- Overcoming tissue specular reflection
- challenges in micro camera endoscopy for
- in-vivo clinical applications
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Abstract: Surgical guidance and diagnostics by diffuse optical imaging using micro camera 16 technology at the tip endoscopic probes have the potential to act as intra-operative supportive 17 tools for clinicians. Micro camera probes need to address undesirable specular reflections in 18 order to be clinically relevant. In this work we overcome specular reflections caused by the glossy 19 uneven tissue surface. We adapt and compare two techniques for miniaturised probes designed 20 to view tissue. Two camera probes are developed using different modalities to remove these 21 surface reflections, with line-of-sight to further miniaturisation. 1) The multi-flash technique 22 illuminates the sample from four different positions, causing a shift in reflections which is filtered 23 out in a post processing image reconstruction step. 2) The cross polarisation technique integrates 24 orthogonal polarisers on to the tip of the illumination fibres and camera, respectively, to filter out 25 the polarisation maintaining reflections. These form part of an imaging system that is capable 26 of rapid image acquisition using different illumination wavelengths. The system is validated 27 on tissue mimicking phantoms with high surface reflection, as well as excised human breast 28 tissue. It is demonstrated that both methods effectively remove the specular reflections, revealing 29 previously hidden underlying information. The methods demonstrate two effective options for 30 improving image quality in miniaturised systems, for human and machine observers, in a surgical 31 setting. 32

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#### 1. Introduction 34

In a clinical setting, bio-photonic techniques play a role as complementary methods which 35 can increase the breadth of diagnostic options, with quick turnaround spot testing that can aid 36 clinical decisions. Gathering data for evidence-informed decisions, in particular in a fast paced 37 medical environment, can be in competition with acquisition time and the volume of potential 38 data available. Therefore evidence should be available quickly when and where it is needed and 39 be relevant to the task performed [1,2]. In vivo diagnostic imaging methods such as diffuse 40 optical imaging [3,4], diffuse reflectance spectroscopy [5–8], fluorescence imaging [6,9], optical 41 coherence tomography [10] and *in vivo* microscopy [11] are being seeing continual development 42 as medical diagnostic techniques. Applications range across medical disciplines, from screening, 43 to tumour margin detection and surgical guidance, and many techniques have been adapted into 44

medical devices seeing real world use. In order to fit into the clinical workflow these technologies 45 are now being integrated into handheld or endoscope based imaging probes, paving the way 46 for their introduction into clinical settings. Such integrated sensorised probes are usually either 47 fibre [12–14] or camera [15, 16] based. For example, camera based hyperspectral imaging probe, 48 as well as camera based surgical pen type fluorescence probes for diagnosing tumour status, are 49 being researched. Currently, different imaging probes are being researched for usability in tumor 50 imaging [17] and fluorescence guided surgery [5]. Breast cancer is an example where handheld 51 probes have suggested use cases [18]. The development of sub-mm sized micro cameras such as 52 the AMS NanEye device offers a promising platform for small footprint medical imaging and 53 work to develop applications is ongoing [19, 20]. The main advantage of a camera on the tip of an 54 endoscopic probe is in providing flexibility for the user. Such a device can aid and complement 55 decision making by potentially acting as the sensor as well as providing a guidance image. 56

Due to variations in camera light sensitivity and frequent operation in dark environments in 57 the body, medical imaging probes require external illumination. The ability to deliver various 58 wavelengths to the target, for targeting specific bio-markers, controlling penetration depth, and 59 multi and hyper-spectral imaging applications are of interest for tissue imaging. Illumination is 60 often provided by means of distally mounted LEDs, or in the case of this paper using optical 61 fibres. The use of a point sources for illumination causes specular reflections. These reflections 62 are direct reflections from the surface and preserve the polarisation of the illumination source. 63 The glossy and smooth tissue surface and clinical lighting environment lead to large specular 64 reflections, which can obstruct vision in particular in the most popular feature analysis domain. 65 that of a colour [21]. 66

Because of the necessity to provide clear data to clinicians and image processing algorithms, 67 the image should be free from such undesirable artefacts. Additionally, a pixel saturated by 68 specular reflection retracts from the information available in that area, and underlying features 69 that may be of interest become unavailable for viewing. Image processing algorithms in particular 70 may produce errors in algorithms that segment and detect shapes [22]. Therefore minimising or 71 eliminating the effects of specular reflections should be a priority for image based probes. A 72 number of techniques to remove specular reflections exist [23]. These are either software or 73 hardware based. One such multiple image based approach uses multiple illumination points 74 to shift the specular reflections in subsequent images of a scene. This allows for a mixed 75 software and hardware based approach which eliminates overlapping and partially overlapping 76 reflections [24, 25]. This multi-flash approach collects more light and does not require expensive 77 filters. A purely hardware based approach uses linear polarisers in an orthogonal, or crossed, 78 arrangement, to remove specular reflections. This is a well-known technique that has seen wide 79 commercial adoption in professional photography and eye wear. It has also seen use in removal 80 corrupting glare from hyperspectral images [26] and been shown to have application in medical 81 tissue images [4, 12]. The deterioration of polarisation state occurs rapidly in tissue due to 82 multi-scattering events. Orthogonal polarization imaging uses the fact that direct reflections as 83 well as single scattering events are polarisation maintaining [27]. However, as light propagates 84 through tissue and enough scattering events take place the polarisation state is lost. The rate 85 of loss is dependent on the polarisation state of the incident light. The background theory and 86 further details on de-polarisation of light in tissue is well described in the literature [28–32]. By 87 linearly polarising the incoming light, while detecting with an orthogonal polariser, the diffusely 88 reflected component of the light can effectively be filtered. 89

The objective of this work is study these aspects of diagnostic potential to guide developments that can provide the clinician with tools for rapid imaging and decision making, with line of sight to diagnostics, by developing a micro camera based platform that is capable of overcoming the challenges of specular reflections. There has not been any clear study to determine which of these two techniques is better for tissue imaging to reduce specular reflection. The importance of specular reflection removal to fully image subsurface structures in optical diagnostic imaging,

<sup>96</sup> and the depth dependence of this imaging has not been studied.

Scope for miniaturisation is desirable, as well as the possibility to extend device capability into 97 other domains aside from traditional imaging, such as sensing. This means delivery of multiple 98 wavelengths and fibre connectivity to enable multi-modality. In this paper, the groundwork for a 99 clinical imaging system is presented. Two imaging probes with fundamentally different specular 100 reflection removal techniques are presented in the context of clinical tissue images. Images of 101 phantoms and tissue are acquired, and both specular reflection removal methods are demonstrated 102 to effectively preserve information from pixels that were saturated by specular reflection. An 103 analysis of imaging depth vs illumination wavelength for different techniques is performed. A 104 light source capable of custom variable illumination is used for illumination and a control code 105 ensures rapid data acquisition. The ability to image using microcameras through diced polarisers 106 is demonstrated. 107

# 108 2. Materials and Methods

# 109 2.1. Multi-flash illumination micro-imager probe

A schematic of the experimental imaging probe is shown in Figure 1. A 1.0x1.0 mm<sup>2</sup> AMS 110 NanEYE RGB micro-camera, with field-of-view (FOV) 90° and F# 2.7, is integrated into a 111 3D printed handheld imaging probe. Four, 0.5 NA, 400  $\mu$ m core diameter illumination fibres 112 (Thorlabs FP400ERT) are positioned concentrically around the camera, at a distance of 2.4 mm, 113 to provide uniform illumination with the intention of maximising the illuminated FOV of the 114 camera sensor from each fibre position. This arrangement also allows for further miniaturisation. 115 The illumination fibres are separated to ensure overlap between the emitted light cones, both 116 for maximising illumination power in the case of all four fibres being used for illumination 117 and ensuring that the multi-flash algorithm functions correctly by shifting the light cone with 118 subsequent flashes. 119

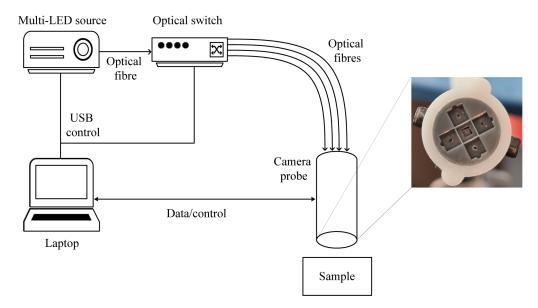


Fig. 1. Schematic diagram of the experimental arrangement for the multi-flash measurements and close up view of the multi-flash probe showing central camera sensor and concentrically arranged illumination fibres.

The optical fibres allow light to be delivered to the sample from four slightly offset illumination 120 locations. A shift in specular surface reflections can thereby be induced which can later be low 121 pass filtered in post processing eliminating the more intense surface reflections. A one-to-four 122 optical switch (Leoni mol 1x4) allows for quick switching between illumination fibres, minimising 123 effects of movement by allowing for acquisition times of under half a second limited by the 124 synchronisation with the frame grabber. The system is controlled using a LabView (National 125 Instruments, Austin, Texas) based control software. Multiflash images were analysed using a 126 multiflash algorithm [24, 25] and reconstructed using a MATLAB v2021a (Mathworks, Natick, 127 Massachusetts) code and poisson image reconstruction based on a sine transform [33–35]. The 128 small shift in the location of the specular reflections was used to eliminate the reflections from the 129 image. The choice of fibre to illuminate allows additional flexibility in illumination wavelength 130 choice. 131

# 132 2.2. Orthogonal-polarisation micro-imager probe

The cross-polarised version of the probe incorporates the same physical design as the multi-flash 133 probe. High quality, glass substrate, linear polarisers, selected for high transmission and contrast 134 across the visible and near-infrared (NIR), with average transmission in the visible of 90% and 135 up and a contrast ratio of 1500 at 650 nm (MoxTek RCV8N2EC) were mechanically diced to 2.0 136 mm square and mounted in front of the camera sensor and the optical fibres. The orientation of 137 the polarisers was such that orthogonal polarisation was achieved between the camera and each 138 illuminating fibre. The polarisers were cut using a mechanical silicon wafer dicing machine, and 139 their size was chosen to be the maximal permissible size given the desired probe dimensions. 140 The dicing saw was used to partially cut through the glass, and the small components could then 141 be separated from the bulk by carefully cracking them off. We have since achieved a dice of 142 0.50x0.50 mm enabling further miniaturisation. 143

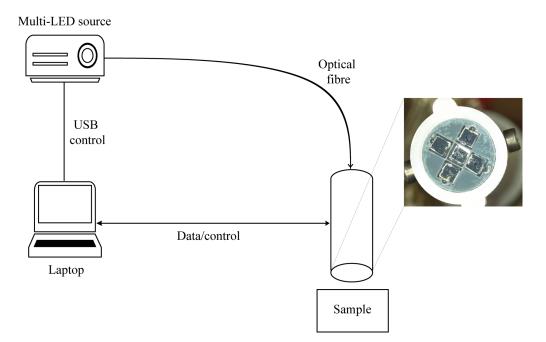


Fig. 2. Schematic diagram of the experimental arrangement for the cross polarisation measurement and close up view of the polariser probe showing central camera sensor and concentrically arranged illumination fibres, each with small diced glass polariser mounted in front. The polarisers on the camera and image fibres respectively are orthogonally to one another.

The experimental set up along with a close up view of the tip of the probe, showing the UV glued polarisers is shown in Figure 2 above. In this probe illumination is delivered through each of the four fibres simultaneously. Therefore the optical switch is not required when utilising this set up. The use of four fibres simultaneously also allowed for a good illumination profile, which, given adequate light intensity and coupling on the back-end, overcomes some of the losses due to the polarisers.

# 150 2.3. Light source and portable set up

Illumination was delivered using a custom built, portable, fibre coupled multi-LED light source, 151 designed and built in house. This work will be published separately. The source is capable 152 of illuminating with five different wavelenghts from 400 nm to 940 nm. Wavelengths were 153 selected to allow for the reconstruction of white light using a combination of red (660 nm -154 Thorlabs M660D2), green (540 nm - Thorlabs M530D3), and blue (450 nm - Thorlabs M450D3) 155 wavelengths. Two NIR wavelengths were also selected to provide deeper penetration depth 156 in tissue. These were at 850 nm (Thorlabs M850D2) and 940 nm (Thorlabs M940D2). The 157 LEDs are coupled into a single optical fibre using an arrangement of dichroic mirrors. This 158 results in a fibre coupled source which can be used plug and play style which either of the two 159 aforementioned measurement configurations. The wavelengths choices are adaptable and can be 160 adjusted depending on application. 161

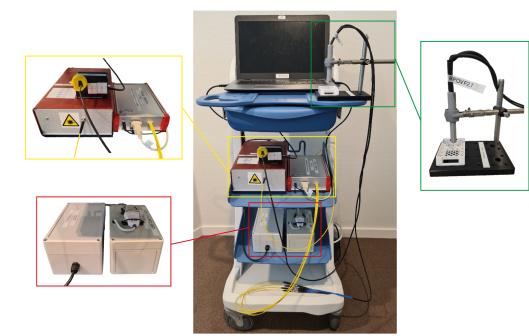


Fig. 3. Entire clinical trolley with light source and optical switch (yellow), power supply and data acquisition box (red), and camera probe with sample holder (green).

The entire apparatus is mounted on a movable trolley as shown in Figure 3. This allows the system to be portable and easily transported between lab and operating theatre. The probes can be swapped by simply plugging them in to the LED source. The probes themselves can be used freehand or mounted in a fixed position above a sample. The laptop allows for near real-time data acquisition and control, with the camera data being parsed through a custom made readout board (BAP Image Systems) which interfaces with LabView.

## 168 2.4. Ex-vivo validation

#### 169 2.4.1. Tissue mimicking phantoms

The primary goal was to verify the specular reflection removal techniques on a highly reflecting 170 standard. Tissue mimicking phantoms (BioPixS0020 by BioPixS, Ireland), with well-defined 171 scattering and absorption values to match the optical properties of human tissue, were used to 172 verify functionality of both probes. The phantoms consist of a base phantom and a number of 173 top layer phantoms. These can be combined together to create range of multilayer phantoms with 174 different top layer thickness while the air gap in eliminated due to the phantom design to avoid 175 optical boundary effects. Well defined layers of depth 0.50 mm, 1.0 mm, and 2.0 mm, allowed 176 also for a verification of feature detection at different imaging depths with both probes. This 177 is of particular interest when using near infra-red illumination which has a deeper penetration 178 depth. The phantoms present a glossy surface and contain embedded features of hydroxyapatite 179 of 1 mm diameter. The phantoms therefore allow a deliberate challenging of specular reflections, 180 presenting even more significant surface reflections than what can be expected from real biological 181 tissue. They allow for repeatability and unlike tissue samples do not dry out. The hydroxyapatite 182 particles were used to mimic a feature of interest to a clinician, who may be looking to detect 183 abnormalities embedded in tissue. Hydroxyapatite is similar to human hard tissue and a suitable 184 analogue to mimic imaging of cardiovascular plaque, for example. 185

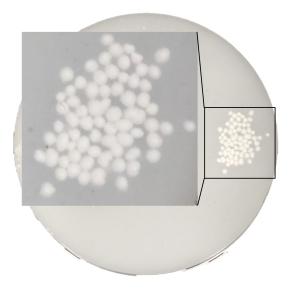


Fig. 4. Image of base layer of the tissue mimicking phantom developed for this study, with a close up view of the 1.0 mm features imaged in this work.

# 186 2.5. Ex-vivo human tissue imaging

To validate this system on tissue image of breast slices after breast conserving surgery were acquired. The glossy surface of breast specimens were used to test the capacities of the system on human tissue. Images of excised human breast tissue were acquired using the aforementioned probes as part of a post-operative pathological workflow. An image of the clinical set up used to image excised tissue samples is shown in Figure 8. The tissue samples were imaged using both the multi-flash capable probe as well as the polariser probe. Regions of interest on the tissue samples were selected, and subsequently imaged.

# 194 3. Results

# 195 3.1. Ex-vivo validation: Phantom Images

The performance of the multi-flash algorithm as well as cross polarisation imaging was validated in the laboratory before introduction of the devices into a clinical settings. Images of phantoms captured using both probes are presented in this section using different illumination wavelengths and phantom depths. The reconstruction algorithm for the multi-flash method was also validated.

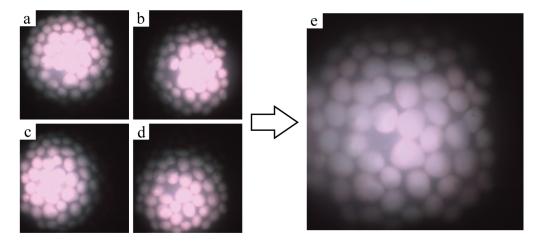


Fig. 5. Four separately illuminated white light images of the same site on the phantom from different illumination locations (a-d) and the reconstructed output of the multi-flash specular reflection reduction algorithm (e).

Figure 5 shows an example of the multi-flash system's image outputs. Each illumination fibre 200 sequentially illuminates the sample, in this case a bare tissue phantom. The four images that are 201 generated can be seen in Figures 5 (a-d) where it is clear that the illumination pattern changes 202 as the scene is illuminated from slightly different positions. The specular reflections present 203 themselves as very bright areas in the center of the illuminated area, where the detector saturates 204 and the hydroxyapetite features are not discernible. The specular reflection shift can also be seen 205 in each of the four images where the saturated region is observed in a different location of the 206 sample. Figure 5 (e) shows the reconstructed output of those four images. The bright saturation 207 due to direct surface reflections is filtered out and the margins of the features are visible once 208 again. The reconstruction error of this method was examined by feeding four identical images 209 into the reconstruction algorithm and analysing the differences. This error in the reconstruction 210 was found to be of the order of  $10^{-10}$ . 211

To further explore the reconstruction in terms of wavelength and depth, multi-flash images are presented in Figure 6 below, where the features embedded in the multi-layer phantom are imaged at different imaging depths and using wavelengths from the blue to the NIR. The probes were fixed 8 mm above the sample, and images were captured at a range of imaging intensities, with the best ones for inspection being selected. A similar procedure takes place in clinical situations when examining tissue samples, where the clinician will adjust the system settings until an adequate image is generated.

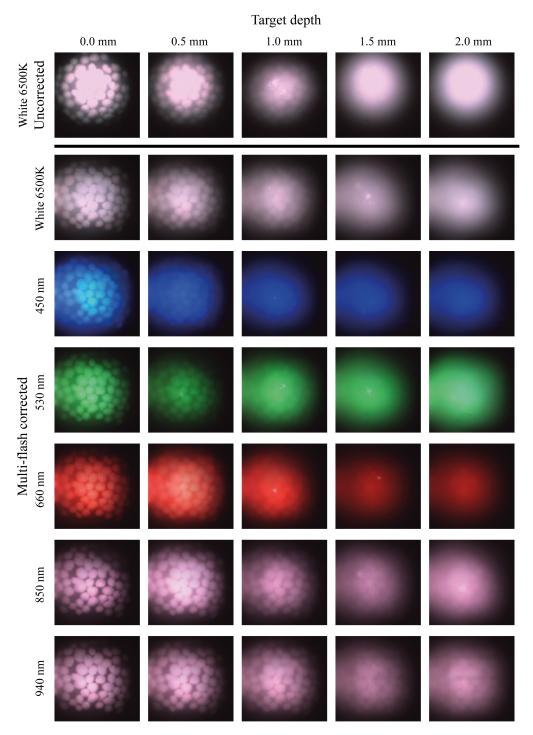


Fig. 6. Uncorrected images of tissue mimicking phantoms with embedded features shown under white illumination in the first row. Reconstructed multi-flash images of tissue mimicking phantoms at different imaging depths and different illumination wavelengths shown below.

The first row of images displays images under white light illumination that have not been corrected 219 for specular reflections. Very strong surface reflections saturate the pixels and the margins of the 220 features are no longer distinguishable. The second row of white light illuminated images shows 221 the traditional guidance image (illuminated using white light) corrected for specular reflections 222 using the multi-flash post processing approach, and the hydroxyapatite crystal features can now 223 be clearly distinguished. In the following rows multi-flash corrected images are shown for the 224 other illumination wavelenghts used. The measurement depth is varied using the multi-layer 225 phantom by adding the corresponding layer on top of the bare tissue phantom. It is observed that 226 as the thickness of the phantom above the feature increases the features become less discernible. 227 The longer wavelengths can be seen to penetrate deeper into the tissue mimicking phantom and 228 features are more clearly seen. Note that the illumination intensity is selected such that the 229 features are the most visible to a human observer, hence the apparently decrease in brightness 230 under the 660 nm illumination as depth increases. Higher intensity illumination here saturated 231 the image too much, making it impossible to discern features especially when the light is already 232 highly scattered. Increasing wavelengths clearly allows for observation of features at greater 233 depth. The 940 nm illumination allows features under 2.0 mm of phantom layers to be resolved, 234 although there is some blurring observed at this depth due to scattering. In all cases surface 235 reflections are effectively removed from the image, revealing underlying information. 236

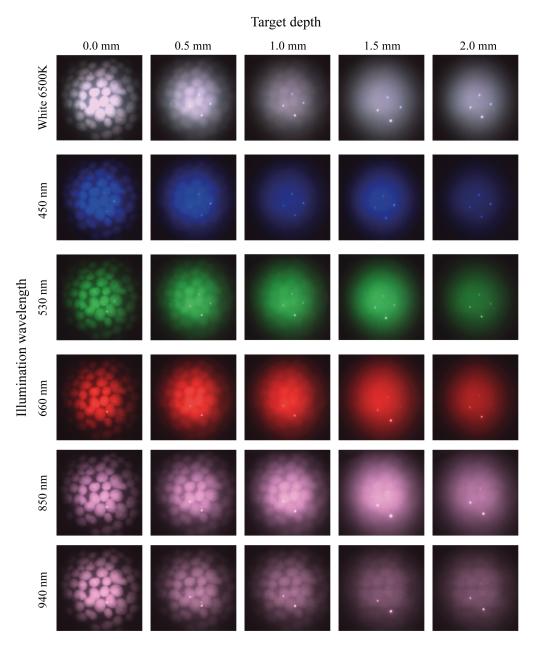


Fig. 7. Cross polarised images of tissue mimicking phantoms at different imaging depths and different illumination wavelengths. Note the four bright spots that are visible on most of the images are direct reflections from the four illumination fibres. The surface of the phantom is very flat and reflective and the polarisers fail to filter out these brightest spots.

<sup>237</sup> The same measurement procedure was repeated for the cross-polarised imaging probe in Figure 7.

238 Similar to the multi-flash probe, the longer wavelengths penetrate deeper into the phantom. A

239 comparison of the 940 nm wavelength suggests the ability to resolve features slightly better than

the multi-flash probe at this NIR wavelength. Additionally the boundaries of the features appear

<sup>241</sup> more well defined under all illumination wavelengths. The fibre reflections can be seen in the

images captured using the cross polarised probe and will be discussed later. These always appear
 at the same location.

# 244 3.2. Ex-vivo human tissue imaging

To demonstrate the clinical value of the proposed solutions, excised human breast tissue was imaged. Figure 8 shows a comparison between a camera image with single fibre illumination, the reconstructed multi-flash image, and the cross polarised image, respectively. It is an example of a typical clinical imaging target. Both the multi-flash reconstruction as well as the cross polarisation effectively eliminate the specular component of the reflected light. In both cases only the diffuse component remains providing a blemish free image that presents the information of the surface and underlying features.

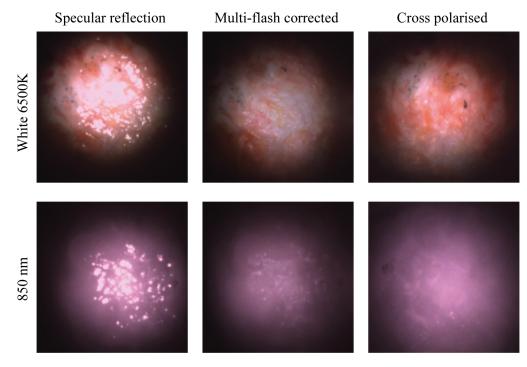


Fig. 8. Human breast tissue images with a showing a) single fibre illumination with no polarisation, b) reconstructed image after multi-flash post processing, and c) cross polarisation imaging.

The same location is imaged using white light and NIR illumination. In the white image a set of 252 grey blue dots can be seen in the top left quadrant of the image. Specular reflection is clearly seen 253 in the first set of images where the sample is only illuminated without any specular reduction 254 method using a single fibre source. Here the glossy tissue surface is obscuring the view of the 255 underlying morphology of the tissue. In the next two sets of images it is clear that both the 256 multi-flash corrected image and the cross-polarised image have effectively removed the specular 257 reflection and revealed previously obscured underlying information. Under both illumination 258 types, white and NIR, the cross polarised image appears brighter here due to the intensity choice 259 in the multi-flash image that returns the best result. A balance is struck between illumination 260 intensity and output image quality, in particular in the algorithmic specular reflection removal 261 approach. Both methods show excellent image quality and colour reproduction. This has been 262 validated with many measurements on human tissue beyond the selection selection shown here, 263

with further publications to follow.

#### 265 4. Discussion

The results of cross polarised imaging, as well as multi-flash imaging, using micro-cameras, of 266 phantom test targets and human tissue demonstrate two effective methods for removing surface 267 reflections. The orthogonal polariser imager rejects the polarisation maintaining direct reflections. 268 from the glossy tissue surfaces. Imaging into the tissue by collecting only multiple-scattered 269 light is thereby achieved. Similarly, the multi-flash imaging probe shifts the specular reflections 270 as illumination strikes the surface from different positions. These shifts in specular reflections 271 can be filtered out and the image below can be reconstructed. Important to note is that the 272 two methods fundamentally interrogate different physical properteries of reflected light. The 273 multi-flash approach effectively samples all polarisation states, whereas the polarimetry approach 274 only samples multiple-scattered light. This should be considered when choosing a technique. 275 276 While the polarisers provide a solution that is free from post processing it is limited by the dimensional constraints of the dicing process and the specifications of the polarisers. This in 277 turn bounds the minimum dimensions of any potential device. An alternative option may be 278 to deposit or grow polarisers directly onto fibre tips and sensor to drive the footprint down 279 further. For the multi-flash approach the dimensions are bounded by the requirement to have four 280 illuminating fibres, and the illumination cone overlap condition, as well as the illumination profile 281 in combination with the camera. From a clinical compliance standpoint, the images from the 282 polariser based solution are more desirable. For real-time imaging and intraoperative scanning 283 across tissue the cross polarisation probe is preferred as there is no requirement to keep the probe 284 and tissue static during image acquisition. Currently the multi-flash approach can acquire images 285 in approximately 0.20 s with the synchronisation of image acquisition with the optical switch 286 being the made bottleneck. With a faster camera and a synched rapidly switching optical switch. 287 however, these limitations could be mitigated in the future. 288

Illumination pattern is important so that the FOV of the camera is fully illuminated. Illuminating 289 with four fibres simultaneously, provides a more even illumination pattern that covers a greater area 290 of the FOV of the camera. More illumination intensity is easily provided using the illumination 291 system. By using more powerful light sources, any intensity problems should be eliminated 292 entirely. Fibre selection is ideally large diameter and high numerical aperture, however this 293 can be supplemented with lens design. Important in all cases is illuminating much of the FOV 294 as possible and therefore the cameras are selected with a low FOV to allow for a maximum 295 illuminated area. Additionally the lower FOV micro cameras were selected due to the reduced barrel distortion observed on the graded-index lens camera cube package. This becomes more 297 challenging when reducing footprint and trade-offs in illuminated area and illumination pattern 298 must be made with cost. For multi-flash imaging correct overlap of the light cones is an additional 299 consideration so that as much area as possible is illuminated by each fibre position, ensuring that 300 any areas with specular reflections have a shift in reflection. 301

Micro cameras typically provide good magnification, and the FOV in these images is of the 302 order of 10.0 mm. This is a positive aspect, given sufficient spatial resolution and pixel count, 303 when looking for small features in tissue. However, it can become a negative when scanning 304 a larger region of tissue is necessary. One of the main limitations of micro camera endoscopy 305 systems is the number of available pixels. In colour cameras, only a fraction of the pixels are 306 active in each spectral band. This becomes more of a problem when using the pixels not just 307 for guidance but for diagnostic measurement. Using a monochrome camera can help resolve 308 this, as now all pixels are sensitive to a broadband visible and NIR illumination. This, in turn, 309 increases the spatial resolution of our sensor for each of the colour bands. These colour bands can 310 then be delivered sequentially using the aforementioned illumination system, or if desired laser 311 illumination [36], again limited by motion of the probe or tissue in relation to acquisition time. 312

The ex vivo results obtained using this system demonstrates the efficacy of both specular 313 reflection removal approaches when imaging human tissue. Figure 8 shows effective elimination 314 of specular reflections in both modalities, with the features on the tissue surface now discernible. 315 Figures 6 and 7 present depth measurements of embedded features in multi-layer phantoms. In 316 Figure 7 the cross polarised system fails to eliminate all of the specular reflections, as bright 317 hot spots can be seen in almost all the images but in particular the white and NIR illuminated 318 images. These are reflections from the illuminating fibres, which are not fully eliminated due to 319 the limitations in the polarisation system. A number of possible effects should be considered. 320 The first is that of the performance limitations of the polarisers leading to not all the incident 321 and collected light being completely cross polarised. The second effect is likely an angular 322 effect where when using a large NA camera objective, different pixels will be looking at the 323 surface under different angles. The polarisation of the specular reflection from the surface will 324 be parallel to the surface everywhere. Hence, depending on the location on the surface, the 325 specular reflection reaching the camera will have a slightly different angle with the polarisation 326 filter in the camera for each pixel. On average these align to be zero, but there will be a range 327 of angles where transmission is non-zero. This likely reduces the overall performance of the 328 system however in the case of the hotspots remaining in the same location the contribution is 329 primarily that of contrast in the polarisers. The diffuse reflection is an order of magnitude lower 330 than the specular reflection from the surface, and as a result hotpots form in certain locations. A 331 slight angular shift in the probe positioning, i.e. the probe is not aligned perfectly perpendicular 332 with the surface of the phantom may play an additional role. When compared with specular 333 reflection uncorrected images, such as images in Figure 5 (a-d) and Figure 8 however, a drastic 334 improvement is seen. The final use case of such probes remains the clinic where conditions 335 are never ideal. The images in Figure 8 remain indicative of the value of these techniques in 336 particular when used on biological tissue. 337

Due to tissue optical properties, in the visible to NIR range, tissue can be interrogated at 338 greater depth with increasing wavelength. From the phantom images it is clear that there is an 339 increase in imaging depth with an increase in wavelength, as was expected. Figures 6 and 7 340 demonstrate an ability to image into tissue at depth in particular when using NIR wavelengths. 341 These effects are significant and this paper recommends the inclusion of NIR modalities into 342 micro camera endoscopy systems. In many cases features of interest present themselves not just 343 in plane with the surface. The human body often presents complicated morphology, and therefore 344 there exists a clinical requirement to image at some depth, or detect embedded features. The 345 removal of specular reflections improves image quality and enables real-time feature detection 346 algorithms to detect these in the future. Flexibility in illumination wavelength is additionally 347 beneficial for these systems, to interrogate different colour bands, and to allow the combination of 348 wavelengths to enhance contrast. This gives clinicians tools to view a scene in the way that best 349 suits the particular use case. Quick scanning with white light illumination allows for viewing of 350 surface features and morphology assessment. Switching to more specific wavelengths, like the 351 NIR to probe at depth, when features or structured of interest present beneath the surface, or 352 the blue to examine surface features. Wavelength flexibility also enables viewing of particular 353 bio-markers sensitive to certain wavelengths. This can also be extended to additional imaging 354 modalities such as diffuse reflectance spectroscopy applications. 355

This system lays the groundwork to provide clinicians with diffuse images, where acquisition is quick and simple, and the input wavelengths can be carefully controlled. A platform is presented that is adaptable to 3-7 Fr applications using the fibre illumination and micro camera. Examples where this system can provide an addition to the current workflow including in tissue conserving surgeries to ensure that the resections margins are tumour free, as a tool in peripheral lung applications to ensure image quality, or as a tool in imaging of vulnerable plaque in cardiovascular medicine. However, such a probe should include multiple modalities to provide an enhanced image that goes beyond simple image guidance. It would also vary in dimensions depending on the use case. Future work should therefore include adapting the probe into a multi modal system that is capable of diffuse reflectance spectroscopy as well as image guidance, with the ability to co-locate features detected with different modalities. Work is also being carried out on integrating image processing with high dynamic range and multi spectral imaging to highlight areas of interest for the clinician.

As medicine takes more and more steps towards minimally invasive approaches it is expected 360 that the demand for such techniques increase. Rapid acquisition and real-time feedback for 370 clinical use will become a standard. The techniques demonstrated in this paper are not uncommon 371 in larger dimensions, e.g. in professional photography; but the challenge lies in the development 372 of small footprint systems that can find their place in a clinical environment. For clinical 373 applications a generalized probe for use in clinical settings has not yet been introduced. For 374 example, imaging probes would be valuable in outward clinics in providing general practitioners 375 or dermatologists detailed visualization of small skin abnormalities, resulting in more accurate 376 diagnosis and treatment. Additionally, imaging probes can be extensions for surgeons in assessing 377 tumours or lesions during surgical procedures. To optimize clinical use, direct and non-invasive 378 assessment with real-time feedback is essential. Moreover, the probe and system should be easy 379 to use, in order to minimize the need for technical assistance. This paper has miniaturised such a 380 system into a 10.0 mm handheld portable footprint. The techniques presented lend themselves to being further miniaturised, with ongoing work being able to achieve a footprint of 4.0 mm. Work 382 is also ongoing to develop robust sterilizable systems suitable for use in operating theatres. 383

Future work will involve optimising this technology to meet clinical needs in particular clinical 20/ applications, providing valuable information to clinicians which was previously unavailable. This 385 includes further miniaturisation if necessary, in combination with image processing and feature 386 recognition software to improve output images, and inclusion of diffuse reflectance imaging 387 modes. The current system is built to support these modalities. Consideration should also be 388 given to improving image quality by using monochrome cameras instead of RGB cameras, and 389 further exploration of sequential illumination is necessary. Most importantly, all of this work 390 should be performed with the clinical requirements in mind. This means in close collaboration 391 with clinicians, with the systems being used in a clinical environment. 392

### 393 5. Conclusions

Surface reflections are often undesirable and make it difficult to determine with certainty if a 394 feature is present in the image or not, as well as complicating the determination of sub-surface 395 tissue structures. This can cause erroneous results in human and machine analysis, and is 396 not desirable in clinical care, where quick representation of important data is critical. Two 397 handheld systems of the same footprint, capable of producing specular reflection reduced images 398 of tissue using two different techniques, have been presented in this paper. These probes 399 use micro-camera technology, which provides a flexible imaging platform and is an emerging 400 technology in surgical settings. The design is handheld and portable to easily fit into clinical 401 workflow, as well as miniaturisable. To remove undesirable specular reflections two techniques 402 are implemented. One, the integration of cross polarisation using diced high quality polarisers, 403 and two, multi-flash imaging to shift reflections and filter them out algorithmically, in a post 404 processing step. The use of these techniques enables the generation of images that are free from 405 undesirable surface reflections. Both techniques achieve the goal of removing surface reflections 406 on various targets including resected breast specimens, returning more suitable images for visual 407 inspection. Advantages and disadvantages of both methods are discussed. Phantom verification 408 shows the ability to image features at a depth of up to 2.0 mm with both techniques when using 409 NIR illumination. The polarisers show clearer edges of the features upon visual inspection, 410 however require more illumination power due to their attenuation. Both techniques are further 411

- <sup>412</sup> miniaturisable, the multi-flash technique requiring four illumination sources to be integrated,
- <sup>413</sup> bounding the minimum dimensions, and these sources need to be switched on sequentially. The
- <sup>414</sup> multi-flash approach therefore also requires the camera probe to be stationary for a fraction of
- <sup>415</sup> a second, whereas the polarised probe is a solution that works independent of motion. The
- <sup>416</sup> miniaturisation of the cross-polarised approach is dimensionally bounded by the size of the
- <sup>417</sup> polarisation. In the clinical environment the cross-polarised approach is currently preferred.
- <sup>418</sup> In conclusion, two approaches to specular reflection removal for endoscopy are presented. A
- <sup>419</sup> balance must be struck between miniaturisation, acquisition time, interaction with other system
- <sup>420</sup> modalities, and application. While design decisions for endoscopy applications are application
- <sup>421</sup> specific to a high degree, it is shown that specular reflection problems must be considered, and
- flexibility in illumination wavelengths including in the NIR is recommended. Both options
   presented show promise for use in a micro camera platform for examining tissue.
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- **Ethics Statement.** The patient specimen was acquired in accordance with the IRB guidelines of the AVL-NKI. According to Dutch guidelines and local ethics committee, no informed consent had to be required the patient.
- 431 Data availability. Data underlying the phantom results presented in this paper are being made publicly
   432 available, and will be accessible at DOI:10.5281/zenodo.7709437. Tissue images are available from the
   433 authors upon reasonable request.

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