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1	High dilution surface-enhanced Raman spectroscopy for rapid
2	determination of nicotine in e-liquids for electronic cigarettes
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15	
16	Abstract
17	The rise in popularity of electronic cigarettes and the associated new legislation concerning
18	e-liquids has created a requirement for a rapid method for determining the nicotine content
19	of e-liquids in the field, ideally at the point of sale. Here we have developed a rapid method
20	based on surface-enhanced Raman spectroscopy (SERS) with Au colloid and an isotope-
21	labeled nicotine (d ₄ -nicotine) internal standard for measurement/quantification of samples
22	which contain 10's of mg mL ^{-1} nicotine in a complex viscous matrix. The method is novel
23	within the area of SERS because it uses high dilution (ca. $4000\times$) in the sample preparation
24	which dilutes out the effects of the viscous glycerin/glycerol medium and any flavouring
25	or colouring agents present but still allows for very accurate calibration with high

26reproducibility. This is possible because the nicotine concentration in the e-liquids (≤ 24 mg m L^{-1}) is several orders of magnitude above the working range of the SERS 2728measurement. The method has been tested using a portable Raman spectrometer and a very 29large set of 42 commercial e-liquids to check there is no matrix interference associated with 30 different manufacturers/flavourings/colouring agents etc. Finally, as an alternative to determining the nicotine concentration by measuring peak heights in the spectra, the 3132concentration was also estimated by comparing the sample spectra with those of a set of 33standard sample which prepared at known concentrations and held in a spectral library file 34in the spectrometer. This simple approach allows concentration to be estimated without any 35complex data analysis and lends itself readily to handheld Raman system which are typically designed to carry out library searching using the internal software for materials 36 37 identification. Library searching against standards correctly classified 41 of the 42 test 38liquids as belonging to the correct concentration group. This high dilution SERS approach 39 is suitable for analysis of sample types that have reasonably high concentrations of analytes 40but suffer from matrix problems and it therefore has broad potential for applications across 41the food, pharmaceutical and nutraceutical areas.

42

43 Introduction

Electronic nicotine delivery systems, commonly called electronic cigarettes (ECs), are battery-powered devices that simulate tobacco cigarettes by converting nicotine-containing liquid into an aerosol. ECs have gained popularity in the past few years, primarily among smokers who want to reduce the risks of smoking because ECs do not produce the numerous chemicals found in conventional tobacco smoke.¹⁻³ ECs use e-liquids which contain nicotine, flavouring/colouring components and a base such as propylene glycol, glycerin, or a mixture of these two substances. The nicotine concentrations of available e-liquids typically range from 0 mg mL⁻¹ to 24 mg mL⁻¹ and numerous different flavours are available, ranging from tobacco flavours (which are similar to
 cigarettes) to menthol, fruits and coffee.⁴⁻⁷

Because the nicotine contained in e-liquids is both addictive and toxic,⁸ some countries 53have banned/regulated the use of ECs, e-liquids containing nicotine.9, 10 This has created a 5455requirement for analytical methods which can be used to determine the nicotine concentrations in eliquids. The production and labelling of many of these products is not regulated at source so 5657independent methods are required by authorities who have a legal duty to enforce legislation for 58public health or taxation reasons. This could be, for example, detecting nicotine in supposedly nicotine-free e-liquids or checking that the e-liquids actually contain the concentrations of nicotine 59stated on their containers by the manufacturers.^{5, 6, 11-13} 60

Nicotine concentrations in e-liquids have been widely quantified by gas chromatography (GC) or high-performance liquid chromatography (HPLC). Sample solutions for these instruments are commonly prepared by the pipetting of e-liquids followed by dilution/extraction and are mixed with/without internal standards such as quinoline.^{4-7, 11-15} These methods are well-established and accurate but they are time-consuming (usually more than 30 min for each sample) and not suitable for rapid field testing at point of sale.

67 While conventional vibrational spectroscopy has some of the aspects required for field 68 testing, such as portability and acceptable cost, the nature of the sample makes conventional 69 vibrational analysis of e-liquids difficult. For IR the aqueous/glycerol medium will interfere while 70 the nicotine concentration is too low for normal Raman analysis, moreover the samples can give 71strong fluorescence backgrounds with common excitation wavelengths. In principle, surface-72enhanced Raman spectroscopy SERS should have appropriate sensitivity but there are potential 73problems due to the oily and highly viscous nature of the e-liquids (propylene glycol: 40.4 mPa•s at 25 °C; vegetable glycerin: 934 mPa•s at 25 °C)¹⁶ which could hinder aggregation and also interfere 7475with adsorption of the analyte to the enhancing surface. In addition, the numerous different colouring/flavouring compounds can also potentially give their own interfering SERS signals.¹⁷ 76

77Here we show that these problems in the SERS analysis can be overcome because the sensitivity of SERS is vastly better than is required to detect the analyte in the unprocessed samples. 78Literature data has shown SERS nicotine detection at the low ppm level¹⁸⁻²¹ while the e-liquids are 4 7980 orders of magnitude higher. This means the samples can be diluted down dramatically, which removes 81 problems associated with the glycerin/glycerol medium and similarly reduces the flavouring 82 compounds to undetectably low concentrations. This has allowed us to develop a convenient 83 procedure for nicotine screening in e-liquids suitable for field use which combines high dilution in 84 the sample preparation with very straightforward data analysis that can be carried out on simple 85 portable Raman instruments where sample spectra are automatically compared to a library of standard 86 spectra of samples prepared at different concentrations.

87

88 **Experimental**

89 *Chemicals and samples*

Nicotine, deuterium-labeled nicotine (d₄-nicotine), and magnesium sulfate (MgSO₄) were obtained from Sigma-Aldrich (St. Louis, MO, USA). The Au colloid (particle size: 50 nm, 4.50×10^{10} particles mL⁻¹) solution was obtained from BBI solutions (Cardiff, UK). Monopropylene glycol (PG, Pharma grade) and vegetable glycerin (VG, USP Kosher grade) were obtained from Classikool (Essex, UK). Deteriorated nicotine was a sample of pure nicotine which had been stored for more than 10 years at room temperature in the reagent cabinet of our laboratory.

E-liquid solutions were obtained from manufacturers in the United Kingdom (Table S1). A
set of samples comprising eight flavours, each at 4 different nicotine levels were purchased so the
calibration could be tested with a range of flavours. A further set of 10 assorted liquids with different
flavours were also used to allow the influence of colourings and flavours as well as different types of
bases to be examined over a broad range of liquid types. All of the e-liquids obtained were stored at
room temperature in the dark.

102

103 Preparation of solutions

104Nicotine reagents were diluted with double distilled water (DDI). To avoid pipetting the 105viscous liquid, a fixed amount, approximately 200 µL, of nicotine solution or e-liquid was measured 106by pouring it into the upturned cap of a 2 mL shell vial until the cap was full. The nicotine solution 107 was transferred to a glass vial, which was previously filled with 25 mL of DDI (Solution A). Then, 10820 µL of solution A was transferred to another 1 mL glass vial that contained 600 µL of 0.01 mM d₄-109 nicotine (Solution B). Finally, 20 µL of solution B was transferred to another 1 mL glass vial that 110 contained 180 µL of Au colloid solution. Nicotine solutions and e-liquids were diluted ca. 4000 times 111 throughout this preparation process. 50 µL of 0.1 M MgSO₄ was added to aggregate the colloids 112before their SERS spectra were recorded with a portable Raman spectrometer. The overall procedure 113 is illustrated in Fig. S1.

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115 Measurement and classification

The aggregated solutions were analyzed with a portable Raman spectrometer (ReporteR, DeltaNu, WY, USA). The laser wavelength was 785 nm, and the spectral range 200 cm⁻¹ to 2000 cm⁻¹. Spectrometer cm⁻¹ was calibrated with a standard polystyrene accessory. The acquisition time was 2 sec x 3 accumulations. The data were analyzed with NuSpec software and no subtraction of background spectra was carried out.

121For the classification of nicotine levels by library matching, the SERS spectra of mixtures of nicotine/internal standard at the appropriate concentrations (0 mg mL^{-1} , 6 mg mL^{-1} , 12 mg mL^{-1} , 12218 mg mL⁻¹, 24 mg mL⁻¹ and 30 mg mL⁻¹) were recorded and then used to create a small spectral 123124library using the instrument's internal NuSPec software. To test the nicotine levels of e-liquids the 125spectra of the liquids prepared in the standard way with internal standard were recorded and searched 126against the library of standard mixtures. The nicotine concentration of the e-liquid was then estimated as being the same as that of the standard library spectrum which gave the closest match. The search 127used the instrument's full range spectra (200 cm⁻¹ to 2000 cm⁻¹) and the proprietary software which 128

129 is based on Pearson's correlation.

130

131 **Results and discussion**

132Ouantifying the nicotine content of e-liquids using normal Raman scattering measurements 133is extremely difficult since the spectra are dominated by signals from the propylene glycol and vegetable glycerin solvent, rather than the much lower concentration (mg mL⁻¹) nicotine component 134135(Figs. S2, S3, S4). Similarly, it is not possible to increase the intensity of the nicotine bands in the 136 spectra of undiluted e-liquids using SERS since the addition of the e-liquids prevents colloid 137aggregation, as shown by the observation that even the background signals from the colloid's organic 138 stabilizing layer (which are readily detectable with simple aggregated colloid) disappear in samples 139prepared with undiluted e-liquids (see Fig. S5). In contrast, SERS of highly diluted e-liquids and 140 nicotine samples was much more successful since it removed problems with aggregation, allowing 141 the nicotine to be preferentially enhanced and therefore detected, even in the presence of the other 142components in the e-liquid.

143

144 Influence of the nicotine freshness on the Raman spectrum

145One potential problem for nicotine analysis either by Raman or SERS methods is that 146nicotine decomposes in air, turning from a very pale brown to a much darker brown liquid.^{22, 23} In 147this study nicotine that had been stored for more than 10 years and was very dark brown (see Fig. 1a) 148was tested alongside fresh nicotine to determine the effects of deterioration on the Raman and SERS 149spectra. As shown in Fig. 1, the Raman spectrum of the fresh nicotine showed its characteristic peaks 150originating from the stretching vibrations of the pyridine ring at 1027 cm⁻¹, whereas deteriorated nicotine showed only broad emission due to fluorescence. In contrast, when the fresh and deteriorated 151152nicotine were diluted to 10 µM, their SERS spectra were indistinguishable (Fig. 1b).

Even though the SERS spectra of the fresh and deteriorated samples were the same, it was useful to check that deterioration did not create products that interfered with the magnitude of the 155signals e.g. by blocking surface sites. Fig. 2 shows the changes in the signal intensity of nicotine at 1561027 cm⁻¹ between 0 and 2 mM. The signal intensity of fresh nicotine increased dramatically up to 15750 µM and then plateaued. The slight decrease in the signal intensity at 2 mM might be due to the 158reduction of colloid aggregation caused by the presence of excess nicotine in the solution. 159Deteriorated nicotine also showed an increase in the signal intensity with concentration up to 50 μ M. 160However, the signal intensity dramatically decreased with a further increase in the concentration, and 161 it became less than half of the maximum intensity at 200 µM. This was presumably due to self-162absorption of the excitation laser and Raman scattering by the dark-coloured deteriorated solutions, 163although it is also possible that the affinity of deteriorated nicotine may be different from those of 164 fresh nicotine at higher concentrations (> 50 μ M). Nonetheless, up to 50 μ M, as shown in Fig. 2b, not 165only were the signal intensities of both nicotine samples comparable but both also showed almost a 166 linear relationship with concentration. Thus, we considered that both fresh and deteriorated nicotine 167can be quantified comparably in the range from 0 to 50 µM. These results are important because the 168extent of deterioration of the aged sample is much larger than would be expected in the samples which 169will be tested in actual field analysis, so interference from nicotine deterioration products should not 170be a significant problem with the SERS analysis.

171Although, as shown in Fig. 2, the absolute signal intensity varied linearly with 172concentration, an appropriate internal standard was added because this makes the calibration more 173robust by eliminating errors due to changes in the enhancing medium or the performance of the 174instrument used to read the signals. In this study, we used deuterium-labeled nicotine (d4-nicotine), 175since using an isotopomer of the target compound is known to be the best way to obtain accurate 176quantification in SERS because the signals for the target and standard are both affected equally by changes in measurement conditions.²⁴ Furthermore, the presence of the d₄-nicotine peak in the spectra 177178of sample solutions makes it possible to quantify/classify the nicotine concentration by comparing 179with library data (see below).

180

Fig. 3a shows the changes in the SERS spectra for a mixture of fresh nicotine and d₄-

181 nicotine (from 0 to 40 µM nicotine with 10 µM d₄-nicotine). The signal intensity of d₄-nicotine at 994 182cm⁻¹ is distinct from that of nicotine at 1027 cm⁻¹ and grows as expected with increasing nicotine 183concentration. For quantitation, the ratio of the peak heights due to nicotine and d₄-nicotine at 1027 and 994 cm⁻¹, respectively, were measured. Over the range 0–40 μ M nicotine the reproducibility was 184185good (< 5% relative standard deviation at each concentration over the range examined), however this 186decreased noticeably at 50 µM, possibly due to the influence of nicotine's small signal intensity at 994 cm⁻¹ and saturation effects, so the calibration range was limited to $0-40 \mu$ M. Over this range the 187 188calibration is excellent, the plot of relative signals versus relative concentration is liner with an intercept at 0.06 and $r^2 = 0.9996$, so that SERS is clearly suitable for quantification of nicotine in 189 190 aqueous solution.

191 E-liquids are quite difficult to pipette and disperse in exact volumes because they are 192 typically oily and highly viscous.¹⁶ Furthermore, the concentration range of SERS that is applicable 193 for the reliable quantification of nicotine is limited (from 0 to 40 μ M). To overcome these problems, 194 we developed an easy sample preparation process using the internal volume of vial caps (see 195 Experimental and Fig. S1). This preparation process avoids accurate pipetting of e-liquids and 196 involves just mixing with DDI and other aqueous solutions, resulting in aqueous solutions containing 197 d₄-nicotine and Au colloid. This sample preparation process takes only a few minutes.

To test the efficacy of this method for e-liquids rather than aqueous nicotine solutions, the nicotine concentration in tobacco flavoured e-liquids was measured. Among the examined e-liquids at 0, 6, 12, and 18 mg mL⁻¹, the relative standard deviations in quintuplicated analyses through the whole process were 2.2% for 6 mg mL⁻¹, 5.0% for 12 mg mL⁻¹, and 4.3% for 18 mg mL⁻¹, this repeatability is comparable to that for pure aqueous solutions, so there were no problems in extending the measurements using this technique to real e-liquids.

The method was tested using e-liquids with 8 flavours at 0, 6, 12, and 18 mg mL⁻¹ (32 samples) and also for another 10 flavours at 11 mg mL⁻¹ to examine its ability to obtain nicotine concentrations both at different nicotine concentrations and with different interfering flavours, 207colourings and bases (Table S1). Fig. 4 shows the results of nicotine quantification in real e-liquids 208obtained from measurements of the relative peak heights of nicotine and d₄-nicotine in their spectra. 209 Because the repeatability of this method was good over this range, as discussed above, we applied 210 only duplicate analyses for each sample. Analytical results of the nicotine concentrations in all of the 211 e-liquids were comparable to those shown on their containers in samples with different nicotine concentrations (0 mg mL⁻¹: -0.4–0.0 mg mL⁻¹, 6 mg mL⁻¹: 5.7–7.2 mg mL⁻¹, 12 mg mL⁻¹: 11.2–13.3 212mg mL⁻¹, 18 mg mL⁻¹: 17.2–18.6 mg mL⁻¹, and 11 mg mL⁻¹: 8.5–11.7 mg mL⁻¹), various flavours, 213214different colors and different types of bases (Fig. S6 and Table S1). This fact suggests that the 215analytical results obtained by this method are free from interference due to flavours, colourings and 216 types of base.

217Finally, the portable Raman system used in this study can automatically compare newly 218 acquired spectra with library data in real time. This function becomes possible with d4-nicotine 219 addition and is very convenient for rapidly estimating the approximate nicotine content, a task which is made easier by the fact that most of the available e-liquids contain nicotine levels which vary in 220multiples of 6, such as 0, 6, 12, and 18 mg mL⁻¹.⁴⁻⁷ Here the SERS spectral data from the calibration 221222curve was used to build a spectral library that the spectra for each e-liquid could be compared against. 223This allowed the nicotine level in the e-liquids to be classified by finding which spectrum in the 224library they matched most closely. Fig. 4 shows the classification of the nicotine levels in all 42 225samples obtained by library matching, along with the results from the quantitative analysis. In the plot, the shape of each of the points is used to indicate which of the 5 concentration values the library 226227matching gave. The approach was remarkably successful, only 1 of the 42 samples was incorrectly 228classified and in that case the sample was classified as belonging the nearest neighbor (actual 11 mg mL^{-1} , estimated value 6 mg mL^{-1}). This level of accuracy also meant that the method allowed samples 229230which contained nicotine to be distinguished from those that did not with confidence (Tables S2 and 231S3).

233 Conclusions

234We have developed a new method for the screening of nicotine in e-liquids which combines 235an easy sample preparation process with SERS and a portable Raman spectrometer. The method can 236be used either for full quantitation of nicotine concentration or for rapid estimation of the nicotine 237level by library matching. Importantly, the results are not affected by flavours, colourings, type of 238base or the freshness of the nicotine. This was possible because the high sensitivity of SERS meant 239that the sample could be significantly diluted (ca. 4000×) in the sample preparation which diluted out 240matrix effects from the glycerol present and also reduced interference from flavouring and colouring 241compounds below detectable levels. This approach of combining high sample dilution with SERS 242clearly has the potential to be applied to other sample types where matrix effects may be significant, 243such as foodstuffs or topical pharmaceuticals.

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247 Notes and references

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- **Fig. 1**

(a) Raman spectra of fresh and deteriorated nicotine. The inset photograph shows fresh (left) anddeteriorated (right) nicotine in glass vials. (b) SERS spectra of fresh and deteriorated nicotine.



Fig. 2



 $300 \quad L^{-1}$ and (b) magnified between 0 to 100 μ mol L^{-1} . Data for fresh and deteriorated nicotine are shown.

301 The error bars indicate the standard deviation in triplicate analyses.





312 Fig. 3

313 (a) Changes in the SERS spectra of a nicotine (1027 cm^{-1}) and d₄-nicotine (994 cm^{-1}) mixture in 0 to 314 40 µM nicotine solutions with d₄-nicotine internal standard fixed at 10 µM. Inset shows the structures 315 of nicotine and d₄-nicotine. (b) Plot of the concentration ratio of nicotine and d₄-nicotine against the 316 ratio of their characteristic (1027: 994 cm⁻¹) bands. Error bars indicate the standard deviation in 317 quintuplicate analyses.

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Plot illustrating the results of nicotine SERS analysis in commercial e-liquids. Values in parentheses on the x-axis are the nicotine concentrations shown on each container. The positions of the points show the analytical values obtained by measuring relative peak heights of nicotine and d_4 -nicotine for each of the samples. The symbols used to mark the points indicate which standard spectrum the unprocessed sample spectra matched in the spectral library. These latter values can be used to estimate the nicotine concentration without explicitly measuring peak heights in the spectra.

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