Shortwave infrared detection of medical radioisotope Cerenkov 1 luminescence 2 3 Benedict E. Mc Larney^{1,2}, Qize Zhang^{1,2}, Edwin C. Pratt^{1,2}, Magdalena Skubal^{1,2}, Elizabeth 4 5 Isaac^{1,2}, Hsiao-Ting Hsu^{1,2}, Anuja Ogirala^{1,2}, Jan Grimm^{1,2,3,4,5,*} 6 7 1. Molecular Pharmacology Program, Memorial Sloan Kettering Cancer Center, New York, 8 NY, USA 9 2. Molecular Imaging Therapy Service, Memorial Sloan Kettering Cancer Center, New 10 York, NY, USA 3. Pharmacology Program, Weill Cornell Medical College, New York, NY USA 11 4. Department of Radiology, Memorial Sloan Kettering Cancer Center, New York, NY, USA 12 5. Department of Radiology, Weill, Cornell Medical Center, New York, NY, USA 13 14 * . Corresponding author: Jan Grimm - grimmj@mskcc.org 15 16 17 First Author: Benedict Edward Scholar), +16468883101, Мс Larney (Resarch 18 mclarneb@mskcc.org 19

20 ABSTRACT

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22 Rationale: Medical radioisotopes produce Cerenkov luminescence (CL) from charged subatomic particles ($\beta^{+/-}$) travelling faster than light in dielectric media (e.g. tissue). CL is a blue-weighted 23 24 and continuous emission, decreasing proportional to wavelength. CL imaging (CLI) provides an 25 economical PET alternative with the advantage of being able to image β^{-} and α emitters. Like any 26 optical modality CLI is limited by the optical properties of tissue (scattering, absorption and 27 ambient photon removal). Shortwave infrared (SWIR, 900 – 1700 nm) CL has been detected from MeV linear accelerators but not yet from KeV medical radioisotopes. Methods: Indium gallium 28 29 arsenide (InGaAs) sensors and SWIR lenses were mounted onto an ambient light excluding 30 preclinical enclosure. An exposure and processing pipeline was developed with SWIR CLI then 31 performed across 6 radioisotopes at in vitro and in vivo conditions. Results: SWIR CL was detected from the clinical radioisotopes: ⁹⁰Y, ⁶⁸Ga, ¹⁸F, ⁸⁹Zr, ¹³¹I and ³²P (biomedical research). 32 SWIR CLI's advantage over visible (VIS, 400 - 900 nm) CLI is shown via increased light 33 34 penetration and decreased scattering at depth. The radioisotope SWIR spectrum, sensitivity limits 35 (8.51 kbg/µL of ⁶⁸Ga) and preclinical feasibility with ex vivo and in vivo examples are reported. 36 Conclusion: This work shows that radioisotope SWIR CLI can be performed with unmodified 37 commercially available components. SWIR CLI has significant advanatges over VIS CLI with preserved VIS CLI features such as radioisotope radiance levels and dose response linearity. 38 39 Further improvements in SWIR optics and technology are required to enable widespread 40 adoption. 41

42 **Keywords:** SWIR, Cerenkov, luminescence, radioisotopes, preclinical

44 **INTRODUCTION**

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46 Subatomic relativistic particles generate CL in dielectric media.(1) The particle polarizes 47 surrounding molecules, which generate luminescence upon relaxation (2) with CL being UV 48 weighted. CL production decreases exponentially with increasing wavelength $(1/\lambda^2)$.(3) CL's 49 intensity - but not the spectrum profile - is correlated to the energy of the emitted particle and has 50 been utilized in astrophysics, nuclear physics, and recently in biomedical imaging. (4.5) CL 51 imaging (CLI) is a cost- and time-effective positron emission tomography (PET) alternative for 52 surface-weighted imaging, e.g. for triaging patients into those who do not need a PET and those 53 who do.(2,6,7) CLI has focused on CL detection from clinical beta ($\beta^{+/-}$) emitting radioisotopes and 54 linear accelerators (LINAC).(4,8,9) Preclinical discoveries and development of novel targeted 55 radiotracers, dosimetry and radiotherapy-based treatments have been aided by CLI.(10,11) 56 Clinical CLI has also found applications in image guided surgery for margin detection, determining 57 the clinical uptake of radiotracers and real time dosimetry readings. (7, 12-15)

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59 Single photon sensitive devices responsive to the CL spectrum are readily available, providing 60 low dark and read noise optical devices.(2) However, visible wavelengths (VIS, 400 – 900 nm) 61 suffer significant drawbacks in pre/clinical settings. Endogenous chromophores limit the 62 achievable VIS CL penetration depths with scattering further reducing resolution, contrast and 63 sensitivity of VIS CLI at depth. (16, 17) Optical imaging has shifted to longer wavelengths where 64 light absorption and scattering are reduced. (18) Near infrared (NIR) imaging (>650 nm) reduces 65 absorption by ~2 orders of magnitude. (16.19) Studies employed dyes and nanoparticles for red shifted conversion of CL.(20-22) SWIR imaging has shown tissue absorption, scattering and 66 autofluorescence are of negligible levels. (23) SWIR's advantages for resolution and contrast have 67 68 been shown via clinically approved indocyanine green. (24) Förster resonance energy transfer based SWIR CL has been achieved via X-ray excited nanoprobes and LINAC excited emission 69 70 of quantum dots.(20.25-27) LINAC SWIR CLI has been performed without secondary emitters 71 showing improvements over VIS-NIR CLI.(28) Radioisotopes produce an order of magnitude less 72 CL than LINACs and are therefore more demanding to image (LINAC: 6 to 24 MeV, ⁶⁸Ga: 0.836 73 MeV).(29-32) Radioisotope CLI requires complete exclusion of ambient light, efficient optical 74 imaging systems and cannot be pulse synchronized in its acquisition like LINAC CLI. (30,33) The 75 already low CL radiance of radioisotopes is even further reduced at SWIR wavelengths, 76 magnifying the difficulty of SWIR CL detection.(3) Nevertheless, SWIR CLI from radioisotopes 77 was achieved via unmodified and commercially available imaging components and revealed 78 defined advantages over VIS CLI.

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80 MATERIALS AND METHODS

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Radioisotope SWIR Setup83

84 SWIR CLI was achieved via commercially available InGaAs focal plane arrays (NIRVana 640) 85 TE, Princeton Teledyne, NJ, USA or ZephIR 1.7x, Photon etc Inc., Montreal, Canada) and SWIR 86 lens set to f/1.4 (SWIR-16, Navitar, NY, USA or 8mm SWIR lens, #83-815, Edmund Optics, NJ, USA) mounted on an enclosure, Figure 1. Figures 1, B - E acquired without optical filters, 87 88 (NIRVana 640 TE, 900 – 1700 nm).(34) All other figures employed a 650nm or 900 nm O.D. 4.0 89 long pass (LP) filter (Edmund Optics #84-759 and #84-764, NJ, USA). Acquisition (90, 10s frames 90 (15mins)) was controlled via respective acquisition software. Dark noise was recorded and 91 subtracted for each sensor. White light (WL) images, acquired with room lights on, enclosure door 92 open, room lights with SWIR spectral emission (Pentron 3000K, Osram Sylvania, MA, USA)).(35) 93 Radioisotopes were imaged in containers within a lead pig. Black posterboard (TB5, Thorlabs, 94 NJ, USA) was used to absorb CL and allow y particles to pass.

96 Determining the Radioisotope SWIR CLI Temporal Resolution and Emission Spectrum

97 98 SWIR CL temporal resolution and spectrum were determined using 370 Mbq of ³²P in 1 ml of 99 water (β^- : average 0.695MeV, t_{1/2} 14.3 days, NEX060005MC, Perkin Elmer, MA, USA). 90 frame 100 acquisitions at respective exposure times were performed, Figure 1D and Supplemental Figure 101 1. The limit of detection was defined when SWIR CL was not determinable from the noise. LP 102 filters (1000-1500 nm in 100 nm steps (FELH1000:100:1500, SM1L03 and SM1A57, Thorlabs, 103 NJ, USA) elucidated the radioisotope spectrum.

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105 Image Processing and Statistical Analysis106

107 Fiji (ImageJ 2.0, (36)) was used for image processing, Suppelementary Figure 2. Darknoise 108 was subtracted from the data with binning (8x8, to improve sensitivity), median filtering (outlier, y 109 strike removal), FFT bandpass transformations (artifact removal) and background subtraction 110 applied.(37) Images were resized for WL overlays. Statistical analysis, graphing: performed in 111 GraphPad Prism9 (GraphPad Software LLC, CA, USA). Statistical analyses and replicate 112 information are shown in all cases. Radiance was calculated via gray values corrected for isotope concentration (kbq/µL) and field of view (FOV, cm²). Full width half maximum measurements were 113 114 carried in MATLAB (2020b, Mathworks Inc., USA).

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116 Silica Nanoparticle Radiolabeling and Injection

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Silica nanoparticles (SiNPs) were labeled with ⁶⁸Ga or ⁹⁰Y as described.(*38*) Silica nanoparticles (SiNPs) were incubated with free isotope at a pH of 8.8 for 60 mins, on a thermomixer at 70°C and 500 rpm. Radiolabeled SiNPs were resuspended in 30 µl of saline for footpad injection.

122

123 Preclinical SWIR CLI

124 125 All experiments were carried out in accordance with Institutional Animal Care and Use 126 Committee (IACUC) guidelines at MSKCC and the NIH Guide for the Care and Use of Laboratory Animals. 3% isoflurane in 100% O2 v/v followed by 1-2% isoflurane in 100% O2 v/v for 127 128 maintenance for anesthesia, euthanasia was performed using CO₂ in accordance with approved protocols. All mice (n = 13 in total, FoxN1^{NU}, Stock #069, Envigo, USA) were suitably housed with 129 130 food and water ad libitum. 1x10⁶ 4T1 cells (ATCC, CRL-2539) suspended in 30 µl of Matrigel 131 (Corning, #354234) into the fourth mammary pad generated xenograft mice (n = 4). 132 Supplementary Figure 3. 3 euthanised xenografted mice were injected (blinded) with up to 166.5 133 Mbg of ¹⁸F-FDG with one mouse acting as a negative control. 1 euthanized mouse was injected 134 into the footpad with ⁶⁸Ga labeled SiNPs. 4 mice were injected with ⁹⁰Y labeled SiNPs with an 135 additional one mouse acting as a negative control for in vivo experiments.

- 136 137 **RESULTS**
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139 Confirmation of SWIR CL Detection from Radioisotopes

The SWIR CLI radioisotope setup is shown (Figure 1A) detecting ⁶⁸Ga suspended in 0.1M HCI.(*39,40*). Figure 1B top right, shows the processed SWIR CL image overlaid onto the WL image. This demonstrates that SWIR signal is coming from ⁶⁸Ga and that the processing steps sufficiently removed strikes whilst retaining CL signals. CL detection is further confirmed by a lack of signal when cardboard was placed over the sample, Figure 1B, blocking light but not the highly

energetic photons from ⁶⁸Ga's decay (e.g. 511 & 1077 keV). The ⁶⁸Ga source was further moved 146 147 and detected around the FOV, decaying in the process, visible via a decreasing SWIR signal, following the decay half life of the isotope. Manual regions of interest (ROI) were measured to 148 determine the signal intensity (gray values) of the sensor for each position and timepoint. SWIR 149 CLI showed quantitative linearity to ⁶⁸Ga levels like VIS CLI.(4) We then successfully detected 150 four additional radioisotopes under comparative conditions: ³²P,¹⁸F, ⁸⁹Zr and ¹³¹I, Figure 1 and 151 152 Supplementary Figure 4. The SWIR radiance of each was calculated as before (Figure 1) with 153 values corrected for concentration (kbq/µL) and spatial FOV (cm²). SWIR CLI readily 154 differentiated the tested radioisotopes in line with VIS CLI, as shown by the p values in Figure 155 2B.(41,42) Theoretically ⁶⁸Ga has a higher radiance than ³²P however, the increasd sensor strikes from 511 & 1077 keV photons by ⁶⁸Ga prevent SWIR CLI from confirming this as the setup did 156 157 not incorporate lead shielding.(42)

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SWIR CLI Radioisotope Temporal Detection Limit and Emission Spectrum

160 161 System characterization was performed using ${}^{32}P(\beta)$ with concentrations used to facilitate 162 SWIR CLI at a temporal resolution of 0.25s, Figure 1 and Supplemental Figure 1. ³²P's radiance 163 and half-life enabled determination of the radioisotope SWIR CL emission spectrum.(42) No filter 164 (>920nm, spectral response of the sensor) and LP filtered acquisitions (1000-1500 nm, 100 nm 165 steps) were carried out. This sensor has a non-thinned indium phosphide (InP) substrate bandgap 166 (1.35 eV) preventing detection of light <920 nm whilst the bandgap of InGaAs (0.75 eV) results in 167 a shortpass cutoff at 1700nm. (43-45) The radioisotope SWIR CL spectrum is shown in Figure 1E 168 with intensity exponentially decreasing (one phase exponential decay, $R^2 = 0.9812$), as expected 169 and reported for VIS CLI and LINAC SWIR CLI.(2,28) Detection above 1400nm is challenging 170 due to system noise, lens ineffieniency and water absorption, see Figure 1E and F and 171 Supplemental Figures 1 and 7.(19,46)

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173 Reduced Scattering via SWIR CLI over VIS CLI174

175 55.5 Mbg of ⁹⁰Y in an Eppendorf (β^{-} emitter, Avg 0.94 MeV, t_{1/2} 64h in 200 µl of saline) was 176 imaged on both the SWIR and IVIS® (VIS CLI, 400 - 900 nm) imaging systems to assess the advantages of SWIR CLI. ⁹⁰Y is clinically administered from 0.500 to 5.291 Gbg to treat primary 177 liver cancer (HCC) and metastases in the liver.(47,48) Scattering medium (raw chicken breast, 0, 178 179 10 and 15 mm) was placed over the source prior to CLI being performed. Respective exposure 180 times without scattering medium (VIS CLI: 10s, SWIR CLI: 900s) were maintained at all depths. 181 SWIR CLI shows an improvement in resolution compared to VIS CLI when imaging through 182 scattering tissue (Figure 2). In SWIR CLI the Eppendorf shape is consistent up to 15 mm of tissue 183 whilst it is distorted and enlarged over five times from scatter in VIS CLI. SWIR CLI provides 184 greater resolution at depth over VIS CLI for radioisotope location. This accuracy is demonstrated 185 by the full width half maximum (FWHM) measurements of 6.38, 13.05 and 33.64 mm for VIS CLI 186 and 6.24, 6.40 and 7.04 mm for SWIR CLI at 0, 10 & 15 mm of tissue, respectively (Figure 2).

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8 SWIR CLI Radioisotope Sensitivity Limits *in vitro* and *ex vivo*

Commercial SWIR sensors are insensitive to light <920nm without InP cap thinning. In systems with InP thinning the sensor has a largely increased range, but is rather insensitive compared to EMCCDs. One such SWIR sensor (Zephir 1.7x, Photon Etc., Canada) was used with significantly reduced QE in the VIS range (~25% at 600 nm). The sensor enabled a comparison of the spatial localization of radioisotope VIS-SWIR (400 – 1700 nm), NIR-SWIR (650 – 1700 nm) and SWIR (900 – 1700 nm) CLI. ⁶⁸Ga conjugated SiNPs (in 30 µl of saline) opposite a non-radiolabeled SiNP control were imaged at VIS-SWIR, NIR-SWIR, and at SWIR for numerous half-lives via appropriate LP filters. The detected CL signals are localized to the radiolabelled SiNPs throughout the spectrums (Supplemental Figure 5A-D). The detection limit of radioisotope SWIR CLI is at 259 kbq (8.51 kbq/µL) for ⁶⁸Ga labelled SiNPs (Figure 3 A-B), with theoretical limits for isotopes tested here in SWIR CLI shown in Table 1.(*42*)

Next, the tissue SWIR CLI detection limit was assessed. A euthanized mouse received 30 μl
 respective paw injections of varying ⁶⁸Ga-SiNPs activities. As can be seen in Figure 3C–D, ⁶⁸Ga SiNPs were detected via SWIR CLI at 403.3 kbq, within clinically administerd levels (~148
 Mbq).(49)

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206 In vivo Detection of Radioisotope SWIR CLI207

208 ⁹⁰Y conjugated to SiNPs was used for *in vivo* SWIR CLI radioisotope detection.(38) ⁹⁰Y has been shown to improve the SNR of CL detection over e.g. ¹⁸F or ⁶⁸Ga due to reduced y sensor 209 210 strikes.(50) The long exposure times for SWIR CLI contaminatinated the SWIR CL image with 211 thermal signatures (removed in post processing via rolling ball background subtraction), complicating SWIR CLI over VIS CLI. Mice were injected with ~7.4 Mbg of ⁹⁰Y labeled SiNPs into 212 a single footpad and imaged 3 hours later. ⁹⁰Y is administered clinically for radioembolization at 213 214 activities ranging from 500 to 5291 Mbg.(47,48) The resulting SWIR CLI signal was readily 215 detected over background thermal signatures present in vivo (n = 4 mice; Figure 4 and Supplemental Figure 6). Footpad injected radiolabeled SiNPs slowly migrate through the 216 lymphatic system (48 hrs) preventing CL contamination of the endogenous thermal signature. (38) 217 218 Respective residual thermal signatures remaining post background subtraction from each mouse 219 were used to divide the image producing measurements in terms of signal to thermal background 220 ratio (SBR; Supplemental Figure 2). SBRs from injected mice ranged from 1.68 to 4.63 with a 221 mean of 3.07, see Figure 4B. 222

DISCUSSION

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225 This work aimed to detect the theoretical SWIR CL emission from clinical radioisotopes via 226 commercially available components (Supplemental Figure 7). To date SWIR CL has only been 227 detected from LINAC sources which produce an order of magnitude brighter CL.(25,28) The 228 devised setup and enclosure provided ambient light-free imaging. (51,52) The state of the art TEC 229 SWIR sensors used in our study produces 2 to 3 orders of magnitude higher dark noise compared 230 to EMCCD-based cameras. This intrinsic noise within the SWIR setup, an obstacle not only for 231 SWIR CLI, has been the main limiting factor throughout this work. (53) In addition, the even further 232 reduced light output at longer wavelengths necessitated longer exposure times (minutes versus 233 seconds for VIS CLI). Nevertheless, the six radioisotopes we explored produced detectable SWIR 234 CL (Figure 1), with relative radiances in line with VIS CLI.(3,41,42) SWIR CLI performed linearly 235 with radioisotope levels (Figures 1, and 3). SWIR CLI radioisotope sensitivity was found to be 259 236 kbq (8.51 kbq/µL) in vitro and 403.3 kbq in tissue with ⁶⁸Ga. VIS CLI is four orders of magnitude 237 more sensitive, with ⁶⁸Ga detection reported at 0.00333 kbg/µL.(54) The insensitivity of SWIR CLI 238 limits applications with the current generation of SWIR cameras. However, its advantage of 239 reduced scattering in combination with the increased transmission of CL in the SWIR region 240 (Figure 2 and Supplemental Figure 7), potentially paired with SWIR-void room lighting, could open new applications for SWIR CLI (28) that benefit from improved radioisotope resolution at depth. 241 242 Combining the strengths of InGaAs (900 – 1700 nm) and silicon (400 – 900 nm) based sensors would open further applciations for CLI and is worth investigaing. (16, 19, 46, 55, 56). Assuming 243 244 sufficient radioisotope levels, SWIR CLI can be performed close to video rates (0.25s; Figure 1). 245

The detected radioisotope SWIR CL spectrum was found to be in line with the SWIR LINAC spectrum. (*28*) Similarly to SWIR LINAC CL, detection of theoretically emitted CL above 1400 nm

could not be reliably detected likely due to sensor noise and water absorption (Supplemental
Figure 7). However, the advantage of wavelengths above 1400 compared to 900-1300 nm is
unclear for SWIR CLI in any case due to the increased absorption of water above 1300
nm.(*19,46*).

253 The preclinical applicability of SWIR CL was investigated and initially focused on the ex vivo 254 SWIR CLI of intratumorally injected ¹⁸F-FDG, see Supplemental Figure 3. ¹⁸F's weak CL (26x dimmer than ⁶⁸Ga) required one hour acquisition times for accurate signal detection.(42,54) ⁹⁰Y 255 256 was used to overcome the limitations of ⁶⁸Ga and ¹⁸F for this investigation (very little γ emission, brighter CL, longer half-life than ⁶⁸Ga, 64.2 hrs vs 1.13 hrs).(2,41) ⁹⁰Y labeled SiNPs were injected 257 into the footpad of live mice for in vivo SWIR CLI detection. (38) Mice were imaged 3 hours post 258 259 injection (~7.4 Mbg of ⁹⁰Y-SiNPs) together with a non-injected control mouse. Exposure times of 260 15 mins provided a reliable SWIR CL signal that was detected over endogenous thermal signature 261 and inherent noise, see Figure 4. 262

263 CONCLUSION264

265 Our study presents the first example and proof of principle of *in vivo* radioisotope SWIR CLI 266 detection. Considering the optical properties of tissue it has been shown that the majority of CL 267 emitted from tissue at depth is above 600 nm.(3,16) Therefore, the ideal radioisotope CL camera 268 would be one that combines the spectral range of thinned SWIR sensors (600 - 1700 nm) with 269 the photon sensitivity of EMCCD based sensors. Future iterations of SWIR CLI should aim to 270 tackle its main limitations via a faster lens and dark noise reduced camera sensor to improve 271 overall sensitivity along with lead shielding to further increase sensitivity via v strike reduction. 272 Such components would be highly custom and outside the scope of this proof of principle work. Human eyes respond to light from ~400 to ~700 nm and by changing ambient lighting to non-273 274 SWIR emitting LEDs, radioisotope SWIR CLI could be performed in a well lit room and without 275 the need for a dark enclosure, as achieved for LINAC CLI.(7,30) This would directly impact 276 preclinical CLI which is a common, fast and cost-effective PET alternative for novel radiotracers 277 and treatment tracking.(57,58) However, significant improvements are required in SWIR optics 278 and technology before this can be realized.

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289 Author Contributions290

BML: system setup, experiment design and execution, imaging and analysis. QZ: SiNP radiolabeling. MS, EI, HH and AO: aided *in vivo* experiments. BML, ECP and JG: study design. All authors: experimental setup, experimental procedures, data interpretation and presentation and manuscript writing. The authors declare no conflicts of interest.

296 **KEY POINTS**

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This is the first work to show SWIR CLI (900 – 1700 nm) from radioisotopes which has so far only been detected from LINACs, orders of magnitude brighter.

300

301 This work detected SWIR CLI via commercially available components from numerous

302 pre/clinical radioisotopes with the radiances and spectrum performing in a manner contiguous
 303 with VIS CLI (400 – 900 nm).

- 305 SWIR CLI has distinct advantages over VIS CLI in terms of reduced scattering and absorption
- 306 at depth however, significant technological and optical improvements are required for 307 comparable sensitivity.
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- 309 **REFERENCES**
- 310

316

Čerenkov P. Visible light from pure liquids under the impact of γ-rays. Paper presented at:
 CR (Dokl.) Acad. Sci. URSS, 1934.

- 314 **2.** Ciarrocchi E, Belcari N. Cerenkov luminescence imaging: physics principles and potential 315 applications in biomedical sciences. *EJNMMI physics.* 2017;4:1-31.
- Glaser AK, Zhang R, Andreozzi JM, Gladstone DJ, Pogue BW. Cherenkov radiation fluence
 estimates in tissue for molecular imaging and therapy applications. *Physics in Medicine & Biology.* 2015;60:6701.
- 320
- Ruggiero A, Holland JP, Lewis JS, Grimm J. Cerenkov luminescence imaging of medical
 isotopes. *Journal of Nuclear Medicine*. 2010;51:1123-1130.
- 323

S. Contalbrigo M, Kubarovsky V, Mirazita M, et al. The CLAS12 ring imaging Cherenkov
 detector. Nuclear Instruments and Methods in Physics Research Section A: Accelerators,
 Spectrometers, Detectors and Associated Equipment. 2020:163791.

- Mitchell GS, Gill RK, Boucher DL, Li C, Cherry SR. In vivo Cerenkov luminescence imaging:
 a new tool for molecular imaging. *Philosophical Transactions of the Royal Society A:*Mathematical, Physical and Engineering Sciences. 2011;369:4605-4619.
- 331

332 7. Pratt EC, Skubal M, Mc Larney B, et al. Prospective testing of clinical Cerenkov
 333 luminescence imaging against standard-of-care nuclear imaging for tumour location. *Nature* 334 *Biomedical Engineering*. 2022:1-10.
 335

- 3368.Tamura R, Pratt EC, Grimm J. Innovations in nuclear imaging instrumentation: Cerenkov337imaging. Paper presented at: Seminars in nuclear medicine, 2018.
- Miao T, Bruza P, Pogue BW, et al. Cherenkov imaging for linac beam shape analysis as a
 remote electronic quality assessment verification tool. *Medical physics*. 2019;46:811-821.
- 342 **10.** D'Souza JW, Hensley H, Doss M, et al. Cerenkov luminescence imaging as a modality to
 343 evaluate antibody-based PET radiotracers. *Journal of Nuclear Medicine*. 2017;58:175-180.
 344
- Lohrmann C, Zhang H, Thorek DL, et al. Cerenkov luminescence imaging for radiation dose
 calculation of a 90Y-labeled gastrin-releasing peptide receptor antagonist. *Journal of Nuclear Medicine.* 2015;56:805-811.
- 348

349 **12.** Olde Heuvel J, de Wit-van der Veen BJ, van der Poel HG, et al. (68)Ga-PSMA Cerenkov
 350 luminescence imaging in primary prostate cancer: first-in-man series. *European journal of nuclear* 351 *medicine and molecular imaging.* 2020;47:2624-2632.

353 **13.** Thorek DL, Riedl CC, Grimm J. Clinical Cerenkov luminescence imaging of 18F-FDG. *Journal* 354 of Nuclear Medicine. 2014;55:95-98.

- Grootendorst MR, Cariati M, Pinder SE, et al. Intraoperative assessment of tumor
 resection margins in breast-conserving surgery using 18F-FDG Cerenkov luminescence imaging:
 a first-in-human feasibility study. *Journal of Nuclear Medicine*. 2017;58:891-898.
- 359

363

355

Jarvis LA, Zhang R, Gladstone DJ, et al. Cherenkov Video Imaging Allows for the First
 Visualization of Radiation Therapy in Real Time. *International Journal of Radiation* Oncology*Biology*Physics. 2014;89:615-622.

- 364 16. Jacques SL. Optical properties of biological tissues: a review. *Physics in Medicine & Biology*. 2013;58:R37.
- 367 **17.** Yaroshevsky A, Glasser Z, Granot Ee, Sternklar S. Transition from the ballistic to the 368 diffusive regime in a turbid medium. *Optics letters.* 2011;36:1395-1397.
- 369

372

366

370**18.**Ding F, Zhan Y, Lu X, Sun Y. Recent advances in near-infrared II fluorophores for371multifunctional biomedical imaging. *Chemical science*. 2018;9:4370-4380.

- **19.** Cao Q, Zhegalova NG, Wang ST, Akers WJ, Berezin MY. Multispectral imaging in the extended near-infrared window based on endogenous chromophores. *Journal of biomedical optics.* 2013;18:101318.
- 376

382

- Thorek DL, Ogirala A, Beattie BJ, Grimm J. Quantitative imaging of disease signatures
 through radioactive decay signal conversion. *Nature medicine*. 2013;19:1345.
- Zhang Q, Pratt EC, Tamura R, et al. Ultrasmall Downconverting Nanoparticle for Enhanced
 Cerenkov Imaging. *Nano Letters.* 2021;21:4217-4224.
- Pratt EC, Shaffer TM, Zhang Q, Drain CM, Grimm J. Nanoparticles as multimodal photon
 transducers of ionizing radiation. *Nature nanotechnology*. 2018;13:418-426.
- 385
 386 23. Thimsen E, Sadtler B, Berezin MY. Shortwave-infrared (SWIR) emitters for biological
 387 imaging: a review of challenges and opportunities. *Nanophotonics.* 2017;6:1043-1054.
- Carr JA, Franke D, Caram JR, et al. Shortwave infrared fluorescence imaging with the
 clinically approved near-infrared dye indocyanine green. *Proceedings of the National Academy of Sciences.* 2018;115:4465-4470.
- 392

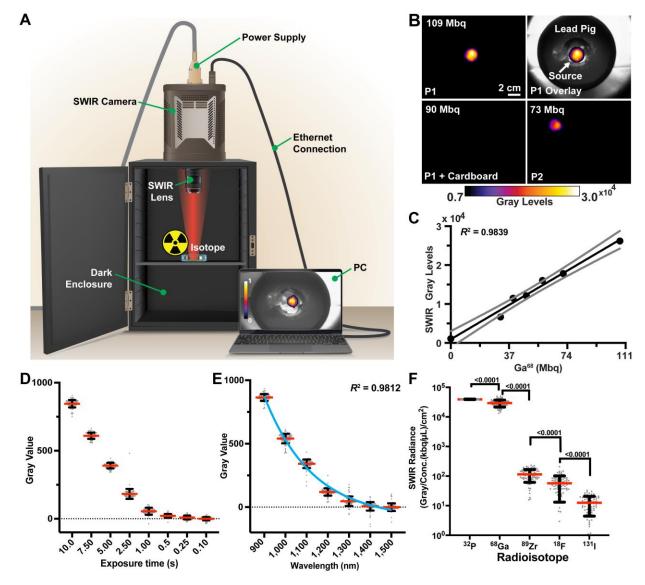
388

393 25. Naczynski DJ, Sun C, Türkcan S, et al. X-ray-induced shortwave infrared biomedical
 394 imaging using rare-earth nanoprobes. *Nano letters*. 2015;15:96-102.
 395

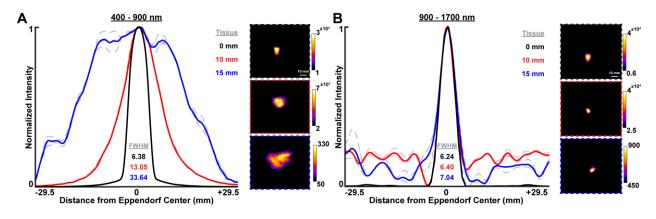
396 26. Cao X, Jiang S, Jia MJ, et al. Cherenkov excited short-wavelength infrared fluorescence 397 imaging in vivo with external beam radiation. Journal of biomedical optics. 2018;24:051405. 398 399 27. Dothager RS, Goiffon RJ, Jackson E, Harpstrite S, Piwnica-Worms D. Cerenkov radiation 400 energy transfer (CRET) imaging: a novel method for optical imaging of PET isotopes in biological 401 systems. PloS one. 2010;5:e13300. 402 403 28. Cao X, Jiang S, Jia M, et al. Observation of short wavelength infrared (SWIR) Cherenkov 404 emission. Optics letters. 2018;43:3854-3857. 405 406 29. Glaser AK, Zhang R, Gladstone DJ, Pogue BW. Optical dosimetry of radiotherapy beams 407 using Cherenkov radiation: the relationship between light emission and dose. Physics in Medicine 408 & Biology. 2014;59:3789. 409 410 30. Glaser AK, Zhang R, Davis SC, Gladstone DJ, Pogue BW. Time-gated Cherenkov emission 411 spectroscopy from linear accelerator irradiation of tissue phantoms. Optics Letters. 412 2012;37:1193-1195. 413 414 31. Browne E. Commonly used radioactive sources. The European Physical Journal C, Particles 415 and Fields. 2000;15:190-190. 416 417 32. Pritychenko B, Běták E, Kellett M, Singh B, Totans J. The nuclear science references (NSR) 418 database and web retrieval system. Nuclear Instruments and Methods in Physics Research Section 419 A: Accelerators, Spectrometers, Detectors and Associated Equipment. 2011;640:213-218. 420 421 33. Tendler II, Hartford A, Jermyn M, et al. Experimentally observed cherenkov light 422 generation in the eye during radiation therapy. International Journal of Radiation Oncology* 423 Biology* Physics. 2020;106:422-429. 424 425 34. Huang Y-H, Yang C-C, Peng T-C, et al. 10-Gb/s InGaAs pin photodiodes with wide spectral 426 range and enhanced visible spectral response. IEEE Photonics Technology Letters. 2007;19:339-427 341. 428 429 Elvidge CD, Keith DM, Tuttle BT, Baugh KE. Spectral identification of lighting type and 35. 430 character. Sensors. 2010;10:3961-3988. 431 432 36. Schindelin J, Arganda-Carreras I, Frise E, et al. Fiji: an open-source platform for biological-433 image analysis. Nature methods. 2012;9:676-682. 434 435 37. Walter J. FFT-filter. Available at: http://rsbinfonihgov/ij/plugins/fft-filterhtml. 2001. 436 437 38. Shaffer TM, Wall MA, Harmsen S, et al. Silica nanoparticles as substrates for chelator-free 438 labeling of oxophilic radioisotopes. Nano letters. 2015;15:864-868. 439

440 39. Darr C, Harke NN, Radtke JP, et al. Intraoperative 68Ga-PSMA Cerenkov luminescence 441 imaging for surgical margins in radical prostatectomy: a feasibility study. Journal of Nuclear 442 Medicine. 2020;61:1500-1506. 443 444 40. Banerjee SR, Pomper MG. Clinical applications of Gallium-68. Applied Radiation and 445 Isotopes. 2013;76:2-13. 446 447 41. Beattie BJ, Thorek DL, Schmidtlein CR, Pentlow KS, Humm JL, Hielscher AH. Quantitative 448 modeling of Cerenkov light production efficiency from medical radionuclides. PloS one. 449 2012:7:e31402. 450 451 42. Gill RK, Mitchell GS, Cherry SR. Computed Cerenkov luminescence yields for radionuclides 452 used in biology and medicine. *Physics in Medicine & Biology*. 2015;60:4263. 453 454 43. Martin T, Dixon P. InGaAs sees infrared and visible light. Laser focus world. 2004;40:109-455 111. 456 457 44. Williamson JB, Carey KW, Kellert F, Braum D, Hodge L, Loncasty D. High-density, planar 458 Zn-diffused InGaAs/InP photodetector arrays with extended short-wavelength response. IEEE 459 Transactions on Electron Devices. 1991;38:2707. 460 461 45. Hoelter TR, Barton JB. Extended short-wavelength spectral response from InGaAs focal 462 plane arrays. Paper presented at: Infrared Technology and Applications XXIX, 2003. 463 464 46. Carr JA, Aellen M, Franke D, So PT, Bruns OT, Bawendi MG. Absorption by water increases 465 fluorescence image contrast of biological tissue in the shortwave infrared. Proceedings of the 466 National Academy of Sciences. 2018;115:9080-9085. 467 468 47. Kim SP, Cohalan C, Kopek N, Enger SA. A guide to 90Y radioembolization and its dosimetry. 469 Physica Medica. 2019;68:132-145. 470 471 48. Fidelman N, Kerlan Jr RK, Hawkins RA, et al. Radioembolization with 90Y glass 472 microspheres for the treatment of unresectable metastatic liver disease from chemotherapy-473 refractory gastrointestinal cancers: final report of a prospective pilot study. Journal of 474 gastrointestinal oncology. 2016;7:860. 475 476 49. Demirci E, Toklu T, Yeyin N, et al. Estimation of the organ absorbed doses and effective 477 dose from 68Ga-PSMA-11 PET scan. Radiation protection dosimetry. 2018;182:518-524. 478 479 Carpenter CM, Ma X, Liu H, et al. Cerenkov luminescence endoscopy: improved molecular 50. 480 sensitivity with β --emitting radiotracers. *Journal of Nuclear Medicine*. 2014;55:1905-1909. 481 482 51. Alsheikh H. [P091] Investigation of cherenkov imaging using IVIS bioluminescence 483 scanner. Physica Medica: European Journal of Medical Physics. 2018;52:127.

484 485 52. Spinelli AE, Kuo C, Rice BW, et al. Multispectral Cerenkov luminescence tomography for 486 small animal optical imaging. Optics Express. 2011;19:12605-12618. 487 488 53. Fraenkel R, Berkowicz E, Bikov L, et al. Development of low-SWaP and low-noise InGaAs 489 detectors. Paper presented at: Infrared Technology and Applications XLIII, 2017. 490 491 54. de Wit-van der Veen B, Vyas K, Tuch D, Grootendorst M, Stokkel M, Slump C. Performance 492 evaluation of Cerenkov luminescence imaging: a comparison of 68Ga with 18F. EJNMMI physics. 493 2019;6:1-13. 494 495 55. Zhang H, Salo DC, Kim DM, Komarov S, Tai Y-C, Berezin MY. Penetration depth of photons 496 in biological tissues from hyperspectral imaging in shortwave infrared in transmission and 497 reflection geometries. Journal of biomedical optics. 2016;21:126006. 498 499 56. Golovynskyi S, Golovynska I, Stepanova LI, et al. Optical windows for head tissues in near-500 infrared and short-wave infrared regions: Approaching transcranial light applications. Journal of 501 biophotonics. 2018;11:e201800141. 502 503 57. Xu Y, Chang E, Liu H, Jiang H, Gambhir SS, Cheng Z. Proof-of-concept study of monitoring 504 cancer drug therapy with Cerenkov luminescence imaging. Journal of Nuclear Medicine. 505 2012;53:312-317. 506 507 58. Liu M, Zheng S, Zhang X, et al. Cerenkov luminescence imaging on evaluation of early 508 response to chemotherapy of drug-resistant gastric cancer. Nanomedicine: Nanotechnology, 509 *Biology and Medicine.* 2018;14:205-213. 510 511 512

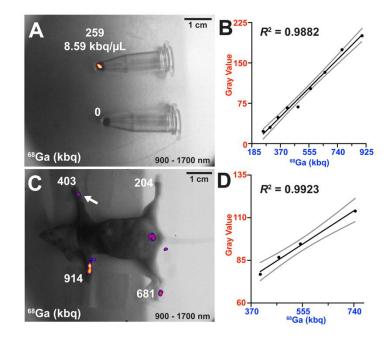


515 Figure 1. SWIR CL radioisotope imaging setup and characterization. A) A dark enclosure was 516 used for all imaging. 16mm or 8mm f/1.4 SWIR lens was mounted on the camera. ©2022 Memorial 517 Sloan Kettering Cancer Center. All rights reserved. B) Linearity assessment of the camera via 68Ga imaged at positions (P1, P2) across the FOV, P1 + Cardboard confirming detection was not a result 518 of y strikes. C) SWIR gray levels and corresponding ⁶⁸Ga activity (Mbq). Linear regression and 95% 519 confidence intervals are shown, Pearson $R^2 = 0.9839$ and two-tailed p value <0.0001. SWIR CLI is 520 linearly responsive and quantitative as found with VIS CLI. D) ³²P SWIR gray value intensity in relation 521 to exposure time changes E) Graphical representation of the radioisotope (³²P) SWIR CL emission 522 spectrum from 900 to 1500 nm, blue line: one phase exponential decay function, $R^2 = 0.9812$. Inherent 523 524 system noise, low photon production and water absorption prevents detection >1400 nm. F) Descending radioisotope radiance (³²P, ⁶⁸Ga, ¹⁸F, ⁸⁹Zr and ¹³¹I) corrected for concentration (kbg/µL) 525 526 and spatial FOV. Students t-test (upaired, two-sided) p values are shown. In all cases, the mean (red line), standard deviation (black lines) and individual measurements (n = 90 technical replicates, gray 527 528 dots) are shown, excluding negative values.





531 Figure 2. Reduced scattering via SWIR CLI over VIS CLI A) Left, Normalized VIS CLI (400 -532 900 nm) line intensity profiles from the phantom setup. FWHMs increase with scattering tissue 533 depth at 0, 10 and 15 mm with respective FWHMs of 6.38, 13.05 and 33.64 mm. Right, representative VIS CLI images. B) Left, Normalized SWIR CLI line intensity profiles of 90Y 534 (Eppendorf, 55.5 Mbg in 200 µL of saline) at increasing scattering tissue (chicken breast: 0, 10 535 536 and 15 mm), full width half maximums (FWHM) of 6.24, 6.40 and 7.04 mm. Right, representative 537 SWIR CL images. In all cases three seperate line measurements are made from the images at 538 each depth (dotted lines) with the mean shown (solid line).



541 Figure 3. In vitro and ex vivo SWIR CLI radioisotope sensitivity limit for ⁶⁸Ga radiolabeled

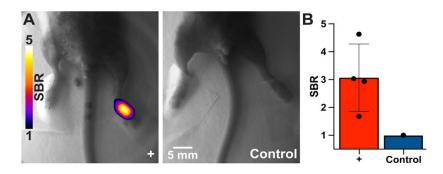
542 **SiNPs.** A) SWIR CLI radioisotope in vitro detection limit for ⁶⁸Ga-SiNPs post multiple half-lives.

543 B) SWIR CLI decay tracking to the limit of detection linear regression (solid black line, $R^2 = 0.9882$)

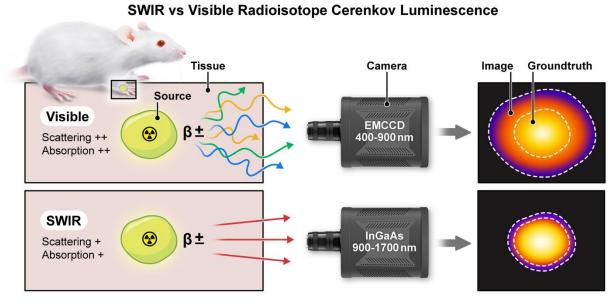
544 and 95% confidence intervals are shown (dotted gray lines). C) The ex vivo SWIR CLI (900 –

545 1700 nm) limit of detection for ⁶⁸Ga labeled SiNPs. The detection limit slightly worsens in tissue 546 compared to in vitro imaging (~140 kbg less sensitive). D) Linear regression analysis (R^2 =

- 546 compared to in vitro imaging (~140 kbq less sensitive). D) Linear regression analysis ($R^2 = 0.9923$) of the ex vivo SWIR CLI of the ⁶⁸Ga labeled SiNPs to the limit of detection (403.3 kbq, C)
- 548 paw labeled with white arrow.



- 549 550
- Figure 4. In vivo SWIR CLI detection of ⁹⁰Y labeled SiNPs three hours post injection into the footpad A) Left, Representative images of a mouse injected (+) with ⁹⁰Y labeled SiNPs (~7.4 551
- 552
- Mbq). Right, image of a control mouse without any injection. C) Quantified SBR values of injected 553 (n = 4) vs control mice (n = 1). All images are shown in respective signal to background ratios
- 554
- 555 (SBR).

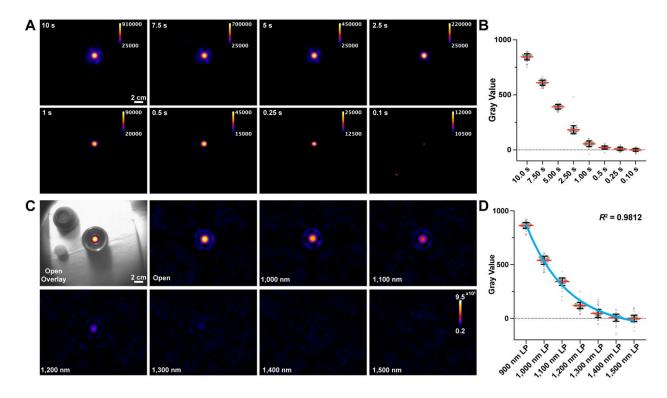


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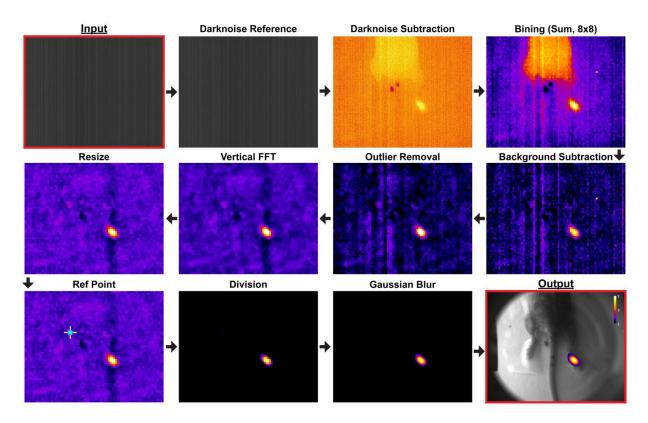
Supplemental Material: Shortwave infrared detection of medical radioisotope Cerenkov luminescence

Benedict E. Mc Larney^{1,2}, Qize Zhang^{1,2}, Edwin C. Pratt^{1,2}, Magdalena Skubal^{1,2}, Elizabeth Isaac^{1,2}, Hsiao-Ting Hsu^{1,2}, Anuja Ogirala^{1,2}, Jan Grimm^{1,2,3,4,5,*}

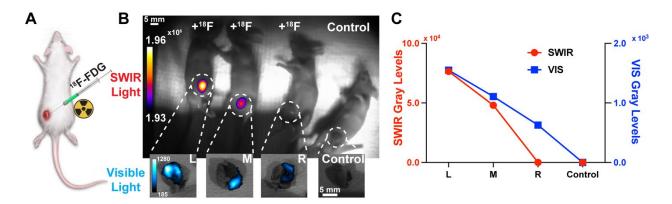
- 1. Molecular Pharmacology Program, Memorial Sloan Kettering Cancer Center, New York, NY, USA
- 2. Molecular Imaging Therapy Service, Memorial Sloan Kettering Cancer Center, New York, NY, USA
- 3. Pharmacology Program, Weill Cornell Medical College, New York, NY USA
- 4. Department of Radiology, Memorial Sloan Kettering Cancer Center, New York, NY, USA
- 5. Department of Radiology, Weill, Cornell Medical Center, New York, NY, USA
- * . Corresponding author: Jan Grimm grimmj@mskcc.org



Supplemental Figure 1. SWIR CLI radioisotope temporal detection limit and emission spectrum A) Representative SWIR CL images at varying exposure times. SWIR CL was detected at acquisition speeds of up to 0.25s. B) Gray value intensity in relation to exposure time changes C) The SWIR CL emission spectrum of ³²P is shown D) Graphical representation of the radioisotope SWIR CL emission spectrum from 900 to 1500 nm, the line represents a one phase exponential decay function, $R^2 = 0.9812$. Inherent system noise, low photon production and water absorption prevents detection >1400 nm. A) and C) each panel comprises the summation of n = 90 technical replicates. B) and D) each replicate (gray dots, n = 90, technical), mean (red line) and standard deviation (black lines) are shown.

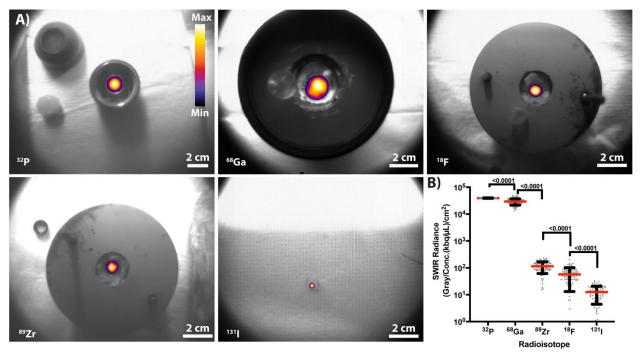


Supplemental Figure 2. Image processing pipeline for in vivo SWIR CLI. Images are presented from input to output including all necessary processing steps to generate the *in vivo* images. The input is based on a summation of n = 90, 16-bit, 10s images (900s/15 mins total acquisition time). Post darknoise subtraction images were processed in 32-bit formats. Rolling ball background subtraction was employed to remove endogenous thermal signal. Gaussian blur was applied with a sigma of 3.

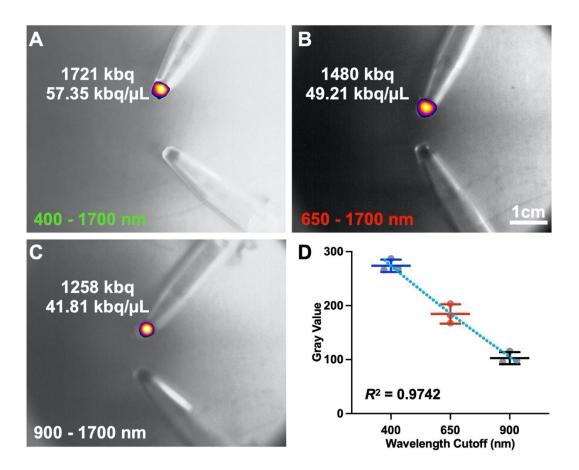


Supplemental Figure 3. Ex vivo SWIR CLI and VIS CLI comparison of 4T1 xenografted mice intratumorally injected with clinical ¹⁸F-FDG A) Euthanized mice were injected with ¹⁸F-FDG directly into the tumor. B) The corresponding image of 3 mice injected with ¹⁸F-FDG and one control mouse. Top, SWIR CL image, bottom VIS CL images of resected tumors (IVIS) C) Gray Value Cerenkov intensities for each tumor in both SWIR and visible light modalities (background subtracted). For B) and C) SWIR images and data points are summations from n = 360 technical replicates and visible images are from a single acquisition from n = 3 ¹⁸F-FDG intratumorally injected mice and n = 1 non-injected mouse (biological replicates).

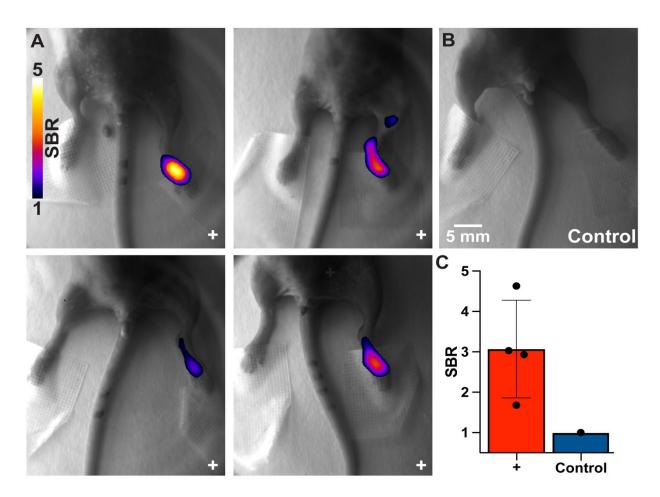
Initial experiments assessed the application of preclinical SWIR CLI with ¹⁸F-FDG. The inherent noise in the SWIR sensor and lower CL intensity of ¹⁸F (β average 0.25 MeV), required that ¹⁸F-FDG be injected on the order of a hundred Mbq to be detected in a murine setting. Experimentation in this format spatially concentrated the source further enabling detection (intratumoral injection, see Supplemental Figure 2A). It should be noted this is not representative of conventional CLI. Imaging was carried out post euthanasia and following the immediate injection of ¹⁸F-FDG into the tumor. As shown in Supplemental Figure 2B, three mice were administered ¹⁸F-FDG (with varying amounts up to 166.5 Mbq). The fourth mouse received no injection (negative control). Mice were imaged over the course of an hour (360 frames, 10s each) with SWIR CL detected in two mice. Tumors were resected post SWIR CLI and imaged on a conventional VIS CLI system (IVIS, 400 – 900 nm), see Supplemental Figure 2B, bottom row. The corresponding gray values are plotted for both modalities in Supplemental Figure 2C. In the case of the left (L), middle (M) and control (Control) mice the values are in close agreement.



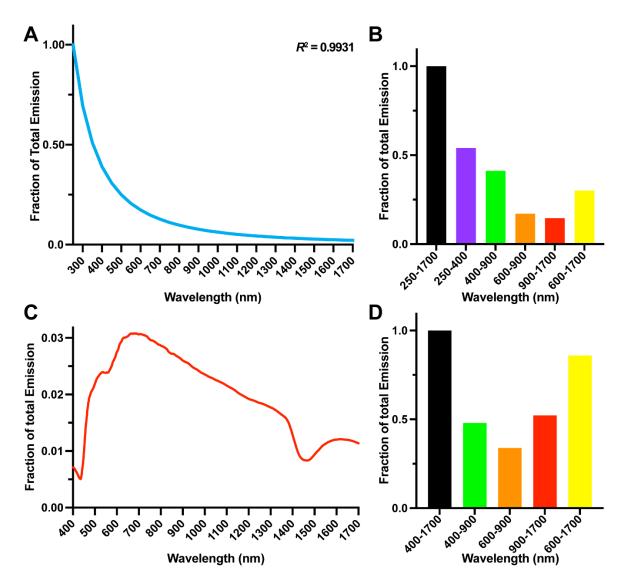
Supplemental Figure 4. SWIR CLI of a variety of medical radioisotopes. A) Representative SWIR CLI images for ³²P, ⁶⁸Ga, ¹⁸F, ⁸⁹Zr and ¹³¹I. Images are respectively thresholded and represents the summation of n = 90 technical replicates. B) Descending radioisotope radiance corrected for concentration (kbq/µL) and spatial FOV. Students t-test (upaired, two-sided) p values are shown. Mean (red line), standard deviation (black lines) and individual measurements (n = 90 technical replicates, gray dots) are shown, excluding negative values.



Supplementary Figure 5 SWIR CLI radioisotope localization for ⁶⁸**Ga radiolabeled SiNPs.** A) VIS-SWIR (400-1700 nm) image of ⁶⁸Ga-SiNPs (Top) and non-radiolabeled SiNPs (Bottom). B) NIR-SWIR (650-1700 nm) image of the phantom as in A). C) SWIR (900-1700 nm) image of the phantom as in A). D) Decay corrected spectral emission profile of ⁶⁸Ga-SiNPs, technical replicates (gray dots, n = 3), median, SD and a fitted one phase exponential decay (dotted line, $R^2 = 0.9742$) are shown.



Supplemental Figure 6. In vivo SWIR CLI detection of ⁹⁰Y labeled SiNPs three hours post injection into the footpad A) Images of mice injected (+) with ⁹⁰Y labeled SiNPs (~7.4 Mbq per mouse). B) Image of a control mouse without any injection. C) Quantified values of injected (n = 4) vs control mice (n = 1). All images are shown in respective signal to background ratios (SBR). A, Top left and Cntrl mouse are the same image as shown in Main Figure 4.



Supplemental Figure 7. Theoretical Frank-Tamm Cerenkov emission from 250 – 1700 nm with and without absorption in terms of detector responses (400 - 1700 nm). A) The exponential decay of light produced by Cerenkov emission calculated from 250 – 1700 nm. The emission decreases at a rate of $1/\lambda^2$ with theoretical emission to 1700nm. The R² value represents the goodness of fit for an exponential one phase decay. B) The fraction of theoretical light emitted at each of the relevant bands used in this work. Firstly the entire emission for both EMCCDs (silicon based) and SWIR (InGaAs based). Secondly the 250 – 400 nm band (UV) of which the EMCCD is not sensitive totalling 0.54 of the light. The 400 – 900 nm band, EMCCDs responsive wavelengths, totalling 0.411 of the emitted light. The 600 – 900 nm band, which represents the majority of the emission of CL from tissue detected by EMCCDs comprises 0.171 of the light and the 900 – 1700 nm band (SWIR) totalling 0.146 of the emitted light. Finally the 600 – 1700 nm band which represents the gross total theoretical CL emission from tissue totalling 0.301 of the light. C) The theoretical CL emission in terms of the optical transmission of tissue within the spectral response of the detectors used in this work (400 – 1700 nm). The optical transmission of 1mm of rat cortex was used as a reference.[40,41] Notable transmission losses are present between 400 – 600 nm due to hemoglobin absorption and at 1380 – 1590 nm due to water absorption. D) The normalized CL emission detection spectrum across similar bands as those in

B. When incorporating tissue transmission the 400 - 900 band captures 0.48 of the total light, 600 – 900 nm band captures 0.34. Interestingly the 900 – 1700 nm band captures 0.52 of the emitted CL and the 600 – 1700 nm band captures 0.86 of the total light. This highlights the advantage of SWIR CL imaging in tissue and also the recommended development of sensors with extended range to capture the 600 – 1700 nm spectrum. Note this data does not incorporate the true spectral response of EMCCDs or SWIR sensors and assumes 100% quantum efficiency in the relevant bands. The data does also not account for the inherent noise of either detectors nor the optical losses of respective VIS and SWIR lenses.

Radioisotope	Total Photon Yield	SWIR Detection Limit (kbq/µL)
⁹⁰ Y	47.3	6.19
³² P	28.1	10.41
⁶⁸ Ga	33.9	8.63
⁸⁹ Zr	2.29	127.75
¹⁸ F	1.32	221.63
¹³¹	0.669	437.3

Table 1. The current radioisotope detection limits for SWIR CLI. The detection limit for the radisotopes tested in this work are given. Minimum levels are shown based on the detected ⁶⁸Ga level of 8.63 kbq/µL and calculated via previously reported relative radiance levels.[3,41]