Elastic scattering spectroscopy for intraoperative
determination of sentinel lymph node status in the breast

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Abstract. The ability to provide the best treatment for breast cancer depends on establishing whether or not the cancer has spread to the lymph nodes under the arm. Conventional assessment requires tissue removal, preparation, and expert microscopic interpretation. In this study, elastic scattering spectroscopy (ESS) is used to interrogate excised nodes with pulsed broadband illumination and collection of the backscattered light. Multiple spectra are taken from 139 excised nodes (53 containing cancer) in 68 patients, and spectral analysis is performed using a combination of principal component analysis and linear discriminant analysis to correlate the spectra with conventional histology. The data are divided into training and test sets. In test sets containing spectra from only normal nodes and nodes with complete replacement by cancer, ESS detects the spectra from cancerous nodes with 84% sensitivity and 91% specificity (per-spectrum analysis). In test sets that included normal nodes and nodes with partial as well as complete replacement by cancer, ESS detects the nodes with cancer with an average sensitivity of 75% and specificity of 89% (per-node analysis). These results are comparable to those from conventional touch imprint cytology and frozen section histology, but do not require an expert pathologist for interpretation. With automation of the technique, results could be made available almost instantaneously. ESS is a promising technique for the rapid, accurate, and straightforward detection of metastases in excised sentinel lymph nodes. © 2004 Society of Photo-Optical Instrumentation Engineers. [DOI: 10.1117/1.1802191]

Keywords: elastic scattering spectroscopy; lymph node staging; breast cancer; diagnostic optical spectroscopy; optical biopsy; sentinel node.

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1 Introduction

Breast cancer is the most common malignancy in women in the western world, with a reported incidence of up to 1 in 8 women. The presence or absence of metastatic cancer in the axillary lymph nodes in patients with breast cancer remains the most powerful predictor of prognosis, and plays an important role in identifying patients who are at risk of developing disease that spreads throughout the body, who are likely to benefit from chemotherapy. Traditionally, the presence of axillary lymph node metastases has been determined by axillary lymph node dissection (ALND), which is a surgical procedure that removes all the lymph nodes under the arm. This is a substantial surgical procedure, however, which can be associated with several serious side effects, the most significant being lymphoedema (persistent swelling of the arm) and shoulder dysfunction, which adversely affect the patient’s quality of life.1

In current surgical practice, most patients present with early disease as a result of increased public awareness of breast cancer and mammography screening programs. Hence most patients do not have axillary lymph node metastases at presentation, and while the staging information is crucial for their future management, they get no therapeutic benefit from ALND, while still being at risk of developing the complications associated with the procedure.
The sentinel node is any lymph node with a direct lymphatic connection to the tumor, and by definition is the first node to be invaded by cancer spreading from the breast. It has been well documented that if cancer cannot be detected in sentinel nodes, the chance of there being any cancer in nodes further down the chain draining the breast is exceedingly small. Thus if the sentinel node can be easily identified, removed, and examined for cancer and no cancer is found, there is no need to remove the rest of the axillary nodes. This markedly reduces the risk of complications associated with full axillary node clearance.

To get the maximum benefit from sentinel node biopsy, it is important to be able to determine rapidly whether or not cancer is present. If the assessment cannot be completed while the patient is still on the operating table, the subsequent discovery of cancer in the node will necessitate a second operation to perform the ALND. This gives rise to additional costs and causes further anxiety to the patient.

Traditionally, intraoperative diagnosis of sentinel nodes has been done by histological examination of frozen sections. In practice, because of their soft texture, frozen sections of lymph nodes are technically difficult to prepare and interpretation may be difficult. Accurate results from frozen sections rely on the skill of an experienced pathologist. It is therefore not surprising that there is wide variation in the reported accuracy of this technique. The best results are those reported by the European Institute of Oncology in Milan, but these were only achieved by 50-µm sectioning. Exhaustive frozen section examination is highly accurate (sensitivity = 93.7%), but consumes vast resources and is time consuming, and therefore is not appropriate in the setting of smaller hospitals. Routine frozen section examination of sentinel nodes has yielded more disappointing results, with sensitivities ranging from 44 to 87%.

Touch imprint cytology (direct imprinting of the tissue onto a thin glass slide, staining the cells, and examining them under a microscope) is one of the oldest techniques in cytology and is now being applied to the examination of sentinel lymph nodes. It is quick and easy to perform and gives similar results to frozen sections. Both techniques, however, are reliant on the availability of a highly skilled cytopathologist, and it is likely that the excellent results reported from specialist units will not be replicated in smaller hospitals relying on a general pathologist for reporting.

The lack of a more generally available and reliable intraoperative tool to establish the sentinel node status remains an obstacle to the routine practice of sentinel node biopsy. A real-time optical method for determining sentinel node involvement would provide significant benefits to patients undergoing surgery for breast cancer. Elastic scattering spectroscopy (ESS), when performed using an appropriate optical geometry, is sensitive to the sizes, indices of refraction, and structures of the subcellular components (e.g., nucleus, nucleolus, and mitochondria) that change with malignant transformation. The measured ESS spectra relate to the wavelength dependence and angular probability of the scattering efficiency of tissue microcomponents, as well as to absorption bands. Consequently, based on the fact that many tissue pathologies and most cancers exhibit morphological changes at the cellular and subcellular level, this approach generates spectral signatures that reflect the changing tissue parameters that pathologists address. These include the size and shape of nuclei and organelles, the nucleocytoplasmic ratio, and chromatin density. Both Mie theory and finite-difference time domain methods have been employed successfully to model spectral changes resulting from malignant transformation. Multivariate statistical analysis can be used to recognize patterns within the spectra, which can then be used to discriminate between spectra from malignant and benign tissue once appropriate diagnostic algorithms have been developed.

Analysis of ESS spectra has the potential to provide an instant diagnosis for use during surgery, which would be ideal for differentiating sentinel nodes with and without cancer. Further, the results are not subjective and do not require interpretation by a pathologist. ESS has been studied previously as a minimally invasive diagnostic technique where access to the tissue is achieved using either direct topical access or mediated by endoscopy. We have previously reported the results of a pilot study on the use of ESS in the assessment of breast tissue and axillary nodes.

We present the results of the second phase of our study on sentinel node assessment in breast cancer using elastic scattering spectroscopy, in which a larger dataset and new statistical methods have been used.

2 Materials and Methods

2.1 Elastic Scattering Spectroscopy System

The ESS instrumentation consists of a pulsed xenon arc lamp, an optical probe, a spectrometer, and a computer to control the various components and record the spectra. The arc lamp, spectrometer, and power supply are housed in a briefcase-size unit to which the laptop computer is connected. ESS involves directing short pulses (~1 μs) of white light (320 to 920 nm) from the pulsed xenon arc lamp (Perkin Elmer, Incorporated) through a flexible optical fiber (400 µm) touching the tissue to be interrogated. Ultraviolet B (280 to 315 nm) and ultraviolet C (100 to 280 nm) light is filtered out to avoid any potential risk to patients. A collection fiber (200 µm), with a fixed separation distance of ~350 µm from the first fiber (center-to-center), collects light scattered from the upper layers of the tissue.
tissue and propagates it to the spectrometer (S2000 Ocean Optics), which outputs the spectrum to the laptop computer for recording and further analysis.

Figure 2 shows a schematic diagram of the system. The whole fiber assembly measures 1.5 mm in diameter and the distal end is housed in a rigid stainless steel casing for easy handling and sterilization. The collection and recording of a single spectrum takes less than a quarter of a second, with the integration time of the detector (20 to 40 ms per pulse) being the limiting factor.

Before any spectra of the lymph nodes are taken, a white reference spectrum is recorded. This establishes the system response by recording the diffuse reflectance from a flat surface of Spectralon\textsuperscript{SM} (Labsphere, Incorporated), which is spectrally flat between 250 and 1000 nm. The reference spectrum allows spectral variations in the light source, spectrometer, fiber transmission, and fiber coupling to be accounted for. Each consequent lymph node spectrum was divided by this reference spectrum, fiber transmission, and fiber coupling to be accounted for.

Each smoothed spectrum was then standardized by subtracting the mean intensity of the spectrum (i.e., the average intensity over the full spectral range) from each data point. Each point was then divided by the standard deviation of the smoothed spectrum. This method of standardization gave all the spectra a mean intensity of zero and a standard deviation equal to one. Using this standardization meant that only the relative intensities across the whole wavelength range were important and not the actual light intensity, and as such the number of light pulses used to generate a spectrum did not have to be taken into account when analyzing the spectra. In the set of spectra used in this analysis, no obvious outliers were detected; however, a number of spectra (unstandardized) were found to be negatively saturated (i.e., intensity of zero) at 420 or 550 nm, corresponding to the hemoglobin absorption peaks. In all cases the spectra were saturated only at the center of the peaks and not anywhere else. This saturation was considered to have a minimal effect on the rest of the spectrum, so these spectra were not removed from the analysis.

2.3 Histopathology

After the spectra had been taken, the bivalved lymph nodes were fixed in formalin and sent for histopathological processing. For sentinel nodes, this consisted of routine three level paraffin-embedded sections, with the addition of immunohistochemistry (IHC) for cytokeratin if the hematoxylin and eosin (H and E) staining did not show any tumor. Nonsentinel nodes (bivalved) were sectioned through a single level and stained only with H and E.

It was not possible to obtain the histological diagnosis specific to the site (within the node) of each spectral measurement, as this would involve microdissection of the nodes that could interfere with the overall histological analysis. To reduce the effect of this lack of one-to-one correlation, the lymph nodes were classified as either normal or metastatic, and the metastatic nodes were subdivided into those nodes with total replacement by cancer, partial replacement by cancer, and those which showed cancer detectable only using IHC.

2.4 Spectral Processing

All the spectra used in the analysis underwent smoothing, in which each intensity point was replaced by the average of the 20 neighboring intensity points (namely, moving average smoothing with a span of 20 points). The smoothed data were then reduced from the 1801 points, corresponding to the spectrometer resolution, down to 180 intensity values, to speed further manipulation. The wavelength window used was reduced from 320 to 920 nm to remove the regions of the spectra with low signal-to-noise ratios arising from the lower light intensity emitted by the Xenon arc lamp at the extremes of its output spectrum.

In all cases the spectra were saturated only at the center of the peaks and not anywhere else. This saturation was considered to have a minimal effect on the rest of the spectrum, so these spectra were not removed from the analysis.

Principal component analysis (PCA) was applied to the spectra to reduce the data to only those regions with large
variability. This was carried out using the statistical package Systat. Linear discriminant analysis (LDA) was then carried out (also using Systat) on the principal components to improve on the discrimination between the normal and metastatic nodes.

### 3 Results

A total of 139 (sentinel and nonsentinel axillary nodes) from 68 patients were used in this study. Of these, 53 were shown to contain cancer on histology (metastatic nodes) and in 86, no cancer could be detected (normal nodes). Details are summarized in Table 1. From the spectra, 20 principal components were extracted, to include any spectral component contributing more than 0.01% of the variability. A plot of the first two principal components, shown in Fig. 3, immediately showed some obvious discrimination between metastatic and normal nodes.

Linear discriminant analysis (LDA) was subsequently carried out (also using Systat) on all the principal components to improve on the discrimination between normal and metastatic nodes already shown by the first two principal components. Two different analyses were undertaken on this data; a per-spectrum analysis and a per-node analysis.

**Table 1** Distribution of the histological classification of the axillary lymph nodes used in this study.

<table>
<thead>
<tr>
<th></th>
<th>Nodes</th>
<th>Spectra</th>
</tr>
</thead>
<tbody>
<tr>
<td>Total number in study</td>
<td>139</td>
<td>782</td>
</tr>
<tr>
<td>Normal nodes</td>
<td>86</td>
<td>394</td>
</tr>
<tr>
<td>Metastatic nodes</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Total metastases</td>
<td>25</td>
<td>219</td>
</tr>
<tr>
<td>Partial metastases</td>
<td>22</td>
<td>114</td>
</tr>
<tr>
<td>Micro-metastases and metastases only positive on IHC</td>
<td>6</td>
<td>55</td>
</tr>
<tr>
<td>Total number of metastatic nodes</td>
<td>53</td>
<td>388</td>
</tr>
</tbody>
</table>

In the per-spectrum analysis, only the spectra from the totally metastatic and the normal nodes were used. The partial, micro- and IHC-only metastatic nodes were excluded from this analysis due to the uncertainty of the per-spectrum histological diagnosis in these nodes. To assess the accuracy of the LDA analysis on a per-spectrum basis, a leave-one-out cross-validation was undertaken.

In general, more than one spectrum was taken per node. Thus to assess each node as a single entity, based on the combined diagnosis of all the spectra from a single node, the per-node analysis method was undertaken. In this per-node analysis, if any one of the spectra from a particular node was classified as metastatic by the LDA algorithm, the whole node was regarded as metastatic. All the nodes were used in the per-node analysis, including the partial-, micro-, and IHC metastatic nodes. The leave-one-out cross-validation in Systat was regarded as inappropriate for the per-node analysis, as Systat does not output the cross-validated diagnosis predictions for each spectrum, but rather the unvalidated diagnosis predictions. To overcome this limitation for the per-node analysis, three randomly assigned combinations of training set and test set were used for cross-validation instead of the leave-one-out method. The reason multiple training-set/test-set combinations were used as opposed to just one was to ensure that the results obtained were not training-set specific. Further, all the spectra from a particular node were allocated to either the training set or the testing set, such that systematic effects were removed. Such systematic effects are a common problem in this sort of analysis, though this is rarely recognized.

As histology was only available on a per-node basis, only the normal nodes and those with total metastatic replacement were used in the training sets for both the per-node and per-spectrum analyses. The data were split between the training and test sets, using a random number generator in Excel, such that 50% of the normal nodes and 50% of the nodes with total metastatic replacement were in the training set, and the remaining 50% of these nodes, along with the partially metastatic, micro-metastatic, and IHC nodes, were in the test set.

Patent blue dye was used to locate the sentinel nodes for excision, and as such the spectra from these nodes showed an absorption peak at ~650 nm, which was not present in the nonsentinel nodes. The presence of blue dye in only the sentinel nodes was not expected to influence the analysis, since the proportion of positive and negative nodes was similar in the sentinel and nonsentinel nodes. This was confirmed in a separate analysis (data not shown).

Figure 4 shows the density of the canonical scores from the LDA for both the metastatic and normal nodes. The discrimination shown in this figure is encouraging. Only a small number of spectra from normal nodes have scores that fall into the range associated with metastatic nodes, taking the dividing diagnostic canonical score as zero. The number of spectra from metastatic nodes having scores that fall into the range associated with normal nodes was much higher, but this was expected due to the high probability of interrogating normal sites in the partially metastatic, micro-metastatic, and IHC positive nodes. As would be expected, the discrimination demonstrated in the per-node analysis scores is much better than for the per-spectrum scores.

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**Fig. 3** Scatter plot of the first and second principal components of the ESS spectra.
Table 2 shows a summary of the results obtained from the LDA. The per-spectrum sensitivity was 84% and the specificity was 91%. Note that the partial- and micro-metastatic nodes and IHC positive nodes were not included in this per-spectrum analysis, as mentioned earlier. The per-node analysis on all the nodes, in which one positive spectrum was taken to imply the whole node as metastatic, gave an average sensitivity of 75% and a specificity of 89%.

A breakdown of the ESS diagnoses of the metastatic nodes for the three different training-set/test-set combinations is shown in Table 3. This demonstrates the high accuracy (>90%) with which ESS spectra pick up the totally metastatic nodes. The detection of partial metastases was less consistent with accuracies ranging between 19 and 86%. It was interesting to find that in two of the three training-set/test-set combinations, those nodes with micro-metastases and those positive only on IHC were detected with 100% accuracy. This may suggest some changes are occurring in the nodes in the early stages of metastasis that are not readily visible under a microscope, but which can be detected by ESS. Further work is currently underway to ascertain whether this is purely a chance occurrence or whether this is a more fundamental observation that might be exploited in future studies.

Table 3 ESS diagnostic sensitivity for the detection of cancer for each randomly selected training/test set combination, showing the individual sensitivities for the total, partial, and micro/IHC metastases in the test set.

<table>
<thead>
<tr>
<th></th>
<th>Test set 1 sensitivity</th>
<th>Test set 2 sensitivity</th>
<th>Test set 3 sensitivity</th>
</tr>
</thead>
<tbody>
<tr>
<td>Total metastases</td>
<td>90%</td>
<td>100%</td>
<td>90%</td>
</tr>
<tr>
<td>Partial metastases</td>
<td>86%</td>
<td>68%</td>
<td>19%</td>
</tr>
<tr>
<td>Micro-metastases and IHC metastases only</td>
<td>60%</td>
<td>100%</td>
<td>100%</td>
</tr>
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</table>

4 Discussion

This study shows that ESS is an effective way to detect cancer in excised axillary lymph nodes. The average sensitivity per node for detecting cancer is 75% with an average specificity of 89%. One test set gave a low figure for sensitivity in nodes with only partial replacement with cancer, but this may have been related to the limited number of spectra taken from some nodes. ESS is a point measurement, and to obtain the best results from this technique, it will be necessary to develop ways of interrogating nodes more thoroughly. This can be achieved by either the collection of multiple spectra by scanning across each cut surface of the node, or by increasing the number of surfaces to be interrogated by cutting the node into multiple layers. Of course, the same sort of sampling problem applies to histo- and cyto-pathological techniques for detect-
Elastic scattering spectroscopy for intraoperative determination... results can be achieved by individuals with minimal training, in the absence of an expert pathologist.

In our hospital breast unit, touch imprint cytology is currently the most practical method used in sentinel node assessment, as it gives results in a matter of tens of minutes with a sensitivity of 75% and a specificity of 99%, although it does require the presence of an experienced cytologist. Once the discriminating algorithm has been perfected, ESS will take only a few seconds to acquire and analyze each spectrum from an excised and sectioned lymph node.

Sentinel node biopsy is being used routinely in the staging of a range of potentially life-threatening cancers, including malignant melanoma of the skin, head and neck cancers, penile carcinoma, and vulval carcinoma. It is likely that further applications of ESS will be developed in these areas in the future.

At present, the analysis of ESS spectra is empirical, as it is not known which histological and cytological features are reflected in spectral changes. Studies are underway to elucidate these problems, and it is hoped that a better understanding of how spectral changes are generated will lead to the development of more accurate diagnostic algorithms. Nevertheless, the evidence we have at present suggests that ESS could become a straightforward and valuable technique for the rapid and accurate detection of metastatic breast cancer in sentinel lymph nodes.

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