined to encompass this. The number of counts 181 within this region is obtained by summing the counts in this 182 histogram or (better) by fitting and integrating the mathemat-183 ical function that best describes it. The latter is usually a 184 Gaussian, depending on the complexity of the spectrum. 185

In addition to the contributions to γ -ray spectra that arise due to photoelectric absorption and the incomplete interactions of photons subsequently escaping the detector crystal, bremsstrahlung arising from β -particle interactions in a steel blind-tube liner might also be characterized.

The semiempirical model applied previously for peak-shape analysis of multichannel pulse-height spectra from highresolution germanium γ -ray detectors [9], [10], [11], [12] has been adopted here to describe and quantify spectra in the vicinity of a peak from a cerium bromide (CeBr₃) scintillator, as per the function, f, represented by a sum of terms defined as follows:

$$f(x) = G(x) + S(x) + T(x) + b$$
 (1)

where x is the abscissa corresponding to photon energy; 199 G(x) is the Gaussian function representing the photopeak; 200 S(x) represents a step discontinuity that may appear in the 201 continuum below the Gaussian peak on its low-energy side; 202 T(x) represents the exponential trend in counts that may 203 appear in the continuum below the Gaussian peak, again, 204 on its low-energy side; and b is an offset corresponding to 205 the residual background level. 206

G(x) is defined in (2) where A is the amplitude of the Gaussian function, μ is the mean, and σ the standard deviation

 $G(x) = Ae^{-\frac{(x-\mu)^2}{2\sigma^2}}.$ (2)

S(x) is defined as per (3) where *B* is the step function amplitude (expressed as a fraction of *A*) and erfc(*x*) is the complementary error function, and the tail function, T(x), is as per (4), where *C* is the tail function amplitude (expressed as a fraction of *A*) and *m* is the slope of the exponential

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$$S(x) = ABerfc\left(\frac{x-\mu}{\sigma\sqrt{2}}\right)$$
(3)

²¹⁶
$$T(x) = ACe^{\frac{x-\mu}{m\sigma}} \operatorname{erfc}\left(\frac{x-\mu}{\sigma\sqrt{2}} + \frac{1}{m\sqrt{2}}\right).$$
(4)

The contribution due to the principal radionuclide over a complex continuum background of radiation is then calculated using (5), where N is then the number of counts corresponding to the photopeak, obtained by calculating the area under the Gaussian, G(x) 221

$$N = \int_{\mu-n}^{\mu+n} G(x) dx$$
 (5) 222

wherein *n* assumes a predetermined constant value indicative ²²³ of a photon-energy interval sufficient to cover 3σ either side ²²⁴ of the photopeak and the uncertainty in the *N* measurement ²²⁵ is obtained by error propagation considering the obtained ²²⁶ standard deviation in the fit variables (from the covariance ²²⁷ matrix). ²²⁸

B. Modeling γ -Ray Log Depth Profiles

The response of a γ -ray logging tool can be represented as 230 the total number of detected γ -ray counts due to the γ -emitting 231 radioactive material present in the volume of investigation or in 232 terms of the constituent proportions derived from analysis of a 233 corresponding γ -ray spectrum. The contribution of individual 234 isotopes can be evaluated and plotted as a function of depth 235 from this analysis, yielding depth profiles for specific γ -ray 236 lines. 237

Typically, a pulse function can be used to represent the 238 variation in response intensity of the logging γ -ray tool as 239 a function of depth in the vicinity of a radioactive anomaly in 240 the ground. This can be interpreted in terms of the hypothetical 241 response of a point detector at an infinitely slow logging speed 242 (depth series) for a uniform zone of contamination. However, 243 the boundaries of a pulse may not be defined sharply and 244 pulses may have irregular shapes due to factors such as logging 245 speed and measurement time, the size of the sensitive volume 246 of the detector, variation of the spatial distribution of the 247 source radioactivity in the bed formation, and changes in the 248 volume of investigation from one measurement to another. 249

Logging tools are often used in boreholes in radioactive 250 areas to locate contamination zones and to determine the 251 distribution of migrating radioactivity from a source, as well 252 as to identify and obtain relative proportions of specific 253 nuclides within a given medium. These objectives can require 254 careful analysis of the overall shape of the depth profile in 255 specific regions where changes in intensity, corresponding to 256 radioactive anomalies, are to be resolved to a sufficient degree. 257

Changes in shape of the intensity profile can be due to a 258 combination of influences such as changes in activity, source 259 dispersion, and the geometry of shielding materials. A source 260 of radiation in a medium can be theorized as an extended 261 homogeneous layer with a notional volume (extended depth 262 vertically and horizontally relative to the orientation of the 263 borehole) or as a point source (such as a "hot" particle) 264 at a vertical/horizontal position to the borehole), as well as 265 heterogeneous sources comprised of various point sources at 266 different positions but within a defined volume [4]. In practice, 267 the distribution of radioactivity in the ground is often complex 268 and may comprise several configurations. 269

A scenario approximating to a point source in the ground, 270 assessed with a single transit of logging system across a 271

range in depth spanning the position of the source, might 272 yield a single peak shape that can be described by simple 273 model with a small number of fitting parameters. A 1-D, 274 PSF is an attractive option for the analysis of discrete photon 275 depth spectra profiles of a point source near to a blind tube. 276 However, such a function should encompass the entire activity 277 profile, including an inner zone (corresponding to the core of 278 the profile) and an outer zone with low numbers of counts 279 present in its "wings." While a Gaussian distribution might 280 serve as a first approximation, the extremities of a profile can 281 be more extensive than this is able to fit self-consistently. This 282 introduces important uncertainties as to the depth at which a 283 radioactive anomaly is discernible from the ambient. 284

An alternative to a Gaussian is the Moffat peak-like distri-285 bution because this accounts for the departure from Gaussian 286 shape in the extremities on either side of the peak. A Moffat 287 distribution is a Lorentzian continuous probability distribution 288 modified with a variable power index. It is often described 289 as a special case of the multivariate student-t distribution, 290 specifically a distribution of a bivariate random variable (x, y)291 centered at zero (or as of the corresponding radius in this con-292 text). It has been used in astrophysics applications [13] to cater 293 for seeing effects (see the following) in stellar profiles and for 294 synapse image analysis concerning the nonuniform scattering 295 of photons across the brain/cranial window of mammals [14]. 296 In astronomy, "seeing" refers to image degradation of an 297 astronomical object caused by atmospheric turbulence [13]. 298 This results in brightness distributions (or radial intensity 299 profiles) in captured, 2-D, ground-based images. Such abnor-300 mal radial intensities can manifest as irregular wings in the 301 point-spread profiles that neither Gaussian nor Lorentzian dis-302 tributions reproduce consistently, whereas a Moffat PSF can. 303 The standard, 2-D, Moffat PSF characterizes a spatial 304 distribution of photons under the assumption of circular sym-305 metry, i.e., a circular aperture, centered at the object centroid, 306 307 as per g, where

$$g(x, y) = I \left[1 + \frac{(x - p_x)^2}{w_x^2} + \frac{(y - p_y)^2}{w_y^2} \right]^{-\beta}$$
(6)

where x and y in this context denote position, I is the 309 amplitude, and p_x and p_y denote the centroid position of the 310 profile in the image. The parameters w_x , w_y , and β account 311 for the effect of photon scattering in a medium between the 312 object and the detector recording the image, often referred to 313 as seeing parameters that govern the width and the shape of a 314 profile, respectively: w is a scale parameter that determines the 315 width of the distribution and radius of a circle $(w = w_x = w_y)$ 316 in a 2-D image projection as per Fig. 1(a); β parameterizes 317 the extent of the wings on either side of the peak of the 318 distribution, correcting the anomalous slope for larger radii. 319 Note that larger values of β result in a steeper slope and, 320 when $\beta \to \infty$, the function tends to a Gaussian. Radii in one 321 axis projection can be calculated from the full-width-at-half-322 maximum as equal to (FWHM/2) = $2w(2^{1/\beta} - 1)^{1/2}$ 323 full-width-at-tenth-maximum or the as equal to 324 $(FWTM/2) = 2w(10^{1/\beta} - 1)^{1/2}$, based on the chosen 325 percentage of the amplitude signal (desired level of 326 significance). The parameter β influences the resulting radius. 327



Fig. 1. Computer-generated images with color schemes representing the varying intensity levels across (x, y) coordinates for (a) symmetrical, (b) elliptical, and (c) asymmetric 2-D Moffat PSFs.

Population studies of dense stellar fields have proposed the 328 use of modified 2-D Moffat PSFs because the spatial bright-329 ness of these distributions exhibits a degree of asymmetry. 330 Analytically, this arises because, for elliptical dispersion, the 331 parameter width is no longer equal for x- and y-projections 332 (and thus $w_x \neq w_y$), as per Fig. 1(b), where the semi-333 major and the semiminor axes (w_x, w_y) are referenced to 334 the central coordinates of the corresponding ellipse (x_0, y_0) . 335 The FWHM varies symmetrically for each axis projection 336 and at any specific inclination angle with the x-axis [15]. 337 Asymmetry in a single-axis projection can be introduced 338 via a position-dependent function in the corresponding width 339 parameter w_x given by a sigmoid-type function s(x) =340 $2w_x/(1+e^{\gamma(x-x_0)})$ for x-axis asymmetry (on the y-axis, the 34 profile is symmetrical). This asymmetric, 2-D, Moffat PSF 342 represents a complex nonelliptical object [16] [see Fig. 1(c)] 343 where $w_x \neq w_y$, and γ regulates the skewness of the peak 344 profile. 345

Considering the photon dispersion depth profile of a vertical, 1-D scan of the simplest, point radioactive source distribution, a 1-D PSF is sufficient. Any eccentricity in the wings (corresponding to a contaminated zone boundary) is characterized by a Moffat PSF; any asymmetry is accounted for via an additional factor to yield a revised expression for *g* as per 351

$$g(x) = I \left[1 + \frac{(x - p_x)^2}{\left(\frac{2w_x}{1 + e^{\gamma(x - p_x)}}\right)^2} \right]^{-\beta}$$
(7) 352

where γ can be positive or negative, to indicate skew to the 353 lower and higher values of a depth maximum, respectively, 354 and null if symmetric, with β and w_x defined as positive. 355 Higher values of β indicate a higher slope of the distribution 356 wings, and higher values of w_x indicate a wider distribution. 357 Note that the calculation of FWHM is more complex in non-358 symmetric cases, as an explicit isolated solution for $(x - p_x)$, 359 and the determination of the radius (in a x-axis projection) 360 requires the application of numerical methods, such as the 361 Newton–Raphson method [17]. However, in instances where 362 the fit yields a very small γ value, the previous FWHM 363 expression can be employed for a quick assessment of the 364 spread. This simplified scenario is used to define baseline 365 values for γ , β , and w_x . Any detraction from these baseline 366 values might suggest an extended or multicomponent source 367 of radioactivity or discrepancies due to photon scatter arising 368 due to density or structural changes of the ground surrounding 369 a given borehole. 370



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Fig. 2. (a) Schematic of the approach showing the borehole (1), the probe (2), tether (3), the pulley unit of the deployment system (4 and 5), and the winch (6) and laptop (7). (b) ABACUS probe unit (size \emptyset 7 × 20 cm) (1) including the detector (size Ø1.5 \times 6.5 cm) (2) and MCA (size 7 \times 4.5 \times 2.6 cm (3). (c) Laboratory setup including the testbed (1), the source ports (2). and the top view of the unit.

IV. MATERIALS AND METHODS

A. Blind-Tube Logging Probe Prototype 372

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The blind-tube logging probe (BLP) used in this work, 373 "ABACUS," as per Fig. 2, comprises a γ -ray spectrometer and 374 a digital multichannel analyzer (MCA) in an outer, cylindrical 375 case. The spectrometer is made up of an inorganic scintillation 376 detector and a silicon photomultiplier (SiPM) in a cylindri-377 cal, compact (physical size of $\emptyset 1.5 \times 6.5 \text{ cm}^2$) hermetic 378 unit (VS-1402-20, commercialized by Scionix, Netherlands). 379 The scintillator is a $\emptyset 9.5 \times 10 \text{ mm}^2 \text{ CeBr}_3$ crystal, and 380 the crystal readout is a $6 \times 6 \text{ mm}^2$ PM6660-SiPM (Ketek 381 GmbH, Germany). The SiPM output is conditioned by a 382 built-in preamplifier to cater for the effect of temperature; the 383 influence of temperature on its light output was not catered 384 for recognizing that the measurements were performed in 385 a laboratory with some temperature compensation. Cerium 386 bromide provides competitive γ -ray detection efficiency (with 387 an effective atomic number, Z_{eff} , of 46, and a density of the 388 material, ρ , of 5.2 g/cm³), energy resolution (3.2%–4% at 389 662 keV), high-count-rate capability (decay time = 17 ns), 390 and radiation hardness ($<10^5$ Gy) [18]. 391

The MCA used in ABACUS is a Topaz-SiPM supplied in a 392 rugged and pocket-size (physical size of $7 \times 4.5 \times 2.6 \text{ cm}^3$) 393 aluminum box with input and output connectors (commercial-394 ized by BrightSpec NV). It is among the smallest, full-featured 395 MCAs currently available and performs pulse-height analysis 396 of the signal from the scintillation detectors to provide energy 397 spectra. It operates on a 5-V low-ripple, low-noise supply for 398 the detector and can be interfaced to a laptop or notebook 399 easily via USB 2.0 communication interface for power supply 400 and data transfer. The unit includes a spectroscopy software 401 interface. Note that by installing the MCA unit in the probe 402 case, the detector output signal is digitalized before being sent 403 to the surface, enabling signal transmission with less noise, 404 distortion, and environmental interference [9]. 405

The probe case has a simple cylindrical geometry and 406 physical dimensions compatible with the dimensions of exist-407 ing blind tubes. The γ -ray spectrometer is fixed parallel to 408

the central axis of the case and centered at the bottom. 409 A collimator is not used, and hence, the detection response is 410 assumed isotropic apart from the top side of the crystal where the electronics is housed. The signal processing module is placed on top of the detector and connected to it via a LEMO¹ connector. The case is made of plastic (\emptyset 70 × 211 mm long) 414 with a top lid with a hole for the USB cable and a hook to 415 aid deployment and recovery when in use. 416

B. Deployment System

A typical deployment system for the ABACUS probe com-418 prises a winch by which the tool is lowered and retrieved, 419 a sheave to add the change of the direction of the cable 420 between the winch and the hole, and a high-resolution encoder 421 for depth measurement. Typical logging cables (multicore 422 wired) provide a combined means of data transfer, power sup-423 ply, and mechanical support. Surface instruments, comprising 424 a data logger or control unit, store the data and are used to 425 control the winch system, to set the position of the probe 426 within a borehole. 427

In the context of this work, a simplified deployment system 428 has been used for laboratory-based tests in which a sheave and 429 encoder are not used, with the probe lowered/raised manually 430 with depth position measured using a hand-held, laser-based 431 distance meter at the top of the blind tube. The logging cable 432 then consists of two separate cables: a rope to support the 433 weight of the probe and a 3-m-long USB cable for data 434 transmission and power supply. 435

C. Blind-Tube Testbed

The blind-tube testbed used in this research is a 437 laboratory-controlled monitoring well designed for radiation 438 detection and photon depth-profile testing. It has been designed 439 to calibrate the BLP response for a variety of scenarios (e.g., 440 simple-to-complex spatial distributions of source and media) 441 before conducting field measurements. 442

The testbed comprises an inner, vertical pipe at the center 443 of an outer pipe fixed in a base, with four smaller tubes 444 intersecting both pipes horizontally, fixed 80 cm from the top. 445 The inner pipe represents the blind tube in this arrangement 446 with the material and size of this pipe selected to replicate 447 legacy blind tubes at nuclear sites, i.e., Sellafield, as close 448 as possible; in this case, blind tubes lined with carbon steel 449 with inner diameters ranging from 75 to 80 mm and wall 450 thicknesses ranging from 6 to 10 mm. The carbon steel tube 451 (European Tubes Ltd., U.K.) is 1.5 m long with an inner 452 diameter of 75 mm and a wall thickness of 9.5 mm. The outer 453 pipe functions as a material retainer or tank. It is 1.5 m long, 454 320 mm in diameter, made of plastic, and designed so that the 455 space between the blind tube and the plastic outer pipe can be 456 filled with material (such as sand) to recreate a vertical ground 457 core, translating to about 113 mm of material surrounding 458 the blind tube (not done in this work). The horizontal tubes 459 create a void in the matrix material to enable sealed radioactive 460 sources to be inserted and removed quickly and easily. 461

In this research, a scenario has been assumed comprising a 462 single point source with the least degree of scattering possible 463

¹Registered trademark

464 between source and detector, with the test pit left empty of 465 material and a sealed source fixed close to the wall of the 466 blind tube.

467 D. Experimental Method

A cesium-137 source with an activity of 304 kBq was 468 inserted into the horizontal tube at position P1 (see Fig. 2). The 469 BLP prototype was then lowered into the blind-tube testbed 470 (described above) and fixed at various depth positions using 471 a rope attached to the top of the testbed. The position of the 472 probe in the pipe, d, relative to the top of the testbed, was 473 determined using a hand-held laser position meter. The meter 474 was placed on top of the tank, with its laser output directed 475 downward toward the top surface of the logging probe. 476

These data were then converted into distance, D, between 477 the top of the pipe and the center of the sensor element 478 by considering the internal dimensions of the probe. Each 479 spectrum was acquired for 1 h to achieve sufficient statistical 480 precision for peak evaluation. The data were transferred via 481 USB 2.0 to a laptop running the γ -ray spectroscopy software, 482 and each spectrum was saved in the text file format. The 483 following sections describe an algorithm written in python² 484 used to analyze each obtained spectrum for a variety of depth 485 positions. 486

AO:5

487 E. γ-Ray Spectral Log Analysis

The analysis was divided into two stages. The photopeak model (1) is used first to characterize the γ -ray spectra recorded by the BLP. Each spectrum is the energy distribution of the photons (γ rays and X-rays) determined at a specific depth within the blind-tube testbed as per Fig. 3. Second, the depth profile fit is performed as per Fig. 4.

The photopeak model has been applied to each spectrum for 494 each depth position, *i*, where increasing values of *i* correspond 495 to increasing depth into the ground or, in this case, the testbed. 496 An ROI defined between a lower L and upper U energy 497 bounds is selected to initialize the method encompassing a 498 peak, i.e., the 662-keV line of cesium-137. Initial U and L 499 values were derived from a typical spectrum: L to the right of 500 501 the Compton edge and U to the right of the photopeak where the count level approaches the level of background noise. 502

Least-squares minimization was used to optimize the fit 503 of f [see (1)] to the data within the ROI at each depth i. The 504 fitting algorithm starts with an initial fitting iteration to obtain 505 initial values for the fit parameters (derived from a typical 506 spectrum) and this is then optimized to obtain the parameters 507 and their associated uncertainties. These values are saved, and 508 the process is repeated for the next position. The method 509 checks for errors in the fitting process (such as a failure of 510 the fit or to find optimal parameters), adjusts where necessary, 511 and repeats the process. 512

The ROI may be adjusted by reducing U by one channel to a lower energy until it equals μ (the centroid of the Gaussian). If the process still fails to fit the data, an error message is registered (since effectively no photopeak is detected) and the method moves on to the next position. Following the fitting



Fig. 3. Flowchart of the spectrum fitting process including the data flow.



Fig. 4. Flowchart of the depth-profile fitting process.

process, (5) is used to calculate the total number of counts N_i 518 corresponding to a number of counts under the photopeak, i.e., 519 indicative of the level of cesium-137 662-keV γ rays detected at each position *i*. 521

The aim of the fitting process is to find values of 522 unconstrained parameters based on a minimization using a 523 Lenvenberg–Marquardt algorithm. In python, this is performed 524 by the function scipy.optimize.curve_fit(); a chi-squared test of 526 independence is used to assess the consistency of a given fit. 526



Fig. 5. Depth versus total counts for a single profile exercise (left) and example spectra for three different positions (right): 30.7, 57.1, and 81.6 cm.

V. RESULTS AND DISCUSSION

The γ -ray spectra obtained with cesium-137 at P1, and with 528 the BLP prototype positioned at specific distances 30 up to 529 130 cm from the top pipe, are shown in Fig. 5. This illustrates 530 that the intensity of the 662-keV peak is greater when the 531 detector is close to the source and decreases when it is further 532 away, as expected, with the highest intensity observed at the 533 shortest possible source-detector separation. A wide scatter 534 535 continuum is observed due to the effect of the surroundings and incomplete photon absorption in the detector crystal. 536

The sum of counts may be obtained by direct summation 537 or by fitting an analytical function to the data. A Gaussian 538 with an additional component to represent the low-energy 539 tailing on the peak, f, was used, as per (1), with parameters 540 as defined earlier. χ^2_{ν} for the fits was ~1, but the algorithm 541 fails to fit peaks of small amplitude (<15 counts). This error 542 arises from the failure of the optimization algorithm to achieve 543 convergence within the specified number of iterations and may 544 be attributable to the model's complexity and the presence 545

of noise on a low amplitude photopeak. Note that applying 546 moderate smoothing techniques, such as the Savitzky–Golay 547 filter [19], on spectra with low photopeak amplitudes prior to 548 optimization process may address this issue and, consequently, 549 enhance the accuracy of the profile encompassing the limits of 550 the γ -ray depth profile (not done in this work). Fig. 6 shows 551 an example of a fit for cesium-137. The number of counts 552 under the peak N_p was extracted by integrating the Gaussian 553 component of the optimized function (1), between 3σ on either 554 side of the μ -peak value, plotted against the detector position 555 in the blind-tube testbed, as per Fig. 6. These data describe 556 an asymmetric PSF akin to astrophysical problems and have 557 been fit with a Moffat function, g, with a skew component, 558 as per (7), where the parameters are as defined earlier. Fig. 6 559 suggests an acceptable fit incorporating the asymmetric trend, 560 which is superior when compared to Gaussian-type models 561 (see Table I). 562

The amplitude term, I, can be used to estimate the activity or concentration of cesium-137 in the sample, provided that 564



Fig. 6. Schematic of the depth profiling process (left) with an example spectrum (right, top) including the combination of fits comprising (1) and the depth profile obtained from an experimental scan (right, bottom) with the modified Moffat PSF fit as per (7), with the corresponding fit parameters: *I* represents the amplitude, p is the peak depth position, w refers to the width, β refers to the shape, and γ refers to the skewness term of the profile. The reduced chi-squared, χ^2_{ν} , was 0.43, with the number of degrees of freedom (ν) of 6.

TABLE I					
PSF MODELS AND FIT PARAMETERS					

Parameter	Gaussian	Skewed Gaussian	1-D Moffat	1-D Skew Moffat
A / counts	14493 ± 397	11806 ± 1569	14924 ± 209	15024 ± 119
μ / cm	80.5 ± 0.3	78 ± 1	80.5 ± 0.1	80.7 ± 0.1
σ / cm	4.3 ± 0.2	5.3 ± 0.7	7.1 ± 0.8	6.0 ± 0.4
β	-	-	2.2 ± 0.3	1.7 ± 0.1
γ / cm ⁻¹	-	1.0 ± 0.5	-	0.015 ± 0.003
χ^2_{ν}	12.8	12.5	1.7	0.4
df	8	7	7	6

calibration is performed. The maximum peak height observed in this work was $(15\,024 \pm 119)$ cph (~4 cps) for a ¹³⁷ Cs point source of activity of 304 kBq. The position of the source is inferred from the fit in 568 Fig. 6 associated with the centroid parameter , p, to give 569 (80.7 \pm 0.1) cm. P1 was positioned at (79.8 \pm 0.5) cm, 570 ⁵⁷¹ highlighting a consistent result within the uncertainties ⁵⁷² (relative error $\sim 1\%$).

The width term, w, can be used to estimate the vertical spa-573 tial resolution of the system defined at 50% of the signal and 574 given approximately by $2w_x(2^{1/\beta}-1)^{1/2}$, i.e., (8.5 ± 0.6) cm. 575 The shape terms β and γ determine the rate of change of 576 the width of the distribution (spread of radiation) in relation to 577 the peak position p along the x-axis. These suggest a relative 578 degree of attenuation that photons experience before reaching 579 the sensor, influenced by factors such as shielding or the 580 density of the surrounding media. Since, in this study, the setup 581 was designed to minimize attenuation, the values obtained 582 correspond to this scenario, as per (1.7 ± 0.1) and $(0.015 \pm$ 583 0.003) cm⁻¹ for β and γ , respectively, and are intrinsic to this 584 blind-tube testbed and detector system arrangement. Moreover, 585 the γ value obtained is positive, very small but nonzero, 586 indicating a slight asymmetry in the distribution (steeper on 587 the right side of the peak centroid than the left). This effect 588 may be due to an asymmetric attenuation, i.e., the presence of 589 sensor case, electronics, and the length of the probe case where 590 the MCA is positioned, on the back of the sensor crystal. 591

⁵⁹² By analyzing the parameters $(I, p, w, \text{ and } \beta)$ and their ⁵⁹³ corresponding three-standard deviations in both nonskewed ⁵⁹⁴ and skewed Moffat models (Table I), the results indicate that ⁵⁹⁵ all the corresponding parameters are similar within the 99.7% ⁵⁹⁶ confidence range. This implies that the models yield similar ⁵⁹⁷ fits to the data distribution, which is reasonable given that the ⁵⁹⁸ obtained γ value is close to zero.

VI. CONCLUSION

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In situ borehole monitoring of radioactivity is an important 600 modality by which both the location and the composition 601 of radioactive contamination entrained in groundwater and 602 geological strata can be probed. However, photon spectra 603 arising from this approach can be complex and varied, and 604 hence, reliable analytical methods are necessary by which 605 individual contributions to them can be estimated. Likewise, 606 the point-spread distribution of photon count data that can arise 607 with depth concerning a particular anomaly can be asymmetric 608 due to inhomogeneities in the borehole surroundings and the 609 influence of the monitoring instrumentation on scatter while 610 in use underground. 611

In this research, the design and development of a prototype 612 borehole monitoring probe and bespoke testbed have been 613 described. The use of these is demonstrated in which the 614 semiempirical model developed by Phillips and Marlow [9] 615 has been combined with development of the Moffat PSF [13] 616 to extract spectroscopic features and localization information, 617 respectively. This approach, combined with the ABACUS 618 BLP, yields a consistent indication of the depth of radioactive 619 source positioned in a bespoke, blind-tube testbed. In future, 620 these approaches will be targeted toward understanding more 621 complicated source distribution scenarios, the proportion and 622 spatial distribution of ¹³⁷Cs and ⁹⁰Sr in aqueous media, and 623 progressing to active testing in the field. 624

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