Polarization speckle imaging as a potential technique for *in vivo* skin cancer detection

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Abstract. Skin cancer is the most common cancer in the Western world. In order to accurately detect the disease, especially malignant melanoma—the most fatal form of skin cancer—at an early stage when the prognosis is excellent, there is an urgent need to develop noninvasive early detection methods. We believe that polarization speckle patterns, defined as a spatial distribution of depolarization ratio of traditional speckle patterns, can be an important tool for skin cancer detection. To demonstrate our technique, we conduct a large \textit{in vivo} clinical study of 214 skin lesions, and show that statistical moments of the polarization speckle pattern could differentiate different types of skin lesions, including three common types of skin cancers, malignant melanoma, squamous cell carcinoma, basal cell carcinoma, and two benign lesions, melanocytic nevus and seborrheic keratoses. In particular, the fourth order moment achieves better or similar sensitivity and specificity than many well-known and accepted optical techniques used to differentiate melanoma and seborrheic keratosis.

Keywords: polarization; depolarization ratio; automatic skin cancer detection; laser speckle; statistical moments.

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1 Introduction

Due to recent advancements, polarization has been utilized in a number of optical techniques such as fluorescence, Raman and reflectance spectroscopy, and proven to be effective for biomedical diagnosis. In this paper, we focus on skin polarimetry—applying a polarization speckle technique for detecting malignancy of skin lesions. Skin cancer is the most common cancer in the western world, and its incidence has been increasing steadily and rapidly in the last 40 years. Among the three common types of skin cancers (malignant melanoma, squamous cell carcinoma, and basal cell carcinoma), malignant melanoma is most fatal. The five-year survival rate for advanced cases is only 15%; however, melanoma is also almost 100% curable in an early stage. Furthermore, melanoma is sometimes difficult to diagnose because it often resembles benign skin lesions such as nevus and seborrheic keratoses. Currently, biopsy, an invasive medical procedure, is the gold standard for diagnosing skin cancer. Thus, developing polarization techniques for skin cancer detection may help diagnose the disease noninvasively at an early stage, when the prognosis is excellent.

Polarization has been widely used in dermatology. The technique can be generally divided into two schemes: polarization imaging, a manifestation of depolarization effect due scattering, and tissue characterization based on intrinsic polarization.

Dermoscopy\textsuperscript{7} is a well-known dermatological tool that can be implemented with polarization imaging methods. Based on the technique known as “polarization gating,”\textsuperscript{6} this common tool can perform optical sectioning and reveal either surface or subsurface features of a skin lesion. The optical ability is explained by a two-layer polarization model where backscattered light from the surface and the superficial layer retains the linear polarization of the illumination, while the backscattered light from the deeper layer is depolarized. Directing an output polarizer to be parallel or perpendicular with respect to the input polarizer, an observer can select the depth of the backscattered signal. In particular, dermatoscopists have developed a set of complex diagnostic rules for skin cancer according to the visual, subsurface dermoscopic features or patterns such as asymmetry, irregular borders and colors, irregular pigment networks, etc.\textsuperscript{7} Another polarization imaging technique augments polarization gating by computing the depolarization ratio $D = (I_H - I_\perp)/(I_H + I_\parallel)$ spatially, where $I_H$ and $I_\parallel$ denote the parallel and perpendicular backscattered polarized intensities, respectively, and form a two-dimensional (2-D) image.\textsuperscript{8} The advantage of the depolarization ratio image is that it preferentially captures the fraction of photons that travel only a few mean free paths,\textsuperscript{9} where one mean free path is approximately 100 \textmu m for epidermis and dermis.\textsuperscript{10} Thus, depolarization ratio images encompass the epidermis and superficial dermal layers from where skin lesions often originate.\textsuperscript{11} Jacques et al. suggested that the full margin of a skin lesion, that fails to be observed under a naked-eye examination, can be outlined using a depolarization ratio image.\textsuperscript{8} Although these two polarization imaging techniques assist physicians in diagnosing skin cancers, these techniques require qualitative assessment of the polarized images and do not fully exploit the intrinsic polarization properties of skin tissue. Hence, the full potential of polarization measurements is not realized.
Skin components like collagen and keratin alter polarization via birefringence, optical activity and diattenuation. These intrinsic changes of polarization can be evaluated quantitatively and used to classify tissue from different organs in vitro. Angelsky et al. successfully applied this approach to characterize thinly sliced tissue samples from heart, kidney, and spleen. However, the main drawback of the tissue polarimetry is the difficulty in measuring and analyzing the subtle polarization transformations distorted by random depolarization. Also collecting the necessary data for the quantitative analysis, which is based on one of two mathematical formulations: the Stokes-Mueller and Jones matrixes, is time-consuming. To apply either of the above two formulations, one needs to perform a set of measurements with the aid of polarizer-analyzer rotations. This time-consuming task represents a significant technical challenge to translate the technique into a real-time clinical application for skin cancer detection since body movements degrade the accuracy of intrinsic polarimetry methods.

In this paper, we demonstrate a new in vivo method that may become useful for skin lesion detection. The method combines the depolarization ratio \( D \) used in the polarization imaging with the quantitative analysis common in polarimetry. Unlike Jacques et al.’s depolarization ratio image, we computed depolarization ratios from the intensities of the backscattered speckle patterns, which are commonly modeled as two cross-polarized free-space speckle patterns \( I_H \) and \( I_L \). We captured these speckle patterns simultaneously with analyzers oriented parallel and perpendicular to the initial polarization, and generated a new 2-D pattern of the depolarization ratio. The resulting pattern, the polarization speckle pattern, is a stochastically distributed area field with various polarization states. Examples of polarization speckle patterns are shown in Fig. 1. We believe that the distribution of the polarization speckle pattern captures vital information for skin cancer detection, and propose to analyze the polarization speckle pattern quantitatively using statistical moments. We hypothesized that using statistical moments of the polarization speckle pattern \( D \) would allow us to develop a fully automated diagnostic indicator for classifying different types of common skin lesions. To demonstrate the feasibility of our hypothesis, we conducted an in vivo clinical study, testing whether our method could statistically differentiate melanoma, squamous cell carcinoma, basal cell carcinoma, melanocytic nevus and seborrheic keratosis.

2 Materials and Methods

We conducted a clinical study of five types of malignant and benign skin lesions (malignant melanoma, squamous cell carcinoma, basal cell carcinoma, melanocytic nevus, and seborrheic keratosis), at the Skin Care Centre, Vancouver General Hospital. The diagnoses for the malignant lesions (malignant melanoma, squamous cell carcinoma, and basal cell carcinoma) were confirmed by biopsy. This study was approved by the UBC Clinical Research Ethics Board (study number H06-70281).Lesion measurements were acquired from patients attending a general dermatology clinic using a specially constructed laser speckle device.

The speckle device uses dual cameras to simultaneously capture two speckle patterns. (Fig. 2) Skin lesions were illuminated sequentially by two diode lasers, a blue laser \((\lambda = 407 \text{ nm}, 20 \text{ mW}, \text{BWB-405-20E, B&W Tek Inc.})\), coherence length is

![Fig. 1 Examples of polarization speckle patterns for (a) malignant melanoma, (b) squamous cell carcinoma, (c) basal cell carcinoma, (d) nevus, and (e) seborrheic keratosis using the blue laser (407 nm).](https://letters.spiedigitallibrary.org/journals/Journal-of-Biomedical-Optics)
A polarization speckle pattern \( D(x,y) \) was then calculated from the two registered parallel- and perpendicular-polarized speckle patterns using Eq. (1):

\[
D(x,y) = \frac{I_H(x,y) - I_L(x,y)}{I_H(x,y) + I_L(x,y)},
\]

where \( I_H(x,y) \) and \( I_L(x,y) \) were the pixel intensities of the corresponding parallel- and perpendicular-polarized speckle patterns. Two such \( D(x,y) \) patterns of each lesion were calculated separately for the blue and red lasers.

The first to fourth order statistical moments of the polarization speckle pattern \( D(x,y) \) were calculated based on the following equations:

\[
M = \frac{1}{N} \sum_{i=1}^{N} |D(x,y)|, \quad (2)
\]

\[
\sigma = \frac{1}{N} \sum_{i=1}^{N} D(x,y)^2, \quad (3)
\]

\[
A = \frac{1}{\sigma^2} \left[ \frac{1}{N} \sum_{i=1}^{N} D(x,y)^2 \right], \quad (4)
\]

\[
E = \frac{1}{\sigma^4} \left[ \frac{1}{N} \sum_{i=1}^{N} D(x,y)^4 \right]. \quad (5)
\]

We followed Angelsey et al.’s notation of naming these four moments as \( M, \sigma, A, \) and \( E \). The variable \( N \) in Eqs. (2) to (5) denotes the total number of pixels in the polarization speckle pattern.

To perform statistical analyses on the moments of the polarization speckle pattern, we utilized the Kruskal-Wallis test with Dunn’s multiple comparison posttest (Prism 5 for Windows, GraphPad Software, La Jolla, California). The \( \alpha \) significance level was set to 0.05. The statistical software identified all significantly different pairs with three significance levels, \( p < 0.05, <0.01, \) and \( <0.001 \).

Fig. 2 The schematic of the laser speckle device.
3 Results
We examined 214 skin lesions including the three major types of skin cancers, malignant melanoma (MM), squamous cell carcinomas (SCC), and basal cell carcinomas (BCC), and two benign conditions, melanocytic nevus (nevus), and seborrheic keratoses (SK) (Table 1).

Figure 1 shows examples of the polarization speckle patterns \( D(x, y) \) captured and calculated for each lesion type using Eq. (1). The theoretical range of \( D(x, y) \) is from 0 to 1 where \( D(x, y) = 1 \), the white polarization speckle, marks a linear polarized area, and \( D(x, y) = 0 \), the black speckle, denotes mostly fully depolarized light. The gray speckles in between relate to the partially depolarized light.

Figure 3 shows the box-and-whisker plots for the first to fourth order statistical moments of the polarization speckle patterns \( D(x, y) \) calculated using Eqs. (2) to (5), for the blue and red lasers separately.

All moment distributions showed differences among the five lesion types for all four moment analyses \( (p = 0.0001 \text{ for all Kruskal-Wallis tests}) \). The results of Dunn’s multiple comparison tests are presented in Tables 2 and 3 for the blue and red lasers, respectively.

According to Table 2, the blue laser could be used to differentiate MM from other skin lesions except nevus. All four moments could be used for such a task. However, the fourth order statistical moment \( E \) seems to be the most efficient. On the other hand, the red laser was more suitable for SK identification (Table 3). Again, the fourth order moment \( E \) seems to work better than the other three moments.

4 Discussion
We believe the polarization speckle pattern \( D(x, y) \), generated by Eq. (1), is a convenient tool for \textit{in vivo} skin lesion differentiation for three reasons. First, Rojas-Ochoa et al.\(^{20}\) demonstrated theoretically that the depolarization ratio depends on bulk optical parameters. Since the five types of skin lesions show noticeable differences in their morphology, these distinctions should be reflected in their bulk optical properties, and hence the properties of their polarization speckle. Second, the polarization speckle pattern \( D(x, y) \) could be acquired within milliseconds by two CCD cameras simultaneously. The rapid acquisition time resolves the body movement issue which is critical for \textit{in vivo} examination in a clinical setting. Our technique can potentially be developed into a real-time noninvasive application. Finally, the polarization speckle pattern \( D(x, y) \) represents the fraction of light that maintains its initial linear polarization, was associated with the signal from the more superficial layers where significant skin lesions often originate.

It is known that the first four orders of central moments (central moments are statistical moments after the data distribution is normalized to zero mean) represent mean, variance, skewness and kurtosis of a data distribution.\(^{20}\) In this paper, however, we used statistical moments, which do not hold any extra physical meaning as central moments per se except the first order moment. Nevertheless, central moments and statistical moments are related and statistical moments are used in our paper to represent and quantify the shapes of data distributions. Angelsky et al.\(^{14}\) demonstrated the analysis of the ellipticities and azimuths of heart, kidney and spleen samples using statistical moments.

Figure 3 illustrates several interesting points. The first order moments \( M \) (mean) of the MMs and nevi were generally higher, i.e., having a higher fraction of linear polarized signals, than other lesions for both the blue and red lasers. This phenomenon could be explained by less scattering within MM and nevi due to higher absorption of light by melanin pigment which is present within these types of lesions. In fact, the median values of MM and nevi were either substantially higher or lower than other three types of lesions in all four moments. This difference appeared to be more pronounced for blue versus red illumination light. A possible explanation for the larger differences in the blue data is that there is a bigger difference in the absorption coefficients between pigmented and nonpigmented lesions for the blue versus the red wavelengths.\(^{21}\)

It is interesting to note that the blue laser showed excellent separation for MM against SK, BCC and SCC, while the red laser was the most effective in separating SK against MM, nevus and BCC. The blue laser results may be explained by the absorption difference among the skin lesion types. However, such an explanation cannot be applied to the red laser because all lesions have somewhat similar absorption coefficients in the red spectral region.\(^{21}\) The proper explanation may be associated with the discrepancy in scattering coefficients and/or anisotropy factors. Further investigations and a better understanding of the specific bulk optical properties for different types of skin lesions are required.

Tables 2 and 3 reveal that our technique is most effective for differentiating MM and SK, especially in the higher order of moments, such as the fourth order. Because SK often resembles MM, many optical systems have attempted to develop diagnostic-aided methods to discriminate these two types of lesions. Thus, we could compare the sensitivity and specificity of the fourth order statistical moment of the polarization speckle patterns with the values reported by other researchers. Using the fourth order moment \( E \) as a diagnostic discriminator, we generated a receiver operating characteristic (ROC) curve for differentiating MM and SK by plotting the true positive rate (sensitivity) of the indicator against the false positive rate (1–specificity). The ROC curves of the fourth order statistical moment of polarization speckle pattern for the red and blue lasers are depicted in Fig. 4(a) and 4(b), respectively. Within these figures, we also plotted the sensitivity and specificity values for other studies of MM and SK, such as Raman spectroscopy (open square),\(^{22}\) SIAscope (open triangle),\(^{23}\) multispectral imaging (open diamond),\(^{24}\) and SolarScan (open circle).\(^{25}\) Note that Lui et al.’s Raman study\(^{22}\) reports three sensitivity and specificity pairs, and they are all included in Fig. 4. In addition, the sensitivity and specificity values for dermatologists specializing

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**Table 1** Skin lesion types evaluated by speckle imaging.

<table>
<thead>
<tr>
<th>Skin lesion type</th>
<th>Number of lesions</th>
</tr>
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<tbody>
<tr>
<td>Malignant melanoma (MM)</td>
<td>25</td>
</tr>
<tr>
<td>Squamous cell carcinoma (SCC)</td>
<td>11</td>
</tr>
<tr>
<td>Basal cell carcinoma (BCC)</td>
<td>31</td>
</tr>
<tr>
<td>Melanocytic nevus (Nevus)</td>
<td>76</td>
</tr>
<tr>
<td>Seborrheic keratosis (SK)</td>
<td>71</td>
</tr>
<tr>
<td>Total</td>
<td>214</td>
</tr>
</tbody>
</table>

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Fig. 3 Four statistical moment distributions for lesion type for the blue (left column) and red (right column) lasers. The bottom and top lines of the box are the 25th and 75th percentile of the data values, respectively, and the central line inside the box indicates the median value. The ends of the whiskers represent the minimum and maximum of the data points.
in melanoma, general dermatologists, and general practitioners are also plotted. Figure 4(a) shows that our diagnostic indicator using the red laser outperformed the Raman sensitivity/specificity pair with the highest sensitivity (the top open square), SolarScan (open circle), multispectral imaging (open diamond), and all three groups of physicians. One of the sensitivity/specificity points of the Raman study (the middle open square) is on the ROC curve, indicating this data point has a similar accuracy as our discriminator. Only the Raman result with the lower sensitivity (the lower open square) and the SIA-scop (open triangle) have a slightly better performance than our technique. The area under curve values for the red and blue lasers are 0.87 and 0.84, respectively, indicating that the blue laser results are slightly inferior to the red laser results. This fact is also reflected in the comparison of the blue laser results with other studies, in that our discriminator performed similar or better only for one Raman data point (the open square with the highest sensitivity value), multispectral imaging (open diamond), general dermatologists (closed square), and general practitioners (closed circle).

5 Conclusions
We demonstrated that the polarization speckle pattern \( D(x, y) \), computed from two cross-polarized intensity speckle patterns, has a potential for skin lesion differentiation. In an in vivo clinical study involving 214 skin cancers and benign skin lesions, we discovered that the statistical moments of the polarization speckle pattern could separate MM from SK, SCC, and BCC using the blue laser, and separate SK from MM, nevus, and BCC using the red laser. Interestingly, our approach is most effective at differentiating MM and SK, which can often resemble each other clinically leading to a diagnostic dilemma, using a high order moment such as the fourth order moment.

<table>
<thead>
<tr>
<th>Table 2</th>
<th>Dunn’s multiple comparison tests for the blue laser.</th>
</tr>
</thead>
<tbody>
<tr>
<td>First order moment ([M])</td>
<td>Second order moment ([\sigma])</td>
</tr>
<tr>
<td>MM versus SK</td>
<td>***</td>
</tr>
<tr>
<td>MM versus SCC</td>
<td>***</td>
</tr>
<tr>
<td>MM versus BCC</td>
<td>*</td>
</tr>
<tr>
<td>Nevus versus SK</td>
<td>*</td>
</tr>
<tr>
<td>Nevus versus SCC</td>
<td>*</td>
</tr>
</tbody>
</table>

Note: The number of asterisks denotes the \( p \) values <0.05(***), <0.01(***) or <0.001(****) in melanoma, general dermatologists, and general practitioners are also plotted. Figure 4(a) shows that our diagnostic indicator using the red laser outperformed the Raman sensitivity/specificity pair with the highest sensitivity (the top open square), SolarScan (open circle), multispectral imaging (open diamond), and all three groups of physicians. One of the sensitivity/specificity points of the Raman study (the middle open square) is on the ROC curve, indicating this data point has a similar accuracy as our discriminator. Only the Raman result with the lower sensitivity (the lower open square) and the SIA-scop (open triangle) have a slightly better performance than our technique. The area under curve values for the red and blue lasers are 0.87 and 0.84, respectively, indicating that the blue laser results are slightly inferior to the red laser results. This fact is also reflected in the comparison of the blue laser results with other studies, in that our discriminator performed similar or better only for one Raman data point (the open square with the highest sensitivity value), multispectral imaging (open diamond), general dermatologists (closed square), and general practitioners (closed circle).

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The proposed method is fast and relatively easy to implement. The measurements could be completed within a few milliseconds so that the critical body movement issue for in vivo study can be resolved. Our approach could potentially become a real-time application. ROC analysis suggested that our method has a high accuracy similar to many other well-known and accepted diagnostic procedures.

Despite the listed advantages of using polarization speckle for skin cancer diagnosis, the physical process underlying the phenomena are not yet fully understood and require further study. We believe that this experimental study will inspire further development of the polarization speckle technique.

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