In situ monitoring of powder blending by non-invasive Raman spectrometry with wide area illumination

Pamela Allan,^a Luke J. Bellamy,^{a,1} Alison Nordon,^a* David Littlejohn,^a* John Andrews^b
and Paul Dallin^b

⁵ ^a WestCHEM, Department of Pure and Applied Chemistry and CPACT, University of

6 Strathclyde, 295 Cathedral Street, Glasgow, G1 1XL, UK

- ^b Clairet Scientific Ltd., 17/18 Scirocco Close, Moulton Park Industrial Estate,
 Northampton, NN3 6AP, UK
- ⁹ ¹ Present address: GlaxoSmithKline, Priory Street, Ware, SG12 0DJ, UK.
- 10

11 * denotes authors to whom correspondence should be sent

12 (Email: <u>d.littlejohn@strath.ac.uk</u> and <u>alison.nordon@strath.ac.uk</u>)

13

14 Abstract

15 A 785 nm diode laser and probe with a 6 mm spot size were used to obtain spectra of 16 stationary powders and powders mixing at 50 rpm in a high shear convective blender. 17 Two methods of assessing the effect of particle characteristics on the Raman sampling 18 depth for microcrystalline cellulose (Avicel), aspirin or sodium nitrate were compared: (i) 19 the information depth, based on the diminishing Raman signal of TiO_2 in a reference 20 plate as the depth of powder prior to the plate was increased, and (ii) the depth at which a 21 sample became infinitely thick, based on the depth of powder at which the Raman signal 22 of the compound became constant. The particle size, shape, density and/or light 23 absorption capability of the compounds were shown to affect the "information" and 24 "infinitely thick" depths of individual compounds. However, when different sized 25 fractions of aspirin were added to Avicel as the main component, the depth values of 26 aspirin were the same and matched that of the Avicel: 1.7 mm for the "information" 27 depth and 3.5 mm for the "infinitely thick" depth. This latter value was considered to be 28 the minimum Raman sampling depth when monitoring the addition of aspirin to Avicel in 29 the blender. Mixing profiles for aspirin were obtained non-invasively through the glass 30 wall of the vessel and could be used to assess how the aspirin blended into the main 31 component, identify the end point of the mixing process (which varied with the particle 32 size of the aspirin), and determine the concentration of aspirin in real time. The Raman procedure was compared to two other non-invasive monitoring techniques, near infrared 33 34 (NIR) spectrometry and broadband acoustic emission spectrometry. The features of the 35 mixing profiles generated by the three techniques were similar for addition of aspirin to 36 Avicel. Although Raman was less sensitive than NIR spectrometry, Raman allowed 37 compound specific mixing profiles to be generated by studying the mixing behaviour of 38 an aspirin – aspartame – Avicel mixture.

39 < Take in Figure 1>

40 Keywords

Raman spectrometry; process analytical technologies (PAT); powder blending; sampling
depth; real-time monitoring; pharmaceuticals.

44 **1. Introduction**

45 Raman spectrometry is proving to be a useful monitoring technique in the pharmaceutical 46 industry, especially in secondary manufacturing [1, 2]. Considerable advantages have been demonstrated for analysis of tablets [3-18] and capsules [11, 19-23], particularly 47 48 when transmission mode measurements were used [16-18, 20-24]. To ensure that 49 pharmaceutical dosage forms contain the appropriate amount of active ingredient(s), the 50 constituents must be blended to a homogeneous state. While transmission Raman 51 spectrometry is suited for the analysis of tablets and capsules, the backscatter mode of 52 measurement is more amenable for *in situ* analysis of larger unit operations such as 53 powder blending. However, there are relatively few reports describing the use of 54 backscatter Raman spectrometry for this purpose [25-27]; in contrast, use of *in situ* near 55 infrared (NIR) spectrometry is far more common [28-33]. The mixing of diltiazem 56 hydrochloride pellets and paraffinic wax was investigated by Vergote et al. using non-57 invasive Raman spectrometry [26]. The process was monitored via a glass window in the side of the vessel using a laser spot of approximately 2 mm diameter. There was no 58 59 significant difference in the intensity of the Raman signal when the diltiazem pellets were 60 stationary or mixing at 50 rpm. Therefore, spectra could be recorded without stopping the 61 mixing procedure and the Raman signal became constant when homogeneity had been 62 reached. De Beer et al. [25] monitored the blending of Avicel PH 102, lactose DCL 21, 63 dilitazem hydrochloride, and silicium dioxide using an invasive Raman probe; the end of 64 the probe was flush with the inner surface of the mixing vessel wall. The mixing end-65 point identified from the Raman measurements was comparable to that obtained using NIR spectrometry. Hausman et al. also reported the successful implementation of in-line 66

Raman spectrometry to monitor blending of azimilide dihydrochloride at low dose
(1% w/w) [27].

69 One reason for the limited application of Raman spectrometry to powder 70 processes is that conventional backscatter Raman systems typically employ optics that 71 produce laser spot sizes smaller than 500 µm diameter, which results in the measurement 72 of only a small volume of the sample. More representative sampling has been achieved 73 by continuously rotating a sample during measurement [5, 6, 9, 10, 13, 14, 34] or by 74 scanning at several positions [8, 34, 35], thereby increasing the sampling area. To 75 overcome some of the sub-sampling limitations of conventional backscatter Raman 76 systems, defocused probes or wide area sampling optics with laser beam diameters of 3 -77 7 mm have also been investigated [15, 36-38]. Backscatter Raman measurements also 78 exhibit a strong bias towards the upper surface layers of the sample. Monte Carlo 79 simulations of the backscattered Raman signal from a 4 mm thick tablet using a 4 mm 80 diameter laser spot have shown that 88% of the signal is generated in the top 1 mm layer 81 of the tablet [24]. However, the increased sampling depth and area of wide area 82 illumination probes results in significantly larger sampling volumes compared to 83 conventional backscatter Raman probes. For example, it has been shown that Raman 84 signals can originate from material 13 mm below the surface of a sample with a PhAT 85 probe with a 7 mm spot size [38]. The sampling volume of a PhAT probe (3 mm spot 86 size) was found to be approximately 1300 times larger than that of a non-contact Raman 87 probe (150 μ m spot size) and approximately 16700 times larger than that of an 88 immersion probe (60 µm spot size) [36]. The larger sampling volume associated with the 89 PhAT probe resulted in comparable results to NIR spectrometry for quantification of

90 mixtures of anhydrous and hydrated polymorphs; the sampling volume of the PhAT 91 probe was found to be comparable to that for the NIR probe [39]. When mixtures of 92 polymorphs of flufenamic acid (forms I and III) with different particle sizes were 93 analysed using large and small spot size Raman probes, the wide area illumination probe 94 was found to be less sensitive to particle size owing to the larger sampling volume 95 measured with this probe [37].

96 This report describes the first use of a PhAT probe for in situ Raman monitoring 97 of powder mixing in a high shear blender. The study included evaluation of the effect of 98 particle size variations on the sampling depth that can be achieved with the PhAT probe 99 to allow comparison with previously reported results obtained with probes of different 100 optical configurations. In addition, the effect of particle size on the Raman signal was 101 investigated; this was important as the effect of particle size on the backscatter Raman 102 signal is highly dependent on the optical configuration of the probe employed [40]. 103 Mixing profiles based on non-invasive Raman spectrometry have been assessed to 104 compare the information they provide with mixing profiles produced by non-invasive 105 NIR spectrometry and broadband acoustic emission (AE) spectrometry. Some advantages 106 of Raman measurements over NIR spectrometry were identified for powder monitoring.

108 2. Experimental

109 **2.1. Instrumentation**

110 **2.1.1. Raman spectrometer**

111 A Kaiser Raman RXN1 spectrometer with a PhAT probe (Kaiser Optical Systems Inc., 112 Ann Arbor. MI, USA) was used for all experiments except where stated below. The 113 785 nm Invictus diode laser was operated at 400 mW at source. The laser beam was 114 optically expanded to give a 6 mm spot size, a working distance of 254 mm and a depth 115 of field of 50 mm. The probe to sample distance was 203 mm. For the sampling depth 116 studies, spectra were acquired using an exposure time of 0.5 s and 1 accumulation. In situ 117 Raman measurements were made through the glass wall of the mixing vessel during the 118 powder blending experiments. A spectrum was acquired every 5 s with an exposure time 119 of 2.5 s and 1 accumulation. The exposure time for each set of experiments was selected 120 such that the largest Raman signal occupied approximately 60 - 70% of the dynamic 121 range of the CCD detector.

For the experiment comparing Raman, NIR and AE, and the monitoring of the blending of a three component mixture, a different PhAT probe system was used. In this case, the 785 nm laser beam was optically expanded to give a 3 mm spot size and a working distance of 100 mm. The probe to sample distance was 100 mm. Spectra were acquired every 3 s, through the wall of the vessel, with an exposure time of 2 s and 1 accumulation.

128 A spectrum of aspartame was acquired using a Kaiser RXN1 spectrometer with a 129 MR probe equipped with a non-contact optic (0.4 inch working distance and a laser spot 130 size of approximately 100 μ m). An Invictus diode laser with a wavelength of 785 nm was 131 employed, and was operated at 350 mW at the source. Aspartame was contained within a 132 glass sample vial, which was placed in the off-line sample compartment, and the 133 spectrum was acquired through the side of the vial using an exposure time of 4.0 s and 1 134 accumulation.

135 Data were acquired using HoloGRAMS software (Kaiser Optical Systems). A 136 dark current spectrum was obtained before each set of experiments and subtracted 137 automatically from each subsequent spectrum acquired. Data were exported into 138 GRAMS/32 and converted to text files, which were subsequently imported into Matlab 139 7.0 (Mathworks Inc., Natick, Massachusetts, USA) for analysis using the PLS Toolbox 140 version 3.04 (Eigenvector Research Inc., Manson, Washington, USA). As spectra of 141 samples containing Avicel exhibited a sloping baseline arising from fluorescence, second 142 derivative spectra were calculated throughout using the Savitzky – Golay function with a 143 second order polynomial and a 13 or 25 point filter width for data acquired using the 6 or 144 3 mm laser spot size, respectively.

145 **2.1.2.** Near infrared reflectance spectrometer

Some measurements of powder mixing were obtained simultaneously by non-invasive Raman spectrometry, NIR spectrometry and broadband AE spectrometry. *In situ* NIR measurements were made through the glass wall of the vessel as described previously [31, 32] using a Zeiss Corona 45 NIR spectrometer (Carl Zeiss, Heidenheim, Germany). Measurements were acquired using Aspect software (Carl Zeiss) package and spectra stored as log(1/R) where R is the reflectance and was calculated from the intensity of light reflected by the sample relative to that for a reflectance standard. The integration

time was 32 ms and 10 scans were co-added for each acquired spectrum allowing measurements to be taken every 0.5 s. Data were exported as text files into Matlab for further analysis using PLS_Toolbox. First derivative spectra were calculated using the Savitzky – Golay function with a 5 point filter width and second order polynomial.

157 **2.1.3.** Acoustic emission

158 The broadband AE monitoring equipment has been described previously [41]. A Nano 30 159 transducer (Physical Acoustics Ltd, Cambridge, UK) was attached to the glass wall of the 160 mixing vessel using a silicone-based vacuum grease (Dow Corning) and adhesive tape. 161 The Nano 30 transducer was attached to a 2/4/6 series pre-amplifier (Physical Acoustics 162 Limited). The pre-amplifier required a 28 V power supply (Physical Acoustics Limited) 163 and the gain of the pre-amplifier was set to 60 dB. The pre-amplifier was connected to an 164 Agilent 54642A oscilloscope using a 5 m length cable, which was linked to a computer via a 165 GPIB to USB interface (Agilent Technologies).

A data capture program, written in C^{++} by Douglas McNab and Robbie Robinson 166 167 from the Centre of Ultrasonic Engineering (CUE) at the University of Strathclyde, 168 enabled the cyclic sampling of the acoustic signals displayed on the oscilloscope and 169 signals were saved as comma separated variable (CSV) files. Signals were acquired using 170 a sampling rate of 2 MHz and the time interval between collection of signals was 2 s. A 171 total of 450 signals were collected with each signal consisting of 4000 points. All 172 acoustic signals were imported into Matlab for analysis. A power spectrum was 173 calculated of each signal and three spectra were co-added to give a composite spectrum 174 every 6 s. Signal areas were calculated by summing the intensities of the signals between 0 and 400 kHz. 175

177 **2.2. Powders**

178 Microcrystalline cellulose (Avicel PH-101; FMC, Cork, Ireland), aspirin, sodium nitrate 179 (both from Sigma-Aldrich, Dorset, UK) and aspartame (provided by GSK, UK) were used. The Avicel particles have a tap density of 0.45 g cm⁻³, are granular in shape and 180 181 have an average particle size of 50 µm. Aspirin particles are low aspect ratio needles with 182 an average particle size of 192 μ m. Sodium nitrate particles are granular with an average 183 particle size of 275 μ m. Aspartame particles are high aspect needles (particle size was not 184 measured). Average particle size information was obtained by laser diffraction, while 185 density and shape information was obtained from the literature [42]. The powders were 186 sieved through 10 cm diameter brass pan sieves (Endecotts Ltd, UK) to obtain different 187 particle size ranges: <38, 38 - 53, 53 - 106, 150 - 212, 212 - 250, 250 - 300, 300 - 355188 and $355 - 425 \mu m$ for Avicel; <106, 106 - 150, 212 - 250, 250 - 300, 300 - 355, and 425 189 $-500 \,\mu\text{m}$ for aspirin; 150 - 212, 212 - 250, 250 - 300, 300 - 355, 355 - 425, 425 - 500190 and $500 - 800 \,\mu\text{m}$ for sodium nitrate. The mid-point of the sieve range has been used in 191 plots to represent each particle size fraction.

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193 **2.3. Procedures**

194 **2.3.1. Raman sampling depth studies**

A 2.68 mm thick layer of glass was placed on top of the inverted PhAT probe with a
203 mm spacer attached (Figure 1a). A series of plastic plates, with a 30 mm diameter
hole, were placed on top of the glass plate (Figures 1b and 1c). For investigation of

198 powder depths of 0 - 4.48 mm, up to 16×0.28 mm thick plates were stacked on top of 199 each other. A depth of 8.48 mm was obtained by placing an additional 4 mm thick plastic 200 plate on top of the 16 plates. This combination of plates enabled sampling depths of 201 \leq 4.48 mm to be measured. The powder was carefully placed into the hole in the plastic 202 plates and levelled off using a razor blade, ensuring minimal compaction of the solid, and 203 the mass of solid was recorded. A TiO₂ reference layer (solid particles of TiO₂ sealed 204 between two microscope slides) was placed over the top layer of the powder (Figures 1b 205 and 1c) with aluminium foil used as the final layer to reduce loss of laser and Raman 206 photons from the upper surface of the TiO₂ reference layer. Each corner of the 207 microscope slide was labelled to ensure consistency in positioning, so that the same part 208 of the TiO₂ was analysed each time. A spirit level was placed on top of the glass above 209 the spectrometer to ensure the radiation was pointing vertically upwards (see Figure 1a). Analysis of the variance of the Avicel signal at 1095 cm⁻¹ revealed that the repeatability 210 211 (expressed as the relative standard deviation (RSD) for n = 6) of the Raman 212 measurements, positioning of the sample holder, the weighing procedure and the powder 213 levelling process were 0.22, 0.34, 0.66, and 0.26%, respectively.

The information depth was estimated using the TiO_2 Raman signal at 397 cm⁻¹. As the depth of Avicel, aspirin or sodium nitrate increased, the TiO_2 signal decreased until it became zero; hence, the information depth was defined as the point where the exciting laser can no longer penetrate the powder to generate a detectable Raman signal of the TiO₂ reference layer. This type of approach has been used previously for information depth measurements in NIR reflectance spectrometry [31, 43, 44]. A second set of measurements was made based on the change in the intensity of the Raman signals of Avicel, aspirin and sodium nitrate powders at 1095, 1606 and 1068 cm⁻¹, respectively. In this case, the Raman signal increases with powder depth and then becomes constant, which defines the depth of powder at which the sample effectively becomes infinitely thick. These measurements were made to allow comparisons with the results of previous Raman studies [36, 40] and a study on reflectance NIR which used a similar protocol to assess the sampling depth for aspirin powders [31].

227 2.3.2. Powder blending

The scaled-down convective mixer has been described previously [31, 32, 41]. The vessel has a pot size of about 500 mL, a radius of 4 cm and is made of glass. The impeller has three blades set 120° apart with a tilt angle of 45°; each blade is approximately 29 mm long and 12 mm wide. Powders were mixed at 50 rpm using a stirrer motor (IKA Eurostar, VWR International).

233 For the mixing of two components, 75 g of unsieved Avicel PH-101 was placed 234 into the vessel and mixed. After 120 s, different masses (0, 5, 10, 20, 30 or 40 g) of either 235 unsieved or size fractions of sieved aspirin (<106, 250 - 300 or $425 - 500 \mu$ m) were 236 added via a funnel positioned directly above the centre of the vessel and the powders 237 were allowed to mix for a further 780 s. A further experiment was also conducted in 238 which 25 g of unsieved aspirin and 25 g of unsieved aspartame was added to 75 g of 239 unsieved Avicel PH-101 after 120 and 900 s, respectively; the total mixing time was 240 2100 s.

242 **3. Results and Discussion**

243 **3.1. Raman spectra**

Individual Raman spectra of aspirin, Avicel, and sodium nitrate measured through a glass plate, aspartame measured through the wall of a glass vial, the TiO_2 reference layer, and the glass plate are illustrated in Figure 2. The Raman spectrum of TiO_2 contains peaks at approximately 143, 397, 520 and 640 cm⁻¹, indicating that the TiO_2 is predominantly in the anatase phase [45]. The broad peak that appears at approximately 1400 cm⁻¹ in all spectra in Figure 2 can be attributed to the glass plate.

The TiO₂ peak at 397 cm⁻¹ was least affected by the other compounds and so was used for the information depth experiments. The peaks at 1068 and 1606 cm⁻¹ in the sodium nitrate and aspirin spectra, respectively, were used to determine the depth at which the sample becomes infinitely thick. A small peak in the Avicel spectrum at approximately 1095 cm⁻¹ was also measured, but was found to have poor sensitivity compared to the peaks selected for the other two compounds.

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257 **3.2. Raman information depths for uncompacted powders**

A number of particle size ranges of Avicel, aspirin and sodium nitrate were analysed at increasing depths using the set-up illustrated in Figure 1, and the second derivative Raman spectral intensities were recorded. When the TiO_2 peak at 397 cm⁻¹ could no longer be detected, the depth of the selected powder was deemed to be the information depth limit. Figure 3 gives a summary of the information depths for the different particle size fractions of each compound. In each case, the information depth increased with 264 particle size before becoming constant at higher particle sizes. As the information depth 265 for $300 - 355 \,\mu\text{m}$ aspirin and $355 - 425 \,\mu\text{m}$ sodium nitrate particles was found to be 266 >4.48 mm and so could not be determined, values for these fractions were not included in 267 Figure 3. The increase in information depth with particle size is consistent with Kubelka-268 Munk theory. Diffuse reflectance decreases as particle size increases [46, 47] and 269 consequently, the exciting laser intensity and the Raman signal generated can propagate 270 through larger depths of powder. The differences in information depth for similar sizes of 271 Avicel, aspirin and sodium nitrate particles $<400 \,\mu\text{m}$ indicates that the particle shape, 272 density and/or the light absorption capability of the compounds affect the depth of 273 powder through which the TiO₂ Raman spectrum can be measured.

274 As the intention was to use the PhAT probe to monitor powder blending in a mixer, information depths for TiO_2 at 397 cm⁻¹ were obtained for 10, 30 and 40 g of 275 276 aspirin blended with 75 g Avicel PH-101 to give aspirin concentrations of 11.8, 28.6 and 277 34.8% w/w, respectively. Three particle size ranges of aspirin were used: <106, 250 -278 300 and $425 - 500 \,\mu\text{m}$. The information depth for each of the mixtures was in the range 279 1.7 - 2.0 mm, similar to the value for unsieved Avicel PH-101 (1.7 mm). These findings 280 are similar to those obtained using NIR spectrometry, i.e. the information depth for the 281 analyte compound is determined by the main component in the mixture [31].

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3.3. Depth of powder at which sample becomes infinitely thick

The depth of powder at which the 2^{nd} derivative Raman signal of Avicel (1095 cm⁻¹), aspirin (1606 cm⁻¹) or sodium nitrate (1068 cm⁻¹) became constant was different for each compound and varied with particle size. The depth was found to be >3 mm for each 287 particle size range for Avicel. For sodium nitrate, the depth for the two smallest fractions $(150 - 212 \,\mu\text{m} \text{ and } 212 - 250 \,\mu\text{m})$ was about $0.8 - 1 \,\text{mm}$, whereas for the other particle 288 sizes, the value was 3.5 - 3.9 mm. For aspirin, the depth initially increased with 289 290 increasing particle size (from 3.8 to 4.5 mm) then decreased to 3.5 mm for the largest 291 aspirin particle size range $(425 - 500 \,\mu\text{m})$ analysed. When other peaks in the aspirin spectrum (292, 751 and 1045 cm⁻¹) were measured, the information depth values were no 292 different to those obtained at 1606 cm⁻¹. In contrast, it has been shown that different 293 294 peaks in the NIR spectrum of aspirin give different "infinitely thick" sample depths 295 owing to the different absorptivities of the first and second overtones in the spectrum (0.6 296 -1.1 mm and 1.1 - 2.2 mm, respectively, depending on particle size) [31].

297 Wang et al. [40] investigated the effect of particle characteristics on the Raman 298 sampling depth for a number of crystalline powders using the "infinitely thick" method 299 and found similar trends to those reported here. An increase in sampling depth was observed with average particle size in the range $108 - 428 \,\mu\text{m}$ for sodium nitrate; 300 however, the values obtained (6 - 15.5 mm) were much larger than those obtained in the 301 302 present study. This is likely to be due to a combination of factors; the laser wavelength 303 (514.5 nm) was shorter (sampling depth is wavelength dependent [48]) and a different 304 optical configuration was employed, which has a strong influence on the sampling depth 305 [40]. The sampling depth of a prototype Raman PhAT probe with a 3 mm diameter laser 306 spot size was reported to be 2 mm for theophylline discs, using the "infinitely thick" 307 method [36]. However, it has been shown that the sampling depth is less for pressed 308 material compared to uncompacted powders [40].

309 When the previously mentioned particle size fractions of aspirin were mixed with unsieved Avicel, the intensity of the aspirin peak at 1606 cm⁻¹ became constant at a depth 310 of 3.5 - 3.9 mm for all the mixtures. This indicates that similar to the information depth 311 312 measurements, the depth at which an infinitely thick sample is achieved is influenced 313 principally by the main component and is less affected by particle size variations of the 314 minor component. If the sampling depth is 3.5 mm for mixtures of Avicel and aspirin and 315 it is assumed that all layers within the 3.5 mm contribute equally to the Raman signal. 316 then with a 6 mm diameter laser spot the sampling volume is 99.0 mm³. This equates to a 317 mass of 0.045 g if the density (tap) of the powder is assumed to be that of Avicel (0.45 g cm⁻³). However, it can be estimated from the information depth plots that 318 319 approximately 90% of the Raman signal is generated in the upper 1 mm layer of the 320 powder; this is consistent with the results of Monte Carlo simulations by Matousek and 321 Parker [24]. Therefore, the mass of sample that contributes to approximately 90% of the 322 Raman signal is 0.013 g.

323 The depth at which a sample becomes infinitely thick is generally greater than the 324 information depth determined using a reference layer of TiO₂. When a reference layer is 325 used, the laser photons propagate through the powder to the reference layer where Raman 326 photons of the reference material are generated. The backscattered Raman photons then 327 propagate back through the powder where they are detected. Consequently, the Raman 328 signal used to determine the information depth is only generated in the plane of the 329 reference layer. In comparison, when a compound peak is used Raman photons can be 330 generated throughout the entire depth of the powder. In such situations, the Raman signal 331 decays slower than the exciting laser intensity [49, 50] and so it might be expected that the sampling depth determined using this method will be greater. As the infinitely thick depth is determined using a signal from the sample powder, this will reflect more accurately the depth of material sampled by the Raman probe during powder blending.

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336 **3.4. Effect of particle size on Raman intensities**

The second derivative Raman intensity of aspirin, Avicel and sodium nitrate was measured for each particle size range with a powder depth of 8.48 mm, well in excess of the depth required to achieve an infinitely thick sample for each compound (see Figure 4). The aspirin peak intensity at 1606 cm⁻¹ increases then decreases with increasing particle size, with the maximum (i.e. largest negative) signal intensity occurring at the intermediate particle size ranges. A similar trend was observed for the sodium nitrate and Avicel peak intensities at 1068 and 1095 cm⁻¹, respectively.

344 Kubelka-Munk theory states that diffuse reflectance increases as particle size 345 decreases, which limits the volume of sample contributing to the Raman signal, and 346 therefore, the Raman intensity should increase with increasing particle size [46, 47]. The 347 Raman signals for aspirin, sodium nitrate and Avicel increase with particle size at lower 348 particle sizes, in accordance with Kubelka-Munk theory; however, the signal decreases 349 with an increase in particle size for larger particles. A similar trend to that observed in 350 Figure 4 was observed in an earlier study by Wang et al. [40], when the probe to sample 351 distance was increased to 10 mm to increase the unfocused spot diameter illuminating the 352 sample to ~ 5 mm, and also by Hu et al. [37] when monitoring different particle sizes of 353 flufenamic acid (form I) with small sampling volume probes (0.25 and 0.5 inch diameter 354 immersion optics with a 60 µm laser spot size). In both of these studies, the maximum 355 Raman signal intensity was observed for most samples in the intermediate particle size 356 range [37, 40]. Although the variation in intensity with particle size predicted by 357 Kubelka-Munk theory was not observed experimentally in a number of studies [37, 40, 358 51], Wang et al. [40] demonstrated that there was a strong correlation between the Raman 359 intensity and diffuse reflectance. The main reason for the difference is that Kubelka-360 Munk theory assumes confocal excitation and collection, but in the absence of diffuse 361 reflectance it is likely that the optical configurations employed in the experimental 362 studies had incomplete overlap of the collection and excitation cones. So while an 363 increase in diffuse reflectance decreases the sampling depth, it also increases lateral 364 spreading of the exciting laser beam. This generates additional Raman photons in the 365 region of the collection fibre, which caused an increase in the Raman signal with a 366 decrease in particle size observed in studies by Wang et al. (with a 0.5 mm laser spot size 367 and a probe to sample distance of 1 mm) [40] and by Pellow-Jarman et al. [51]. When the 368 probe to sample distance was increased in the study by Wang et al. [40] (as discussed 369 above), there was greater overlap between the collection and excitation cones and so the 370 improved overlap of the two cones caused by lateral spreading of the excitation beam is 371 less important; hence, the different trends observed at the two different sample to probe 372 distances (and beam diameters).

It is apparent that the variation in Raman signal observed with particle size is highly dependent on the optical arrangement employed [40]; it is a balance between signal enhancement through lateral spreading of the beam and signal reduction through a decrease in the sampling depth caused by diffuse reflectance. The PhAT probe mainly used in the present study (6 mm laser beam diameter), has good overlap of the excitation and collection cones because of very weak divergence of the beam (i.e. close to a collimated beam with a large depth of field of approximately ± 1 inch) [52]. Consequently, signal enhancement by the lateral beam spreading is less important and so the signal intensity is correlated to the sampling depth (as predicted by Kubelka-Munk theory) up to a certain particle size. For larger particle sizes, it may be that Raman photons are emitted outwith the collection volume of the PhAT probe owing to the greater propagation distances.

385

386 3.5. Powder Blending

Different masses and particle sizes of aspirin were added to 75 g Avicel PH-101 as it was 387 388 agitated in the mixer. Example second derivative spectra obtained during the mixing of 389 40 g of 250 – 300 µm aspirin particles and Avicel PH-101 are shown in Figure 5; aspirin 390 was added to the Avicel at 120 s. The Raman intensities of the aspirin peaks in the 391 measured spectra increased as the mass of the aspirin was increased and correspondingly 392 the Avicel peak intensity decreased. Mixing profiles were produced by plotting the 393 second derivative Raman intensity against time for the aspirin peaks at 751 and 1606 cm⁻¹. The same trends were noted for measurements at each peak so only the results 394 based on 1606 cm⁻¹ are discussed. The mixing profiles for addition of 0 - 40 g of the 250 395 - 300 um aspirin particles are shown in Figure 6. On addition of aspirin after 120 s, a 396 large increase in Raman scattering occurred at 1606 cm⁻¹ as a result of the mixing 397 398 properties of the mixer, whereby the aspirin powder is drawn down towards the bottom of 399 the vessel and then up the side of the vessel through the Raman observation zone. As mixing continued, the 2nd derivative signal of aspirin became less negative as the mixture 400

401 became homogenous, with the larger masses of aspirin taking longer to achieve a more402 constant plateau signal.

403 The mixing profiles for the other two particle sizes of aspirin were similar to those 404 in Figure 6, however, the time taken to achieve a homogeneous mixture and the variation 405 (peak-to-peak noise) of the profile at the plateau region increased with particle size for 406 each mass of aspirin added. Bellamy et al. [31] obtained similar mixing profiles to those 407 reported here when non-invasive NIR spectrometry was used to monitor the addition of 408 aspirin to Avicel PH-101 in the same type of mixer. The lesser variability in the Raman 409 profile signal at the plateau region when mixing smaller aspirin particles is due to the 410 more consistent number of aspirin particles passing through the measurement region at 411 any time than occurs for mixing of larger particle sizes; a similar phenomenon was 412 observed by Bellamy et al. [31] for the NIR-based mixing profiles. The magnitude of the 413 mean Raman signal in the plateau region at 700 - 900 s was calculated for each of the 414 mixing profiles and plotted against the mass of aspirin added. A linear response curve was generated for each particle size range of aspirin with slopes of -0.278 (R^2 = 415 0.986), -0.329 ($R^2 = 0.998$), and -0.312 ($R^2 = 0.997$) obtained for <106, 250 - 300 and 416 $425 - 500 \,\mu\text{m}$ particles, respectively. The lesser sensitivity obtained with the <106 μm 417 418 particles is probably related to the different shape of these particles (more granular than 419 needle-shaped) identified from microscope images. It is likely that with the large 420 sampling volume used in this study, the change in the relative number of particles with 421 aspirin particle size becomes less significant and so the spectrum obtained is still 422 representative of the mass fraction of aspirin [37]. The estimated sampling volume with a mixing speed of 50 rpm and a sampling depth of 3.5 mm is 11095 mm³ (assuming all 423

424 layers contribute equally), which equates to a mass of 4.99 g. However, if 90% of the
425 Raman signal is generated in the top 1 mm layer of powder, then most of the measured
426 signal arises from 1.43 g of sample.

427 The NIR method of Bellamy et al. [31] and a previously reported procedure for 428 monitoring powder blending by broadband acoustic emission spectrometry [41] were 429 used simultaneously with Raman spectrometry to compare the mixing profiles obtained 430 by the three non-invasive techniques. Example profiles are given in Figure 7 for addition 431 of 30 g aspirin to 75 g Avicel PH-101 mixing at 50 rpm. The features of the mixing 432 profiles, including the end-point of blending to a homogeneous mixture, were similar for 433 the three techniques, although the signal to noise was best for NIR and poorest for 434 acoustic emission. De Beer et al. [25] also found in-line Raman and NIR spectrometry 435 produced similar end-points (defined by the content uniformity method [30]) when used 436 simultaneously to monitor mixing of Avicel PH-102, lactose DCL 21 and silicium 437 dioxide in a high shear blender. However, there is clearer correspondence between the 438 mixing profiles over the entire blending experiment in the present study, as the mixing 439 profiles were derived from the spectral signals related to the added component and the 440 spectral measurements were acquired at a higher acquisition frequency. Table 1 gives a 441 comparison of the detection limit for unsieved aspirin mixing at 50 rpm in unsieved 442 Avicel PH101 for non-invasive NIR spectrometry, Raman spectrometry, and acoustic 443 emission. The detection limit calculated for Raman measurements was about an order of 444 magnitude poorer than that obtained with NIR spectrometry with a Zeiss Corona 445 instrument, but 5-fold better than the value obtained for acoustic emission with a Nano30 446 transducer.

447 Raman measurements were also obtained for addition of 25 g aspirin (after 120 s) 448 and then 25 g aspartame (after 900 s) to 75 g of Avicel PH-101. Inspection of the second 449 derivative spectra of the compounds revealed that mixing profiles could be plotted based 450 on well resolved peaks for aspirin or aspartame with minimal interference from the other 451 compounds; this is an advantage over NIR spectrometry for monitoring multiple 452 component systems where multivariate techniques are generally needed to deconvolute 453 the relative contributions from each compound. Example Raman mixing profiles based on the aspirin peak at 1606 cm⁻¹ and the aspartame peak at 1006 cm⁻¹ are shown in Figure 454 455 8. As observed in Figure 6, on addition of aspirin to the mixer at 120 s, there was an 456 initial large increase in the aspirin signal, which then decreased to a constant value; as 457 expected, the aspartame response remained at approximately zero when aspirin was 458 added to the Avicel. However, on addition of aspartame to the vessel at 900 s, there was a 459 large change in the aspartame signal at about 1000 s. The oscillating mixing profile of 460 aspartame between 1200 and 1600 s is characteristic of a cohesive particle [32]. The 461 aspirin signal was affected by the addition of aspartame, initially increasing slightly 462 owing to minor compaction of the powder mixture in the vessel followed by a reduction 463 owing to dilution of the aspirin concentration as aspartame is blended in to the mixture.

464

465 **4. Conclusions**

This study has shown that non-invasive Raman spectrometry with an optically broadened spot size of 6 mm gives sampling depths of over 3 mm for measurement of aspirin in Avicel; this is greater than the value obtained for non-invasive NIR spectrometry in a previous study [31]. *In situ* Raman measurements can be used to produce mixing profiles

470 to study how the powders mix together, identify when the end point of mixing has 471 occurred, and perform quantitative analysis in real time. Although less sensitive than a 472 previously reported non-invasive NIR procedure, the Raman method could offer 473 advantages when optimising mixing regimes for multi-component samples, as it may 474 allow individual compound specific mixing profiles to be produced because of the 475 technique's greater chemical specificity.

476

477 Acknowledgements

The support of EPSRC/DTI through LINK grant GR/R/19366/01 is acknowledged.
CPACT is thanked for funding PA and LJB's PhD studentships, and the Royal Society is
thanked for the award of a University Research Fellowship to AN.

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Table captions

Table 1. Detection limit for aspirin in Avicel PH-101 mixing at 50 rpm for non-invasive

629 NIR spectrometry, acoustic emission (AE) and Raman spectrometry.

Technique	Signal	Detection limit/(% w/w) ^a
NIR	1^{st} derivative of log(1/R) at 8956 cm ⁻¹	0.1
Raman	2 nd derivative at 1606 cm ⁻¹	1.1
AE	Area between 0 and 400 kHz	5.2

632	^a Detection limit calculated from 3 times the standard deviation of the signal between 702
633	and 900 s in the mixing profile for Avicel PH-101 alone ($n = 34$) divided by the
634	sensitivity of the signal response for aspirin. The sensitivity was obtained from a plot of
635	concentration (0 –28.6% w/w for AE and 0 –34.8% w/w for NIR and Raman) against
636	average signal intensity between 702 and 900 s in the mixing profiles ($n = 34$). The NIR
637	and Raman data were resampled to match the acquisition frequency of the AE
638	measurements (every 6 s).
639	

641 Figure captions



Figure 1. a) Raman PhAT probe set up for sampling depth experiments with powders, b)
expansion of sample set up showing the glass plate, plastic plates and TiO₂ reference
layer, and c) end on view of sample set up.



Raman shift/cm⁻¹ Figure 2. Offset Raman spectra of a) aspirin, b) aspartame, c) Avicel PH-101, d) sodium nitrate, e) TiO_2 reference layer (intensity reduced by a factor of 4) and f) 2.68 mm thick glass plate. All spectra, except for aspartame, were acquired using the PhAT probe with an exposure time of 0.5 s and 1 accumulation. The spectrum for aspartame was acquired using a MR probe with an exposure time of 4.0 s and 1 accumulation.



Figure 3. Information depths of Avicel, aspirin and sodium nitrate of different particle

655 sizes, based on measurements of the TiO_2 peak at 397 cm⁻¹.



Figure 4. Second derivative Raman signal intensity for measurements at aspirin (1606 cm⁻¹), Avicel (1095 cm⁻¹) and sodium nitrate (1068 cm⁻¹) peaks for increasing particle size ranges with a powder depth of 8.48 mm. The lines drawn through the data points were calculated using a cubic B-spline function.



Figure 5. Offset second derivative Raman spectra obtained at a) 50, b) 150, c) 200, d) 400 and e) 800 s during the mixing of 40 g of aspirin (particle size range $250 - 300 \mu$ m) and Avicel PH-101. Aspirin was added to Avicel at 120 s and a mixing speed of 50 rpm was used.



670 Figure 6. Raman PhAT probe mixing profiles at 1606 cm⁻¹ for additions of a) 0, b) 5, c)

671 10, d) 20, e) 30 and f) 40 g of aspirin (particle size range $250 - 300 \,\mu$ m) to Avicel PH-

672 101 at 120 s, mixing with an impeller speed of 50 rpm.



Figure 7. Mixing profiles for addition of 30 g aspirin to 75 g Avicel PH-101 at 120 s mixing at 50 rpm, obtained simultaneously by three non-invasive techniques: a) acoustic emission spectrometry (area between 0 and 400 kHz); b) NIR spectrometry (1^{st} derivative of log(1/R) at 8956 cm⁻¹), and c) Raman spectrometry (2^{nd} derivative of intensity at 1606 cm⁻¹).



682 Figure 8. Raman mixing profiles obtained using a) the aspartame peak at 1006 cm⁻¹ and

- b) the aspirin peak at 1606 cm⁻¹ for addition of 25 g aspirin (120 s) and 25 g aspartame
- 684 (900 s) to 75 g Avicel PH-101 mixing at 50 rpm.