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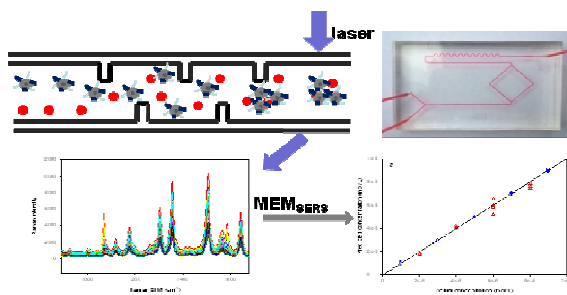
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# Improving the Quantitative Accuracy of Surface-Enhanced Raman Spectroscopy by the Combination of Microfluidics with Multiplicative Effects Model

Tian-Hong Xia, Zeng-Ping Chen\*, Yao Chen, Jing-Wen Jin and Ru-Qin Yu

State Key Laboratory of Chemo/Biosensing and Chemometrics, College of Chemistry and Chemical Engineering, Hunan University, Changsha 410082, China

## Graphical and text abstract



Accurate quantitative SERS analysis was achieved through the combination of microfluidics with Multiplicative Effects Model.

1 **Improving the Quantitative Accuracy of Surface-Enhanced Raman Spectroscopy**  
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8 State Key Laboratory of Chemo/Biosensing and Chemometrics, College of Chemistry  
9 and Chemical Engineering, Hunan University, Changsha 410082, China

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14 \* Corresponding author

15 Tel.: (+86) 731 88821989; Fax: (+86) 731 88821989;

16 E-mail Address: zpchen2002@hotmail.com (Z.P. Chen)

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21 **ABSTRACT**

22 In this contribution, the combination of polydimethylsiloxane microfluidics with a  
23 recently developed multiplicative effects model for surface-enhanced Raman  
24 spectroscopy ( $MEM_{SERS}$ ) has been proposed to improve the accuracy and precision of  
25 quantitative SERS assays based on silver nanocolloids. The performance of the  
26 proposed method has been tested on two proof-of-concept systems and another real  
27 system (i.e., quantification of Rhodamine 6G by both internal standard addition and  
28 internal standard tagging detection modes, quantification of malachite green in  
29 fishpond water by internal standard addition detection mode). The average relative  
30 prediction error values of the proposed method for the test samples of the above three  
31 systems were 6.0%, 8.6% and 8.4% respectively. Conservatively speaking, these  
32 results demonstrated that accurate quantitative SERS analysis with an average relative  
33 prediction error less than 10% can be expected through the combination of  
34 microfluidics with  $MEM_{SERS}$  calibration model.

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37 **Key words:** Quantitative Surface-Enhanced Raman Spectroscopy, Multiplicative  
38 Effects Model, Microfluidics

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## 43 1. INTRODUCTION

44 Due to its unique advantages, such as narrow spectroscopic bands with excellent  
45 molecular specificity, reduced photo-bleaching, simple pretreatment, and ultra high  
46 sensitivity, surface-enhanced Raman spectroscopy (SERS) has attracted substantial  
47 research interests, since it was first observed in 1974 by Fleischman et al.<sup>1</sup> Though the  
48 full consensus on SERS enhancement mechanism has not yet been reached, SERS  
49 technique has been successful applied to many areas such as biological detection of  
50 cell and biomacromolecules,<sup>2-4</sup> monitoring of interactions between biological  
51 molecules,<sup>5</sup> characterization of biological tissue in vitro and in vivo<sup>6,7</sup>.

52 Although SERS has above-mentioned significant advantages, its limitations are  
53 also very straightforward. SERS effect relies heavily on the preparation of nano-rough  
54 metal enhancing substrates (such as nano-silver or gold colloids). The absolute  
55 intensities of SERS signals depend on not only the concentrations of the analytes of  
56 interest, but also the degree of aggregation, the particle size and shape of the metal  
57 colloids, and laser focusing position as well. Therefore, the heterogeneity of the  
58 enhancing substrates can cause significant variations in the absolute SERS intensities  
59 and hence significantly deteriorate the precision and accuracy of quantitative SERS  
60 analysis.

61 In recent decades, there have been many technological developments to improve  
62 the accuracy and precision of quantitative SERS assays, which can be roughly  
63 classified into the following three categories: (1) Designing and fabricating highly  
64 sensitive and reproducible SERS enhancing substrates. It has been a major  
65 preoccupation of researchers interested in developing practical SERS assays.<sup>8-12</sup> Due  
66 to their ease of preparation, excellent enhanced effect and especially the ability to be  
67 dispersed in macrostructure such as cells and tissue samples, Ag and Au nanoparticle  
68 colloids are the most commonly used SERS enhancing substrates. Nevertheless, noble  
69 metal nanoparticle colloids especially silver colloids are notoriously difficult to  
70 produce with high reproducibility, which presents a major challenge for quantitative

71 SERS assays; (2) Utilizing internal standard method or microfluidic technology to  
72 mitigate the confounding effects on SERS signals caused by variations in the physical  
73 properties of enhancing substrates, the intensity and alignment/focusing of laser  
74 excitation source.<sup>13, 14</sup> But the application of conventional internal standard method  
75 requires that the internal standard used must have one or more SERS peaks in  
76 spectrally silent regions of the analyte of interest, other coexisting SERS-active  
77 compounds and possible background fluorescence interference. Such a stringent  
78 requirement renders the conventional internal standard method hardly applicable in  
79 practice; (3) Adopting multivariate calibration methods such as partial least squares  
80 (PLS) to improve the quantitative accuracy and precision of SERS assays.<sup>15, 16</sup>  
81 Compared with univariate calibration approaches, the application of multivariate  
82 calibration methods can indeed result in somewhat improvement in the precision and  
83 accuracy of quantitative SERS analysis. However, the improvement potential is rather  
84 limited considering that existing multivariate calibration methods do not explicitly  
85 model the relationship between the physical properties of SERS substrates and the  
86 SERS intensities of analytes. Methods which can effectively eliminate the  
87 confounding effects caused by variations in the physical properties of enhancing  
88 substrates, the intensity and alignment/focusing of laser excitation source are  
89 therefore highly desirable to upgrade SERS technique to routine quantitative tool.

90 In this contribution, we combined microfluidic technology<sup>17, 18</sup> with a  
91 multiplicative effects model for surface-enhanced Raman spectroscopy<sup>19</sup> to improve  
92 the quality of results in quantitative SERS assays. The utilization of microfluidics in  
93 SERS detection aims to solve the problems associated with the static SERS detection  
94 mode, such as varying mixing time, varying scattering geometry, localized heating,  
95 and photo-dissociation. Compared with the static detection mode, SERS detection in a  
96 fluidic channel might provide more reproducible results, which is due to more  
97 homogeneous mixing, more consistent geometries and more efficient heat dissipation  
98 in the flow detection mode. The multiplicative effects model is then adopted to further

99 eliminate the confounding effects on SERS signals caused by possible variations in  
100 the physical properties of nanocolloids as well as the intensity and alignment/focusing  
101 of laser excitation source, and finally realize accurate quantitative SERS assays.

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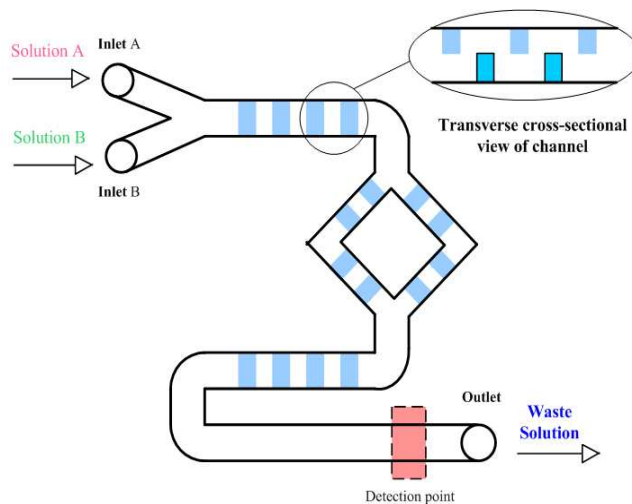
## 104 **2. EXPERIMENTAL**

105 **Reagents and Chemicals.** AgNO<sub>3</sub>, sodium citrate and KCl were purchased from  
106 Sinopharm Chemical Reagent Co., Ltd. (Shanghai, China). Rhodamine 6G (R6G),  
107 butyl rhodamine B, *p*-thiocresol, malachite green (MG) and concentrated nitric acid  
108 were obtained from Aladdin Chemistry Co., Ltd. (Shanghai, China). All chemicals  
109 were of analytical grade, and were used as received without any further purification.  
110 Ultrapure water (18.25MΩ.cm) produced by Direct-pure plus water system (Aquapro,  
111 Chongqing, China) was used throughout this study.

112 **Preparation of Silver Nanocolloids.** Silver nanocolloids were prepared  
113 according to the Lee-Meisel method.<sup>20</sup> Briefly, 100 ml of silver nitrate solution was  
114 prepared by adding 18 mg silver nitrate to appropriate volume of ultrapure water and  
115 heated to boil. And then 2 ml of sodium citrate aqueous solution was added to the  
116 boiling silver nitrate solution under vigorous stirring. The mixture was kept at a gentle  
117 boil for 1 h. It was then cooled naturally to room temperature and stored in the fridge  
118 at 4 °C. Before using, the silver nanocolloids were redispersed by ultrasound for five  
119 minutes.

120 **Microfluidic Chips.** PDMS microfluidic chips with upper and lower zig-zag type  
121 blocks ordered from WenJing chip company (Suzhou, China) were used to ensure  
122 relatively more homogeneous mixing, more consistent geometries and more efficient  
123 heat dissipation during SRES assays (Fig.1). The PDMS microfluidic chips can be  
124 recycled by nitric acid washing (Supporting Information). During SERS assays,  
125 solution A (a mixture of the analyte of interest, silver nanocolloids and the internal  
126 standard) and solution B (0.5 M KCl) were injected into the microfluidic channel

127 through syringe pump with the same rate of 10  $\mu\text{l}$  per minute. The confluent streams  
128 traveled along the microfluidic channel. Laminar flow was devastated by the upper  
129 and lower blocks and mixed efficiently. As the fluid was flowing through the channel,  
130 SERS spectra were measured at the detection point.  
131



132

133 Fig.1. The schematic illustration of the PDMS microfluidic chip.

134

135 **Quantification of R6G by Internal Standard Addition Detection Mode. A**

136 total of nine samples of R6G were prepared by diluting appropriate volumes of R6G  
137 stock solution ( $1.00 \times 10^{-5}$  M) with ultrapure water. The concentrations of R6G in the  
138 nine samples were  $1.00 \times 10^{-6}$  M,  $2.00 \times 10^{-6}$  M,  $3.00 \times 10^{-6}$  M,  $4.00 \times 10^{-6}$  M,  $5.00 \times 10^{-6}$  M,  
139  $6.00 \times 10^{-6}$  M,  $7.00 \times 10^{-6}$  M,  $8.00 \times 10^{-6}$  M and  $9.00 \times 10^{-6}$  M, respectively. The five  
140 samples with concentrations of R6G equaling to  $1.00 \times 10^{-6}$  M,  $3.00 \times 10^{-6}$  M,  $5.00 \times 10^{-6}$   
141 M,  $7.00 \times 10^{-6}$  M, and  $9.00 \times 10^{-6}$  M formed the calibration set. The test set consisted of  
142 the remaining four samples. Solution A consisted of 20  $\mu\text{l}$  R6G sample solution, 20  $\mu\text{l}$   
143  $3.50 \times 10^{-6}$  M butyl rhodamine B solution (as internal standard) and 80  $\mu\text{l}$  silver  
144 nanocolloids solution. Each sample was measured five times at the same focusing  
145 position.

146 **Quantification of MG in Fishpond Water by Internal Standard Addition**

147 **Detection Mode.** MG had been widely used as a fungicide and antiseptic in the  
148 aquaculture industry.<sup>21</sup> Nowadays, as being suspected of having genotoxic and



149 carcinogenic potential<sup>22, 23</sup>, MG has been banned for using in aquaculture. However,  
150 MG is still used illegally in fish farming industry in some areas due to its low cost,  
151 easy availability and efficacy. Therefore, methods for its rapid quantification are  
152 desirable. In this contribution, a total of eleven samples with different concentrations  
153 of MG equaling to  $0.50 \times 10^{-6}$  M,  $1.00 \times 10^{-6}$  M,  $2.00 \times 10^{-6}$  M,  $3.00 \times 10^{-6}$  M,  $4.00 \times 10^{-6}$  M,  
154  $5.00 \times 10^{-6}$  M,  $6.00 \times 10^{-6}$  M,  $7.00 \times 10^{-6}$  M,  $8.00 \times 10^{-6}$  M, and  $9.00 \times 10^{-6}$  M,  $1.00 \times 10^{-5}$  M,  
155 respectively, was prepared by mixing the water from a fishpond (it is absolutely MG  
156 free) with standard stock solution of MG ( $1.00 \times 10^{-3}$  M) in appropriate volume ratios.  
157 The six samples with concentrations of MG equaling to  $0.50 \times 10^{-6}$  M,  $2.00 \times 10^{-6}$  M,  
158  $4.00 \times 10^{-6}$  M,  $6.00 \times 10^{-6}$  M,  $8.00 \times 10^{-6}$  M and  $1.00 \times 10^{-5}$  M formed the calibration set.  
159 The remaining five samples formed the test set. Solution A was made by mixing 20 ul  
160 MG, 20 ul butyl rhodamine B ( $8.00 \times 10^{-6}$  M) as internal standard, and 80 ul silver  
161 colloids solution. Each sample was measured four times at the same focusing position.

#### 162 **Quantification of R6G by Internal Standard Tagging Detection Mode.**

163 Internal standard tagging SERS enhancing substrate mixture for quantitative analysis  
164 of R6G was prepared by adding 650  $\mu$ l of *p*-thiocresol solution ( $1.00 \times 10^{-4}$  M) as an  
165 internal standard to 26 ml silver colloids solution under ultrasound treatment at a  
166 frequency of 28KHz for 10 min. Eleven samples were prepared by adding appropriate  
167 amount of water, R6G standard stock solution ( $1.00 \times 10^{-5}$  M) into 1.6 mL of the above  
168 SERS enhancing substrate mixture to make a final volume of 2 ml. The ultimate  
169 concentrations of R6G in the eleven samples were  $0.50 \times 10^{-7}$  M,  $0.80 \times 10^{-7}$  M,  
170  $1.00 \times 10^{-7}$  M,  $2.00 \times 10^{-7}$  M,  $3.00 \times 10^{-7}$  M,  $4.00 \times 10^{-7}$  M,  $5.00 \times 10^{-7}$  M,  $6.00 \times 10^{-7}$  M,  
171  $7.00 \times 10^{-7}$  M,  $8.00 \times 10^{-7}$  M, and  $9.00 \times 10^{-7}$  M, respectively. The six samples with  
172 concentrations of R6G equaling to  $0.50 \times 10^{-7}$  M,  $1.00 \times 10^{-7}$  M,  $3.00 \times 10^{-7}$  M,  $5.00 \times 10^{-7}$   
173 M,  $7.00 \times 10^{-7}$  M, and  $9.00 \times 10^{-7}$  M formed the calibration set. The test set was  
174 comprised of the remaining five samples. Each sample was measured four times at the  
175 same focusing position.

176       **Instruments.** SERS measurements were collected at room temperature by an  
177 invia-reflex laser confocal inverted microscopic Raman spectrometer (Renishaw, UK)  
178 equipped with a 633 nm laser for excitation, a near-infrared enhanced deep-depleted  
179 thermoelectrically Peltier cooled CCD array detector (576×384 pixels), and a 50×(NA  
180 0.50) Leica DMLM objective microscope. SERS spectrum of each samples were  
181 acquired using 4 scans with a resolution of 1 cm<sup>-1</sup> over the range 717 ~ 1828 cm<sup>-1</sup>. It  
182 is worth pointing out that during the experiment, the laser was carefully focused on  
183 the middle region of the microfluidic channel to avoid the interference from PDMS.

184       **Data Analysis.** SERS measurements in the appropriate Raman shift ranges were  
185 selected for subsequent data analysis to ensure that the SERS peaks of both the  
186 analyte of interest and the internal standard can be readily observed in the selected  
187 regions. For quantification of R6G by internal standard addition detection mode,  
188 SERS signals in the range of 1010.9 to 1712.4 cm<sup>-1</sup> were selected (Fig.2a); while for  
189 the quantification of MG, the spectral measurements ranging from 953.1 to 1693.1  
190 cm<sup>-1</sup> were used for quantitative analysis (Fig.2b); For the quantification of R6G by  
191 internal standard tagging detection mode, the spectral data between 894.7 and 1681.9  
192 cm<sup>-1</sup> were selected (Fig.2c).

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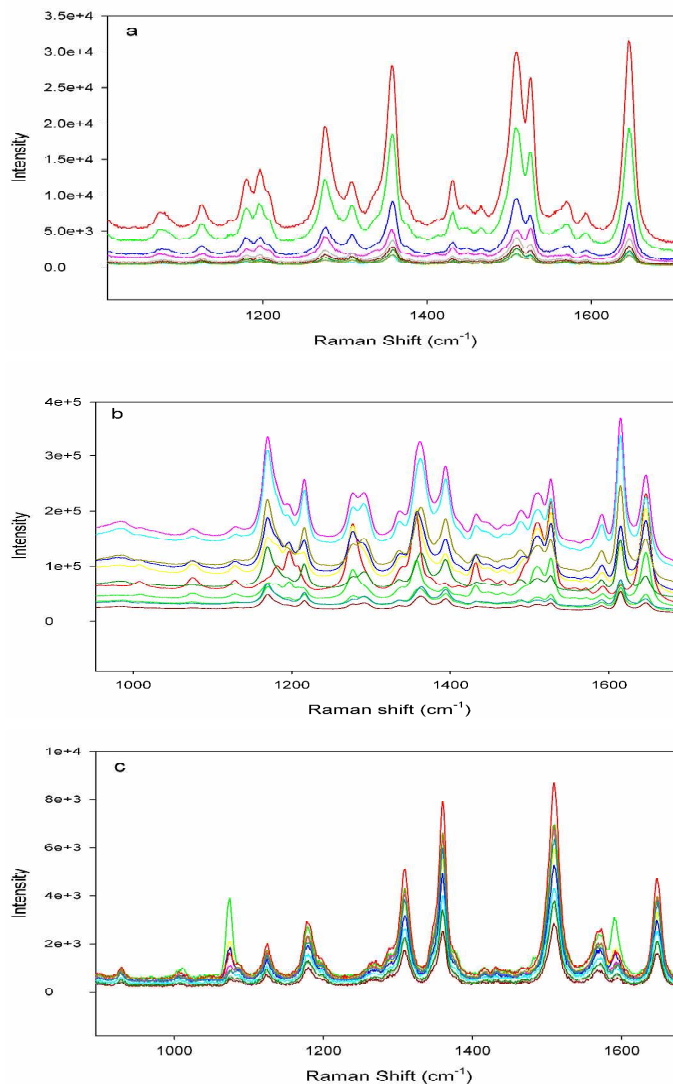
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207 Fig.2. SERS measurements in the appropriate Raman shift ranges selected for quantification of  
 208 R6G by internal standard addition detection mode (a), quantification of MG in fishpond water by  
 209 internal standard addition detection mode (b), and quantification of R6G by internal standard  
 210 tagging detection mode (c).

211

212 The following multiplicative effects model for surface-enhanced Raman  
 213 spectroscopy ( $\text{MEM}_{\text{SERS}}$ )<sup>19</sup> was adopted for the subsequent quantitative analysis:

$$\mathbf{x}_k = \sum_{j=1}^J b_k \cdot c_{k,j} \cdot \mathbf{r}_{\text{chem},j} + \mathbf{d}_k; \quad (k = 1, 2, \dots, K) \quad (1)$$

214 Where,  $\mathbf{x}_k$  is the SERS spectrum of the  $k$ -th sample;  $c_{k,j}$  is the concentration of the

215  $j$ -th chemical component in the  $k$ -th calibration sample;  $\mathbf{r}_{\text{chem},j}$  represents the

216 molecular scattering properties of the  $j$ -th chemical component; The multiplicative  
 217 parameter  $b_k$  explicitly accounts for the multiplicative confounding effects on SERS  
 218 intensities caused by changes in variables other than the concentrations of analytes in  
 219 the  $k$ -th calibration samples, such as physical properties of enhancing substrates, the  
 220 intensity and alignment/focusing of laser excitation source;  $\mathbf{d}_k$  is a composite term  
 221 that represents background interference(s) and the non-multiplicative effects caused  
 222 by variations in physical properties of the enhancing substrates on the  $k$ -th sample.

223 The multiplicative parameters  $b_k$  ( $k=1, 2, \dots, K$ ) for  $K$  calibration samples in the  
 224 above MEM<sub>SERS</sub> model can be estimated from their SERS spectra by the modified  
 225 optical length estimation and correction (OPLEC<sub>m</sub>) method.<sup>24, 25</sup> Let's arbitrarily  
 226 assume that the first chemical component in eq.1 is the analyte of interest. The  
 227 following two calibration models can then be built by multivariate linear calibration  
 228 methods such as partial least squares regression (PLS).

$$\mathbf{b} = \alpha_1 \mathbf{1} + \mathbf{X}_{cal} \boldsymbol{\beta}_1; \quad \text{diag}(\mathbf{b})\mathbf{c}_1 = \alpha_2 \mathbf{1} + \mathbf{X}_{cal} \boldsymbol{\beta}_2 \quad (2)$$

229 Here,  $\mathbf{X}_{cal} = [\mathbf{x}_1; \mathbf{x}_2; \dots; \mathbf{x}_K]$ ;  $\mathbf{c}_1 = [c_{1,1}; c_{2,1}; \dots; c_{K,1}]$ ;  $\text{diag}(\mathbf{b})$  denotes the diagonal  
 230 matrix in which the corresponding diagonal elements are the elements of  $\mathbf{b}$ ;  $\mathbf{1}$  is a  
 231 column vector with its elements equal to unity. After the estimation of the model  
 232 parameters  $\alpha_1$ ,  $\alpha_2$ ,  $\boldsymbol{\beta}_1$ , and  $\boldsymbol{\beta}_2$ , the concentration ( $c_{test,1}$ ) of the target analyte in any test  
 233 sample can be determined from its measured SERS spectrum  $\mathbf{x}_{test}$  according to eq.3.  
 234 The confounding multiplicative effects of physical properties of enhancing substrates,  
 235 the intensity and alignment/focusing of laser excitation source on the quantitative  
 236 results has been readily corrected.

$$c_{test,1} = \frac{\alpha_2 + \mathbf{x}_{test} \boldsymbol{\beta}_2}{\alpha_1 + \mathbf{x}_{test} \boldsymbol{\beta}_1} \quad (3)$$

237 The quantitative performance of MEM<sub>SERS</sub> model was compared with that of PLS  
 238 model in terms of root-mean-square error of prediction (RMSEP) and average relative

239 prediction error (ARPE). Leave-one-out cross validation was employed to determine  
240 the optimal MEM<sub>SERS</sub> and PLS calibration models

$$RMSEP = \sqrt{\sum_{i=1}^N (c_{i,1} - \hat{c}_{i,1})^2 / N}; \quad ARPE = \frac{1}{N} \sum_{i=1}^N |(c_{i,1} - \hat{c}_{i,1}) / c_{i,1}| \times 100\% \quad (4)$$

241 Where,  $c_{i,1}$  and  $\hat{c}_{i,1}$  are the actual and predicted concentrations of the analyte of  
242 interest in the  $i$ -th test sample, respectively;  $N$  is the number of test samples.

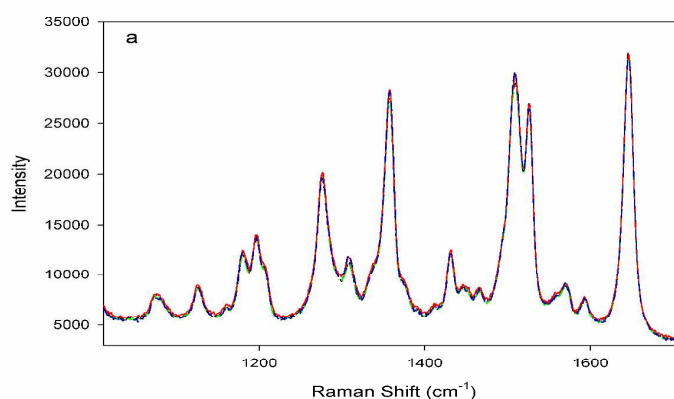
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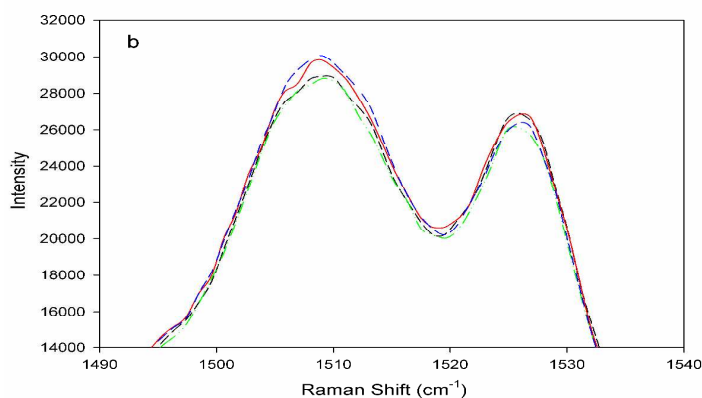
### 245 3. RESULTS AND DISCUSSION

246 In order to improve the reproducibility of SERS measurements, PDMS microfluidic  
247 channel was used to ensure relatively more homogeneous mixing and more consistent  
248 geometries during SRES assays. Fig.3 shows the SERS spectra of the same R6G  
249 sample measured continuously when the sample went through the PDMS microfluidic  
250 channel. It can be seen that the SERS spectra exhibit good reproducibility with  
251 relative deviation of about 10%.

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Fig.3. (a) SERS spectra of the same R6G sample measured continuously when the sample went through the PDMS microfluidic channel; (b) the zoomed part of the same set of spectra within the range of 1490 to 1540 $\text{cm}^{-1}$ .

260        However, as listed in table 1, the concentration predictions for R6G in both the  
261 calibration and test samples obtained by PLS calibration model significantly deviate  
262 from their actual values. The RMSEP values of PLS calibration model for the  
263 calibration and test samples were  $1.75 \times 10^{-6}$  M and  $1.68 \times 10^{-6}$  M, which are equivalent  
264 to ARPE values of 39.8 % and 42.0 %, respectively. These results suggested that  
265 though the application of PDMS microfluidic channel can render good reproducibility  
266 in SERS spectra of the same sample collected continuously when the sample went  
267 through the PDMS microfluidic channel, the application of microfluidics alone could  
268 not realize accurate quantitative SERS assays. The possible differences in the physical  
269 properties of the silver colloids across samples complicated the relationship between  
270 the concentrations of R6G in samples and their corresponding SERS spectra, which  
271 undermined the underlying linearity assumption of PLS calibration method. The  
272 influence of the physical properties of silver colloids on the SERS spectra of R6G  
273 samples has a multiplicative nature. To evaluate the significance of the multiplicative  
274 effects of the physical properties of silver colloids on SERS spectra, the multiplicative  
275 parameters  $b_k$  ( $k= 1, 2, \dots, K$ ) for the R6G calibration samples were estimated by  
276 OPLEC<sub>m</sub> from their SERS spectra measured under internal standard addition  
277 detection mode. As expected,  $b_k$  varied significantly, ranging from 1 to 31 (not

278 shown). Multivariate linear calibration methods such as PLS are incapable of dealing  
 279 with so severe multiplicative effects. This is the reason that the concentration  
 280 predictions of PLS calibration model have such large errors.

281

282 Table 1. Concentration predictions for R6G in the calibration and test samples  
 283 obtained by PLS and MEM<sub>SERS</sub> models, when internal standard addition detection  
 284 mode was adopted

Sample Category	Replicates	Actual Conc. ( $\times 10^{-6}$ M)	Mean predicted Conc. ( $\times 10^{-6}$ M)	
			PLS	MEM <sub>SERS</sub>
Cal.	5	1.00	2.04 (0.15 <sup>a</sup> )	0.99 (0.08)
Cal.	5	3.00	2.67 (0.45)	3.00 (0.01)
Cal.	5	5.00	7.23 (0.27)	4.99 (0.03)
Cal.	5	7.00	6.99 (0.46)	7.01 (0.06)
Cal.	5	9.00	6.07 (0.35)	9.00 (0.10)
		RMSEP	1.75	0.06
		ARPE	39.8 %	1.7 %
Test	5	2.00	-0.28 (0.70)	1.79 (0.04)
Test	5	4.00	4.47 (0.23)	4.07 (0.10)
Test	5	6.00	6.95 (0.22)	5.86 (0.49)
Test	5	8.00	5.90 (0.17)	7.63 (0.19)
		RMSEP	1.68	0.33
		ARPE	42.0 %	6.0 %

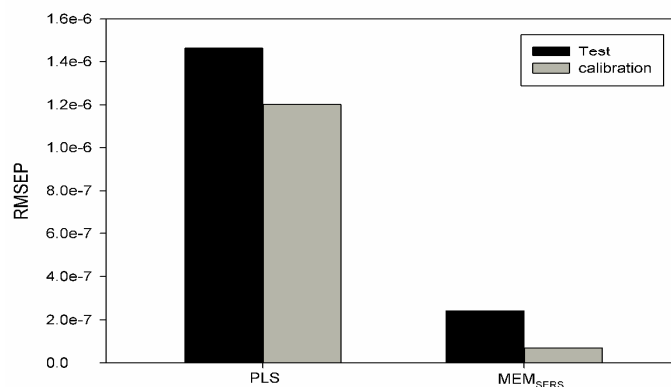
285 a. The numbers in the bracket denote standard deviation

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287 The results listed in table 1 also showed that the combination of PDMS  
 288 microfluidic channel with MEM<sub>SERS</sub> could effectively mitigate the SERS spectral  
 289 variations caused by possible changes in the physical properties of enhancing  
 290 substrates, the intensity and alignment/focusing of laser excitation source, and hence  
 291 achieved much more precise concentration predictions. The RMSEP values of  
 292 MEM<sub>SERS</sub> calibration model for the calibration and test samples were  $0.06 \times 10^{-6}$  M and  
 293  $0.33 \times 10^{-6}$  M, respectively. The ARPE value for the test samples was 6.0%, which was  
 294 only one seventh of the corresponding value of PLS calibration model. Considering  
 295 the notorious heterogeneity of silver colloids, such results were rather commendable.

296 The success of the combination of PDMS microfluidics with MEM<sub>SERS</sub> on just  
 297 one model compound R6G is not enough to justify its application potential in routine

298 quantitative SERS assays. MG, a chemical compound once used as fungicide and  
299 antiseptic in the aquaculture industry, was therefore selected to test the performance  
300 of the proposed method. Once again, PLS calibration model failed to provide  
301 acceptable concentration predictions for MG in the test samples (Fig.4). The  
302 corresponding RMSEP and APRE values were  $1.47 \times 10^{-6}$  M and 62.6%, respectively.  
303 Interestingly, MEM<sub>SERS</sub> achieved rather similar accuracy for MG as it did for R6G  
304 (Fig.4). Its RMSEP and APRE values were  $0.24 \times 10^{-6}$  M and 8.4%, respectively. This  
305 consistency can be explained by the facts that the same internal standard and quite  
306 similar concentration ranges were used in these two systems. Nevertheless, on the  
307 other hand, it has also demonstrated the effectiveness and robustness of the proposed  
308 method in improving the quantitative accuracy and precision of SERS assays.  
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311 Fig.4. The RMSEP values for the concentrations of MG in both the calibration and test samples  
312 predicted by PLS and MEM<sub>SERS</sub> calibration methods.

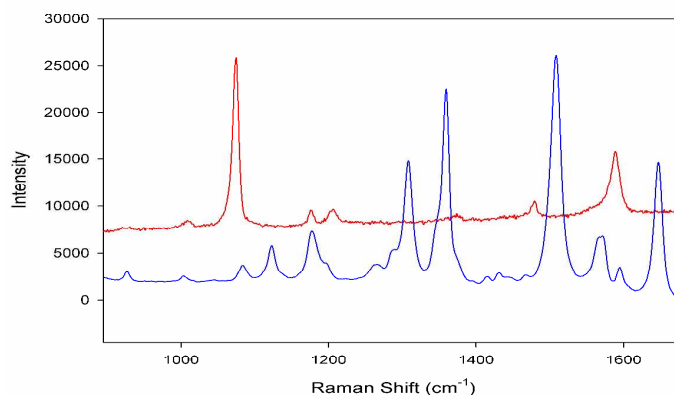
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314 In the internal standard addition detection model, the internal standard butyl  
315 rhodamine B has both molecular structure and SERS activity similar to the target  
316 analytes R6G and MG. In practice, it is rather unrealistic to find such an internal  
317 standard for an arbitrary analyte of interest. Therefore, the performance of the  
318 proposed method in this contribution was further tested under internal standard  
319 tagging detection model where a generic internal standard, *p*-thiocresol, was adopted.  
320 Fig.5 showed the pure SERS spectra of R6G and *p*-thiocresol measured on silver



321 colloids. It can be seen that the SERS spectrum of *p*-thiocresol is quite different from  
322 that of R6G. Moreover, the main SERS peaks of the internal standard *p*-thiocresol are  
323 overlapped with those of R6G.

324



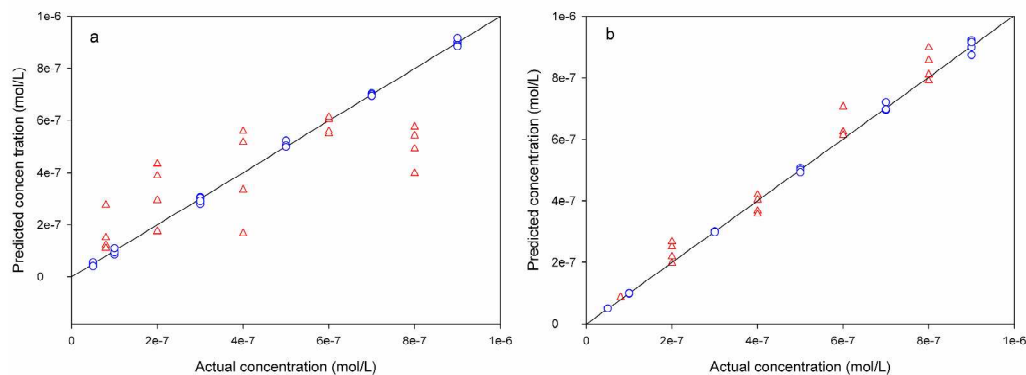
325

326 Fig.5. the SERS spectra of R6G (blue line) and *p*-thiocresol (red line) measured on silver colloids.

327

328 As displayed in Fig.6a, though the PLS calibration model with 7 underlying  
329 components fitted the calibration samples quite well, its concentration predictions for  
330 R6G in the test samples were very poor with a RMSEP value of  $1.72 \times 10^{-7}$  M,  
331 equivalent to an ARPE value of 49.6%. In contrast, the results of MEM<sub>SERS</sub> were far  
332 more accurate (Fig.6b). Its RMSEP and APRE values for the test samples was  
333  $0.43 \times 10^{-7}$  M and 8.6%, respectively. These results demonstrated the capability of the  
334 combination of PDMS microfluidics with MEM<sub>SERS</sub> in realizing accurate quantitative  
335 SERS assays under internal standard tagging detection mode, even when a generic  
336 internal standard was utilized.

337



338

339 Fig.6. Concentration predictions for R6G in the calibration (blue circle) and test (red triangle)  
340 samples obtained by (a) PLS and (b) MEM<sub>SERS</sub> when internal standard tagging detection mode  
341 was adopted

342

343

#### 344 4. CONCLUSIONS

345 Variations in the physical properties of silver nanocolloids exert significant  
346 multiplicative influence on the SERS intensities of the analyte of interest and  
347 significantly distort the linear relationship between the concentration of the analyte of  
348 interest and SERS measurements. It is therefore very difficult to carry out quantitative  
349 SERS assays. Our experimental results revealed that the application of PDMS  
350 microfluidic channels can render good reproducibility in SERS spectra of the same  
351 sample collected continuously when the sample went through the PDMS microfluidic  
352 channel. However the application of microfluidics alone could not realize accurate  
353 quantitative SERS assays. It was also found that the combination of microfluidics  
354 with MEM<sub>SERS</sub> calibration model could achieve very satisfactory results in  
355 quantitative SERS assays. Based on the results for two proof-of-concept systems and  
356 another real system, conservatively speaking, accurate quantitative SERS analysis  
357 with a mean relative prediction error of less than 10% can be expected through the  
358 combination of microfluidics with MEM<sub>SERS</sub> calibration model.

359

360

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