Usefulness of Evaluation of Nuclear Color by Visible-Microscopic Spectroscopy for Objective Differentiation between Non-Cancer and Cancer Cells Prepared Using Liquid-Based Cytology

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Abstract

Objective: The aims of this study were to investigate the usefulness of color evaluation of the nuclear region using visible-microscopic spectroscopy (Vis-MS) and to clarify whether it can serve as an index to distinguish cancer cells in liquid-based cytology (LBC). Vis-MS is a spectral analysis technique widely used for absorption and fluorometric analyses in the analytical chemistry field. Vis-MS has been applied to histological diagnosis, but only a few studies on its application to cytology have been performed, and no investigations have been performed for LBC, which is expected to become widely used in Japan. Study design: Using culture cell lines of non-cancer cells and cancer cells, transmittance at 530 nm (maximum absorption wavelength of eosin), 580 nm (hematoxylin), and 630 nm (light green), and 530 nm/580 nm and 630 nm/580 nm transmittance ratios were analyzed.

Results: Two variances of the transmittance at 580 nm and 630 nm/580 nm transmittance ratio were finally extracted as effective items after applying forward and backward variance selection and investigation of multicollinearity. The odds ratios of 580 nm transmittance and 630 nm/580 nm transmittance ratio were 0.48 and 0.72, respectively. The cancer cell discrimination predictive value determined using the logistic regression equation was 98.0%, being favorable.

Conclusion: It was suggested that Vis-MS is useful to evaluate the color of the nuclear region and serves as a cancer cell discrimination index for LBC. We are planning to apply Vis-MS to clinical materials and develop nuclear color evaluation using Vis-MS into an objective index for cases in which cancer cell judgment is difficult.

Keywords:
Liquid-based cytology; Visible-microscopic spectroscopy; Papanicolaou stain; Logistic regression

Introduction

Visible-microscopic spectroscopy (Vis-MS) is a spectral analysis technique widely used for absorption [1] and fluorometric [2] analyses in the analytical chemistry field. The solvent of most samples of Vis-MS is an aqueous solution, and only a few studies with materials of histological diagnosis [3,4] and cytology [5] have been performed. Regarding the staining method used for Vis-MS, studies on Feulgen’s reaction and staining with hematoxylin alone [6-9] have been performed, but only a few studies have been performed for unstained samples and Papanicolaou staining [10].

Liquid-based cytology (LBC) is expected to become widely used in Japan. Using a residual LBC sample remaining in a vial, additional tests (immunocytochemistry and gene analysis) can be performed, increasing the diagnostic accuracy [11-16]. However, increased staining intensity of the nuclear chromatin and nuclear size reduction in LBC samples may make cancer cell judgment difficult in well-differentiated adenocarcinoma lacking atypia [17-22].

Conventionally, the color density of the nuclear region of cancer cells has been an important diagnostic factor. Generally, however, color evaluation of this region is subjective and varies widely among observers. Major characteristics of Vis-MS are: 1) It represents the color of the nuclear region by dispersing and redifferentiating it as continuous wavelengths in the visible light range (400-700 nm), and 2) it expresses the color density of the nuclear region as the transmittance of each continuous wavelength. Using Vis-MS, color evaluation of the nuclear region of cancer cells is expected to become more detailed and objective, improving the precision of discrimination between cancer and non-cancer cells.

The objectives of this study were to investigate the usefulness of color evaluation of Papanicolaou-stained nuclear regions using Vis-MS and to clarify whether it can serve as a cancer cell discrimination index for LBC. The goal for the future is to apply evaluation of the color of the nuclear region using Vis-MS to clinical cases in which cancer cell discrimination is difficult and to establish an objective index for cancer cell judgment using Vis-MS.

Material and Methods

Cultured cells used for LBC

For non-cancer-derived cells, 2 cell lines: human skin fibroblasts (NHDF) [23] and African green monkey kidney-derived cells (COS-7) [24], were used. For cancer cells, 4 cell lines: human lung cancer cells

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In a Papanicolaou-stained nuclear region, the total absorbance of these dyes (additive property of absorbance) is measured (equation 2.2).

### Data correction with 580 nm transmittance

Generally, a color is presented as the maximum absorption wavelength of the color, or numerically presented using a spectrophotometer. However, in samples with multiple staining, such as those stained with Papanicolaou and hematoxylin-eosin (HE), the spectral absorbance has to be interpreted as absorbance of the total concentration of the dyes based on the additive property of absorbance (equation 2.2) [31]. In this study, setting the baseline at the absorbance of the maximum absorption wavelength of hematoxylin dye, 580 nm, the ratio of the absorbance of the maximum absorption wavelength of each dye to the baseline was used as a corrected value for standardization, that is, the intensities of eosin and light green dyes were presented as the 530 nm/580 nm and 630 nm/580 nm transmittance ratios, respectively. A high 530 nm/580 nm transmittance ratio indicates that the transmittance at 530 nm (purplish-red) relative to that at 580 nm (purple) is high, that is, the color tone is bright purplish-red, and a high 630 nm/580 nm transmittance ratio indicates that the transmittance at 630 nm (blue/green) relative to that at 580 nm (purple) is high, that is, the color tone is bright blue/green. The use of these corrected values is advantageous in that the additive property of absorbance in multiple stained samples can be corrected, which enables expression of the color tone. Nuclear dye was measured in 50 cells of each cell line, 300 cells in total: 100 non-cancer-derived cells and 200 cancer cells.

In the data on this nuclear color analysis: 1) transmittance represents brightness of the absorption wavelength, and 2) a corrected value represents color tone of the wavelength.

### Statistical analysis

The means and standard deviations of transmittance at wavelengths of 530, 580, and 630 nm in non-cancer and cancer cells were calculated. Similarly, the means and standard deviations of 530 nm/560 nm and 630 nm/580 nm transmittance ratios were calculated. After testing the normality of distribution of each data set in the non-cancer and cancer cells using the Shapiro-Wilk test, the significance of differences between the non-cancer and cancer cells was tested as follows:

When the distribution was not normal, the Mann-Whitney U test was employed. When the distribution was normal, equality of variances was tested in each sample using Levene’s test. The t-test and Welch’s test were used to test the significance of differences when the variance was equal and unequal, respectively. These statistical analyses
were performed using statistical analysis software, SPSS 16.0j.

Factors influencing predictive cancer cell judgment were analyzed using binomial logistic regression analysis [32]. A logistic regression model is a method to analyze the relationship between objective and explanatory variances, regarding a binary variance as an objective variance. For example, a binary variance represents data assigning D=0 to a non-cancer cell and D=1 to a cancer cell. In the logistic regression model, the probability that this binary variance is 1 (D=1) is designated as p. Probability p is explained with explanatory variances, such as the 260 nm and 280 nm transmittance values, in this model. In a binomial logistic regression model, when the number of explanatory variances is k [x=(x1, x2, …xk)] for logit of probability p, these are related by the following functions:

\[
\log \left( \frac{p(x)}{1-p(x)} \right) = \hat{a}_1 + \hat{a}_2 x_1 + \hat{a}_3 x_2 + \cdots + \hat{a}_k x_k
\]

\[
p(x) = \frac{1}{1+\exp(-(\hat{a} + \hat{a}_1 x_1 + \hat{a}_2 x_2 + \cdots + \hat{a}_k x_k ))}
\]

The ratio of occurrence probability, p(x), to non-occurrence probability, 1-p(x), is termed the odds, and its natural logarithm is termed the logit of probability p(x). Therefore, the logistic regression model is intended to explain the logit of probability of an event with explanatory variances.

Regarding multicollinearity that destabilizes the logistic regression model, variances with a Spearman’s rank correlation coefficient r>0.8 between explanatory variances were excluded. In addition, univariate logistic regression analysis was performed in consideration of the relationship of a cancer cell (D=1) with each variance. For the selection of explanatory variances, forward and backward variance selection using the likelihood ratio test was employed. Goodness of fit of the logistic regression equation was analyzed using the likelihood ratio test. In the residual test, when the absolute value was greater than the residual test value, the model was regarded as an outlier. These statistical analyses were performed using statistical analysis software, Ekusuru-Toukei 2012 (Social Survey Research Information Co., Ltd.).

Results

Papanicolaou-stained non-cancer-derived and cancer cells

Figure 1 shows Papanicolaou-stained non-cancer-derived and cancer cells and the measured areas. The cell appearance pattern was scattered with poor connectivity in all non-cancer-derived cells: NHDF (Figure 1a) and COS-7 (Figure 1b), and cancer cells: LS-180 (Figure 1c), Kato-III (Figure 1d), MCF-7 (Figure 1e), and A549 (Figure 1f). The cell shape was round/oval. The nucleus:cytoplasm ratio (N/C ratio) was high (about 80-90%). The nucleus was round/oval, and 1 or 2 small nucleoli were noted. Regarding the color of the nucleus of each cell, the intensity of purple was stronger in cancer cells than in non-cancer-derived cells. Regarding the color tone to distinguish non-cancer and cancer cells, it is difficult to express the cytological findings with purplish-red and bluish-purple tones, other than purple.

Vis-MS spectral analysis of non-cancer-derived and cancer cells

The nuclear area measured in the images of Papanicolaou-stained cells and the ratio of the nuclear area to the Vis-MS measurement area (nuclear area/measurement area ratio) are compared between non-cancer and cancer cells in Table 1. The ratios were 1.13 ± 0.22 and 1.10 ± 0.21 in non-cancer and cancer cells, respectively, showing no significant difference. The nuclear area was slightly larger than the measurement area in both non-cancer and cancer cells.

The results of Vis-MS spectral analysis are shown in Table 2. The values corrected with the transmittance ratio of non-cancer and cancer cells are shown in Figure 2. The 580 nm transmittance was significantly lower (high intensity of purple) in cancer cells (27.4 ± 6.7%) than in non-cancer cells (51.5 ± 9.3%) (p<0.001). The 530 nm/580 nm transmittance ratio was significantly higher (pale red) in cancer cells (109.1 ± 6.5%) than in non-cancer cells (95.2 ± 4.2%) (p<0.001), and the 630 nm/580 nm transmittance ratio was significantly lower (dark blue/green) in cancer cells (45.7 ± 7.7%) than in non-cancer cells (64.2 ± 8.6%) (p<0.001).

Prior to binomial logistic regression analysis, a variance with a 0.8 or greater correlation coefficient of covariance-variance matrix between explanatory variances is deleted because it has multicollinearity. In the analysis of Spearman’s rank correlation coefficient (Table 3), the correlation coefficient between the 580 nm transmittance and the 530

![Figure 1: Papanicolaou-stained cells by LBC](Image)
binomial logistic regression analysis of Vis-MS analysis to distinguish non-cancer and cancer cells: 1) The 580 nm transmittance and the 530 nm/580 nm transmittance ratio are regarded as explanatory variances, 2) the 580 nm transmittance and the 630 nm/580 nm transmittance ratio are regarded as explanatory variances, and 3) the 530 nm/580 nm and 630 nm/580 nm transmittance ratios are regarded as explanatory variances, and analyses were performed using analysis software. Analysis with Condition 1) was discontinued during the analysis using software due to an error: ‘inverse matrix of Fisher information matrix is absent on the 47th repetitive estimation’. In Condition 3), all values were corrected with the 580 nm transmittance. Since we wanted to include transmittance expressing brightness and intensity of color in the variances, this condition was excluded. As a result of the above process, finally, binomial logistic regression analysis with the 580 nm transmittance and the 630 nm/580 nm transmittance ratio as explanatory variances was performed.

The results of binomial logistic regression analysis are shown in Table 5. The 580 nm transmittance (p<0.001) and the 630 nm/580 nm transmittance ratio (p<0.001) were selected as factors influencing the predictive judgment of cancer cells. The likelihood ratio test result of the regression equation was P<0.001, showing a favorable fit. The odds ratios of the 580 nm transmittance and the 630 nm/580 nm transmittance ratio were 0.48 (95% confidence interval: 0.34-0.67) and 0.72 (95% confidence interval: 0.59-0.87), respectively. None of these 95% confidence intervals was 1, and the discrimination predictive value of the predicted and measured value was 98.0%. On the residual test, outliers with a studentized residual exceeding 2 accounted for only 0.3%. The logistic function is shown below, and it was clarified that the cancer cell probability (p) of the measured cell can be determined using the following equation.

\[
p(x) = \frac{1}{1 + \exp\left(-41.19 + 0.73x_1 + 0.33x_2\right)}
\]

where \(x_1 = [580\text{nm}]\) and \(x_2 = [630/580\%]\).

**Discussion**

In terms of the characteristics of LBC, the cell distribution is homogeneous, the nuclear size is slightly reduced, and the nucleus is intensely stained. These characteristics tend to make cancer cell judgment difficult in well-differentiated adenocarcinoma lacking atypia [16-21]. According to the cellular findings in our study, non-cancer- and cancer cells were similar with regard to many of the points, and differentiation of them was difficult. Discrimination between non-cancer and cancer cells used to be difficult with LBC procedure (Figure 1). In conventional methods, it is difficult similarly. However, using Vis-MS, redifferentiation of the color of the nuclear region and quantification of the density became possible, allowing more accurate and objective judgments. As a result, a logistic regression model (R square 0.92) to calculate the probability of a cell being cancerous could be obtained. Thus, we investigated the usefulness of evaluating the color of the nuclear region using Vis-MS to discriminate cancer and non-cancer cells. In nuclear color evaluation using Vis-MS, light that passed through the 530 nm transmittance ratio was r=-0.66 (p<0.01), that between the 580 nm transmittance and the 630 nm/580 nm transmittance ratio was r=-0.79 (p<0.01), and that between the 530 nm/580 nm and 530 nm/580 nm transmittance ratios was r=-0.51 (p<0.01), being r<0.8, clarifying that measurements between the variances are useful for the analysis.

The discrimination predictive value of each variance is determined, and the discrimination predictive values were high (95.7, 92.0, and 88.7, respectively), showing that these were useful as explanatory variances for this analysis.

Accordingly, the following 3 conditions were candidates for
through the nucleus was split, and the spectrum of transmittance at each visible light wavelength was employed, which led to objective data being obtained. Bisterfeld et al. [9] acquired nuclear spectra of uterine cervical squamous cell carcinoma cells using Feulgen’s reaction, simple hematoxylin staining, and Papanicolaou staining, but the DNA level could not be measured in simple hematoxylin- and Papanicolaou-stained cells. Some studies reported that Feulgen’s reaction was useful for cancer cell judgment [5-10], but such judgment based on Papanicolaou-stained nuclear color analysis has not been reported.

In our analytical data, using not only transmittance but also the ratio of transmittance at each wavelength to that at 580 nm, which is a corrected variance representing the color ratio, it was clarified that dark green compared with purple and pale red compared with purple are useful to discriminate cancer cells. The interpretation of these color ratios was also applicable for cancer cell judgment of cells containing pale chromatin (pale purple). However, judgment of the color ratio by the human eye may be difficult.

The interpretation of nuclear color depends on the property of the staining dye. In Papanicolaou-stained nuclei, basic components (such as DNA) are stained with hematoxylin, and acidic components (such as proteins) are stained with eosin and a light green dye. Upon staining with a single dye, transmittance represents the brightness based on the maximum absorption of the dye. Measurements at the maximum absorption wavelengths, of 580 and 530 nm, are sufficient for simple staining with hematoxylin and eosin, respectively. However, Papanicolaou staining involves multiple staining, and the nuclear spectrum represents the total concentration of nuclear dyes due to the additive property of absorbance (equation 2.2). Specifically, Papanicolaou staining involves multiple staining with hematoxylin, OG-G, and EA-50. Therefore, the nuclear spectrum on Papanicolaou staining reflects the total absorbance of these dyes due to the additive property. Thus, correction of the transmittance of the maximum absorption wavelength of each dye to that of hematoxylin dye as a corrected value and employed it as a variance. This is a unique characteristic of this study not noted in previous studies. For eosin and light green dyes, 530/580 and 630/580 nm ratios were employed as corrected values, respectively. A high 530/580 nm ratio indicates an intense purplish/red tone compared with purple, the color of hematoxylin. A high 630/580 nm ratio indicates intense bluish-purple. Color tone can be expressed using these standardized corrected values, which is an advantage of this method.

When these findings of the spectral wavelengths were converted to the color of the nuclear region, it was clarified that, to predict cancer cells, it is useful to pay attention to a high intensity of purple (low 560 nm transmittance, p<0.001), an intense green color compared with purple (low 630 nm/580 nm transmittance ratio, p<0.001), and a pale red color compared with purple (high 530 nm/580 nm transmittance ratio, p<0.001). As an objective method to identify an unknown cell as a cancer cell or not, binomial logistic regression analysis of the 580 nm transmittance and the 630 nm/580 nm transmittance ratio on Vis-MS was useful (equation: R\(^2\) = 0.92, discrimination predictive value: 98% (p<0.001)) (Table 5).

These findings suggest that evaluation of the color of the nuclear region using Vis-MS is useful to judge cancer cells on LBC. This method is objective and accurate, and suggested to be useful for cancer cell judgment of cultured cell lines. This analytical method employing Vis-MS applicable for LBC is expected to become widely used. We are planning to apply this nuclear color evaluation method employing Vis-MS to clinical materials and establish an objective index to identify cancer cells in cases that are difficult to judge.

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| Partial regression coefficient | Standardized partial regression coefficient | Test of significance of partial regression coefficient | Odd ratio | 95% confidence interval of odd ratio |
|--------------------------------|------------------------------------------|-----------------------------------------------|----------|-----------------------------------|
| 580 nm                          | -0.73                                    | <0.001                                        | 0.48     | 0.34                              |
| 630/580 rate                    | -3.98                                    | <0.001                                        | 0.72     | 0.59                              |
| Constant                        | 48.19                                    |                                               |          | 0.87                              |

**Table 4:** Univariate logistic regression analysis.

**Table 5:** Binomial logistic regression analysis of 580 nm value and 630/580 nm value ratio.
