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## ARTICLE

# Comparative Electron and Photon Excitation of Localized Surface Plasmon Resonance in Lithographic Gold Arrays for Enhanced Raman Scattering

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The ability to tune the localized surface plasmon resonance (LSPR) of nanostructures is desirable for surface enhanced Raman spectroscopy (SERS), plasmon-assisted chemistry and other nanophotonic applications. Although historically the LSPR is mainly studied by optical techniques, with the recent advancement in electron monochromators and correctors, it has attracted considerable attention in transmission electron microscopy (TEM). Here, we use electron energy loss spectroscopy (EELS) in a scanning TEM to study individual gold nanodiscs and bowties in lithographic arrays with variable LSPRs by adjusting the size, interspacing, shape and dielectric environment during the nanofabrication process. We observe the strongest Raman signal enhancement when the LSPR frequency is close to the incident laser frequency in Raman spectroscopy. A simplified harmonic oscillator model is used to estimate SERS enhancement factor (EF) from EELS, bridging the connection between electron and photon excitation of plasmonic arrays. This work demonstrates that STEM-EELS shows promise for revealing the contributions of specific LSPR modes to SERS EF. Our results provide guidelines to fine-tune nanoparticle parameters to deliver the maximum signal enhancement in biosensing applications, such as early cancer detection.

## 1 Introduction

The Raman signal from an organic molecule can be significantly enhanced by its contact with a noble metal surface<sup>1–3</sup>. This phenomenon, now known as surface enhanced Raman spectroscopy (SERS), is employed in biological and chemical sensing applications owing to its high sensitivity and fingerprinting accuracy. Applications range from single molecule sensing<sup>2,4</sup>, rapid bacteria identification<sup>5</sup>, artwork authenticity evaluation<sup>6</sup> to the detection of circulating tumor cells/DNA<sup>7,8</sup> and early stage tumors<sup>9–11</sup>. The latter has clear importance in cancer diagnostics and therapy<sup>12–14</sup>.

The SERS enhancement, which can be many orders of magnitude, is generally recognized as mostly arising from the local electric field enhancement associated with surface plasmons in noble metals<sup>3,15</sup>, which essentially are the collective oscillation modes of the free electron gas at the metal surface. Noble metal nanoparticles are particularly useful as their localized surface plasmon resonance (LSPR) energies are functions of nanoparticle parameters, such as shape, size and mutual proximity<sup>16–20</sup>. It is also expected that greater enhancement (and so higher signal) would be

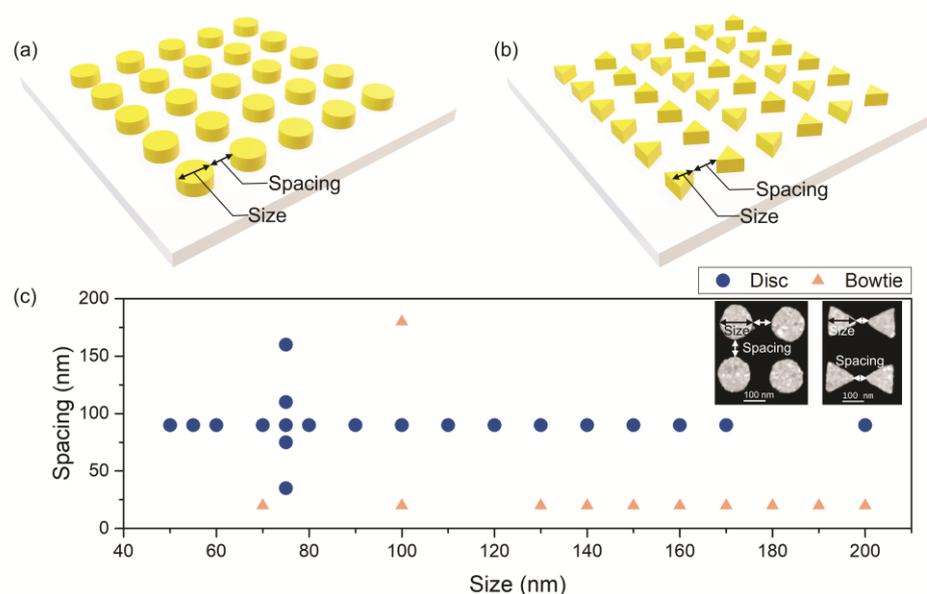
23 achieved when the induced plasmons are in resonance with  
24 the illuminating photon energies<sup>21,22</sup>.

25 While the LSPR of metallic nanoparticle clusters can be  
26 studied by far-field extinction microscopy<sup>23</sup>, far-field dark-  
27 field optical microscopy<sup>19,24</sup> and near-field optical extinction  
28 microscopy<sup>25</sup> techniques, their individual energies and local  
29 spatial distributions have been most effectively  
30 demonstrated by electron energy loss (EEL) mapping by  
31 scanning transmission electron microscopy (STEM).  
32 Nelayah et al.<sup>26</sup> first showed the plasmon distributions in  
33 5.5 nm silver nanoprisms, which was expanded by Koh et  
34 al.<sup>27</sup> to gold triangular combinations as fabricated by  
35 electron beam lithography and to other nanoparticle  
36 shapes and sizes<sup>28–30</sup>. In the present work, we have used  
37 lithographic methods to systematically vary the shape,  
38 interspacing and size of nanoparticles, while studying their  
39 effect on LSPR distributions using STEM-EELS. We then  
40 compare the LSPR with the Raman signal enhancement  
41 from the exact same areas and demonstrate experimentally  
42 that the greatest Raman signal enhancement is obtained  
43 when the LSPR energy matches that of the exciting laser or  
44 Raman emissions. The quantitative experimental results on  
45 individual nanoparticles obtained from EELS are consistent  
46 with previous reported values on ensemble samples from  
47 optical measurements and supported by the boundary  
48 element method (BEM) simulations. Accordingly, we show  
49 a method to roughly estimate Raman signal enhancement  
50 factor (EF) using LSPR measured in EELS based on a  
51 harmonic oscillator model, which can be practically used for  
52 pre-screening plasmonic nanoparticles directly in TEM. Our

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**Fig. 1** An overview of geometric parameters of gold nanodisc and bowtie arrays. **(a)** A schematic array of 30 nm thick Au nanodiscs on a 30 nm thick membrane substrate with the size and the spacing defined as the disc diameter and the edge-to-edge distance. **(b)** A schematic bowtie array with the triangle height as the bowtie size and the distance between two pointing vertices as the bowtie spacing. **(c)** Au nanostructures investigated in this work are: nanodisc arrays with diameter from 50 nm to 200 nm and interspacing from 35 nm to 160 nm; bowtie arrays with size from 70 nm to 200 nm and spacing from 20 nm to 180 nm. Insets are part of annular dark field STEM images of the nanodisc and bowtie arrays, with the gold structures being bright in these images. Additional images can be found in **ESI Figs. S1, & S2**.

53 observation when applying this method to bowties also  
 54 suggests that monochromated STEM-EELS shows promise  
 55 for revealing the contributions of specific LSPR modes to  
 56 SERS EF. By comparatively studying both electron and  
 57 photon excitation of surface plasmons, we propose a  
 58 procedure to engineer nanoparticles to precise shapes and  
 59 sizes to yield the highest Raman enhancement, which  
 60 would then be optimized for practical applications, such as  
 61 high sensitivity biomarker detection. This combination is  
 62 unique in our work. Additionally, the conclusions would also  
 63 benefit other fields utilizing LSPR enhancement, e.g. in solar  
 64 cells<sup>31</sup>, plasmonic nanoparticles with optimized parameters  
 65 would increase the absorption cross-section and overall  
 66 efficiency when the LSPR is fully excited by the incident  
 67 light.

## 68 Experimental

69 This work explores gold nanodiscs and bowties with  
 70 varying size and spacing, fabricated in  $2\ \mu\text{m} \times 2\ \mu\text{m}$  arrays  
 71 using electron beam lithography for fast prototyping. The  
 72 procedures have been described in a previous publication<sup>32</sup>.  
 73 The nanodisc size (diameter) and spacing (edge to edge  
 74 distance) ranged from 50-200 nm and from 35-160 nm,  
 75 respectively (**Figs. 1a, & c**). The bowtie size (triangle height)  
 76 and spacing (tip-to-tip distance) ranged from 70-200 nm  
 77 and from 20-180 nm, respectively (**Figs. 1b, & c**). Both  
 78 nanodiscs and bowties are 30 nm in thickness. Arrays were  
 79 fabricated on 35 nm thick  $\text{SiN}_x$  and  $\text{SiO}_x$  membranes to  
 80 enable examination with STEM. Additional details are given  
 81 in the Methods section. Nanoparticles with desired  
 82 properties can also be fabricated using scalable techniques,

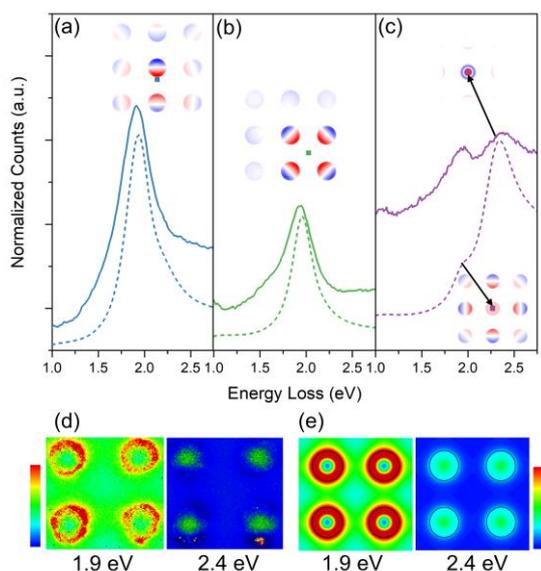
83 such as optical based fabrication techniques<sup>33</sup> and wet  
 84 chemical synthesis.

85 During STEM-EELS measurements, a 300 kV electron  
 86 probe (approx. 0.5 nm diameter) was rastered across a  
 87 subset of the array (see Methods section for STEM  
 88 conditions) and EEL spectra were recorded simultaneously  
 89 at each pixel. Annular dark field (ADF) images of the  
 90 structures show contrast between different grain  
 91 orientations (**Fig. 1c insets**), indicating the structures are  
 92 polycrystalline. After EELS measurements, each array was  
 93 then tested with two different Raman dye molecules,  
 94 Rhodamine 6G (R6G) and 4-Mercaptopyridine (4-MP), in a  
 95 Raman confocal microscope with 532 nm, 638 nm and 785  
 96 nm wavelength lasers to collect Raman spectra from each  
 97 array.

## 98 Results and discussion

### 99 Nanodisc surface plasmons in EELS

100 First, we explore how plasmon excitation varies within a  
 101 single array (90 nm discs on  $\text{SiN}_x$ ) as a function of electron  
 102 probe position. Experimental spectra, represented by solid  
 103 lines, were collected from the nanodisc perimeter (**Fig. 2a**),  
 104 in the midpoint between four discs (**Fig. 2b**) and at the disc  
 105 center (**Fig. 2c**). The zero loss peak (ZLP) is used to normalize  
 106 each spectrum to the same maximum intensity and  
 107 subsequently subtracted. Simulated EEL spectra, based on  
 108 the boundary elementary method<sup>34</sup>, are plotted as dotted  
 109 lines in **Figs. 2a, b & c** and show good agreement with the  
 110 experimental data. These simulations utilized the  
 111 experimental electron beam energy and nanoparticle size,



**Fig. 2** Localized surface plasmon peaks and the corresponding distribution of 90 nm discs on SiN<sub>x</sub> in EELS mapping. EEL spectra (solid lines) and simulated spectra (dotted lines) are integrated from the disc perimeter (a), the midpoint between discs (b) and the disc center (c). Simulated charge density distributions are shown in the insets with points of excitation (e-beam locations) labelled correspondingly as blue, green and purple squares. Peaks at 1.9 eV all exhibit dipolar behavior, while the breathing mode (2.4 eV) is only present at the disc center. (d) Normalized EELS intensity distributions and (e) simulated maps at energy loss of 1.9 eV shows that the dipolar mode is omnipresent across the whole surveyed area but is strongest around the nanodisc perimeters. Maps at energy loss of 2.4 eV reveal that the breathing mode is restricted within the nanodisc center (strong intensities on bottom right of (d) 2.4 eV map is a result of a sharp spike at the edge possibly due to fabrication imperfection). Energy window of EELS maps is 0.01 eV.

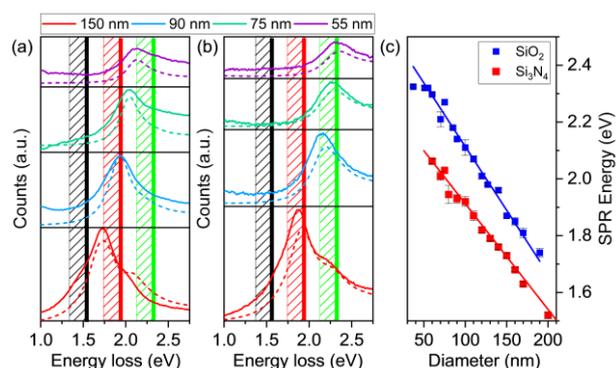
112 and were calculated using models composed of nanodisc  
 113 arrays on a SiN<sub>x</sub> or SiO<sub>x</sub> substrate that were derived from  
 114 the real nanostructure geometries (more details in  
 115 Methods). Because of computational limitations, the  
 116 models were limited to nine disc arrays (one central disc  
 117 surrounded by its eight nearest neighbors), which was  
 118 sufficiently large to capture the experimental behavior. The  
 119 simulations were also used to predict the corresponding  
 120 surface charge density distributions at the LSPR peak  
 121 positions, as shown in the insets in **Figs. 2a, b & c**. A dipolar  
 122 surface plasmon mode at an energy loss of 1.9 eV, with  
 123 positive (red) and negative (blue) surface charges  
 124 distributed on the opposite sides of the disc, is present in all  
 125 three spectra. A breathing LSPR mode is present at 2.4 eV,  
 126 as indicated by the radial shape of charge density  
 127 distribution<sup>35</sup>, and is only observed in **Fig. 2c** when the  
 128 electron beam is positioned at the disc center. However, a  
 129 plane wave illumination such as light cannot excite the  
 130 breathing mode because the symmetry of the charge  
 131 distribution results in a vanishing net dipole moment<sup>32,35</sup>.  
 132 Therefore, this study will primarily focus on the dipolar  
 133 LSPR.

134 Once the energies of plasmon resonances have been  
 135 determined, we can plot the plasmon excitation intensity as  
 136 a function of position. Distributions at the dipolar mode  
 137 peak of 1.9 eV and the breathing mode peak of 2.4 eV are  
 138 shown in **Fig. 2d** with each pixel normalized to the ZLP

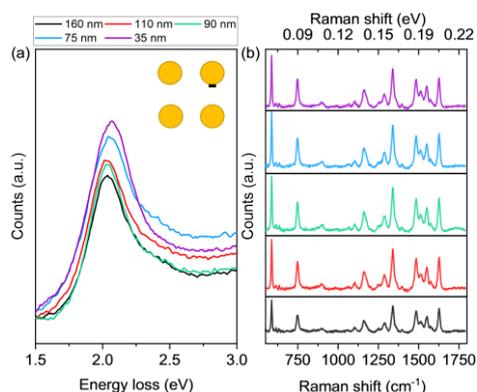
139 maximum and drawn to the same color scale.  
 140 Corresponding simulated EELS maps (**Fig. 2e**) show a similar  
 141 distribution and confirm that the dipolar plasmon mode is  
 142 omnipresent across the whole array with the most intense  
 143 peaks residing around the nanodisc perimeters, while the  
 144 breathing mode is only observed within the metallic  
 145 nanodiscs.

#### 146 Effect of nanodisc parameters on LSPR

147 Several nanoparticle parameters, such as size, shape  
 148 and dielectric environment, have been studied theoretically  
 149 and experimentally that could affect LSPR<sup>15,20,36</sup>. However,  
 150 a quantitative and systematic work studying the effect of  
 151 nanoparticle parameters on LSPR using EELS, compared  
 152 with SERS enhancement and supported by theory has not  
 153 been reported before to our knowledge. Experimental EEL  
 154 spectra from different diameter nanodiscs on SiN<sub>x</sub> and SiO<sub>x</sub>  
 155 membranes are summed within a 4 nm distance around the  
 156 nanodisc perimeters in **Figs. 3a, & b**. The measured dipolar  
 157 surface plasmon peak energies are plotted as a function of  
 158 nanodisc size from 30 nm to 220 nm in **Fig. 3c**. The  
 159 interspacing of the mentioned disc arrays is kept at 90 nm.  
 160 The LSPR energy blue shifts (as expected theoretically<sup>37</sup>) as  
 161 the nanodisc size decreases, in a linear manner in this size  
 162 range and can be roughly estimated by  $(2.3 - 0.0037d)$  eV  
 163 for arrays on SiN<sub>x</sub> and  $(2.6 - 0.0045d)$  eV for arrays on  
 164 SiO<sub>x</sub>, where  $d$  is the disc diameter from 50 nm to 200 nm.  
 165 Therefore, nanoparticle size is an important parameter in  
 166 fine-tuning the localized surface plasmon response of the  
 167 nanostructure, as is the local dielectric environment. This  
 168 phenomenon has also been reported in various optical<sup>15,18</sup>  
 169 and simulation<sup>38</sup> studies. Corresponding EELS simulations,



**Fig. 3** Nanodisc size and dielectric constant of surrounding medium strongly affect LSPR energy. Integrated EEL spectra around the four discs perimeter showing surface plasmon peaks of various nanodisc size on (a) SiN<sub>x</sub> (dielectric constant ~4.2) and (b) SiO<sub>x</sub> (dielectric constant ~2.1) membrane, respectively. There is a clear blue shift (increasing peak energy) with decreasing disc diameter. Dotted lines are simulated EEL spectra of the corresponding nanodisc size in the same color scheme. The bold vertical dark line corresponds to a 785 nm (1.58 eV) laser excitation wavelength, the red line corresponds to a 638 nm (1.94 eV) laser excitation wavelength and the green line corresponds to a 532 nm (2.33 eV) laser excitation wavelength. The shaded area corresponds to the Raman spectra collection range from 550 cm<sup>-1</sup>~1800 cm<sup>-1</sup> (0.068 eV ~ 0.22 eV). (c) Dipolar peak energies vary approximately linearly with nanodisc size from 30 nm to 220 nm measured in monochromated STEM-EELS. Error bars indicate the range of SPR energies in measured locations.



**Fig. 4** Nanodisc spacing has a minor effect on LSPR energy and overall Raman signal enhancement. **(a)** Integrated EEL spectra around the nanodisc circumference in arrays at a constant diameter of 75 nm and various edge to edge separation from 35 nm to 160 nm on SiN<sub>x</sub> membrane. Only a slight blue-shift (< 0.2 eV) of the dipolar resonance energy when the separation is decreased indicates that interspacing has only a minor effect. **(b)** The corresponding Raman spectra of R6G from the same nanodisc arrays as in (a) measured with a 532 nm laser showing Raman signal enhancement is not strongly affected by the interspacing. The relatively lower Raman signal of 160 nm spaced nanodiscs may arise from a lower fill factor of nanodiscs in the array. The legend is the same as in (a).

170 represented by dotted lines in **Fig. 3a, b**, match the  
171 experimental results well.

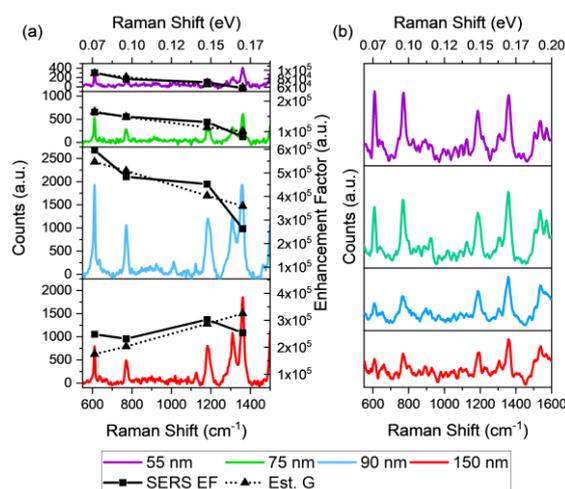
172 For the same size nanodiscs, we observe that the LSPR  
173 energy is strongly dependent on local dielectric  
174 environment. In the visible wavelength regime, the  
175 dielectric constant for Si<sub>3</sub>N<sub>4</sub> is  $\sim 4.2$ <sup>39</sup> and for SiO<sub>2</sub> is  $\sim 2.1$ <sup>40</sup>. A  
176 red shift of LSPR energy is shown in **Fig. 3c** when the  
177 substrate dielectric constant increases because the  
178 polarizability of the system, which is maximum at the  
179 resonance frequency, is inversely related to both the  
180 dielectric constants of nanoparticles and their surrounding  
181 media<sup>15</sup>. A simplified model based on a quasi-static  
182 approximation provides reasonable theoretical explanation  
183 and can be found in **ESI Fig. S3**. This behavior is important  
184 for biological applications as oftentimes plasmonic  
185 nanoparticles are coated with functional and/or protective  
186 layers (such as silica), which may have different dielectric  
187 constants, affecting the resonance energy.

188 Interspacing is of interest due to a possible coupling  
189 effect between localized surface plasmons in near field. EEL  
190 spectra (**Fig. 4a**) around nanodisc edges in arrays at a  
191 constant size of 75 nm and various interspacing from 35 nm  
192 to 160 nm share similar shape and intensity. However, the  
193 peak position is observed to slightly blue shift (< 0.2 eV) for  
194 smaller interspacing due to the generation of bonding and  
195 antibonding modes from LSPR hybridization and stronger  
196 electrostatic repulsion of like charges<sup>27</sup>. Significant  
197 resonance shifts (> 1 eV) are observed in EEL spectra for  
198 nanoparticles separated less than 3 nm due to quantum  
199 tunneling effects<sup>41</sup>, but this is much lower than the range  
200 studied here.

201

## 202 Effect of LSPR on Raman signal enhancement

203 Raman spectra of R6G attached to different particle size  
204 arrays were measured with a 532 nm (**Fig. 5b, & S5b**), a 638  
205 nm (**Fig. 5a, & S6**) and a 785 nm laser (**ESI Fig. S6a**) at an  
206 optimized power output (**ESI Fig. S10**). The 785 nm laser is  
207 medically preferred due to a large tissue penetration  
208 depth<sup>42</sup>, but clearly shows lower Raman signals for these  
209 nanoparticles. The corresponding laser energies are also  
210 labelled in **Figs. 3a, & b** as bold vertical lines at the positions  
211 of 2.33, 1.94 and 1.58 eV, respectively. To the left of each  
212 line, the shaded area represents the range of photon  
213 energies collected by the Raman spectrometer. When the  
214 excitation laser frequency is close to (and slightly higher  
215 than) that of the LSPR of nanoparticles, the Raman signal  
216 experiences a significant signal enhancement compared  
217 with off-resonance situations. One such example is the 90 nm  
218 nanodiscs on SiN<sub>x</sub> illuminated by a 638 nm laser (**Figs.**  
219 **3a & 5a**), where the energy difference is less than 0.1 eV.  
220 The other size arrays under the same illumination show less  
221 enhancement as their LSPR energies deviate more from the  
222 laser energy. Raman spectra for nanoparticles illuminated  
223 by a 785 nm laser are mostly dominated by noise due to  
224 inefficient surface plasmon excitation with a laser energy  
225 much lower than the LSPR energy (**ESI Fig. S6**). When  
226 illuminated by a 532 nm laser, the Raman signal is stronger  
227 for smaller diameter arrays, again due to a smaller  
228 difference between the laser and LSPR energy (**ESI Fig. S6**).  
229 Raman spectra collected from samples on the SiO<sub>x</sub>  
230 membrane illuminated with a 532 nm (**Fig. 5b**) and a 638  
231 nm laser (**ESI Fig. S7**) follow the same trend as described for  
232 the SiN<sub>x</sub> membrane samples. Raman spectra of nanodiscs  
233 arrays with different interspacing (**Figs. 4b & S5**) do not



**Fig. 5** Raman spectra of R6G attached to nanodisc arrays and comparison with estimated surface plasmon enhancement from EELS. Raman spectra from nanodiscs of different size on **(a)** SiN<sub>x</sub> substrates measured with a 638 nm laser and **(b)** SiO<sub>x</sub> substrates measured with a 532 nm laser. The highest Raman signal enhancement in (a) occurs for 90 nm diameter nanodiscs. The measured Raman signal enhancement factors (EF, as defined in Methods Equation (2)) at 611 cm<sup>-1</sup>, 771 cm<sup>-1</sup>, 1181 cm<sup>-1</sup> and 1361 cm<sup>-1</sup> from SERS (square marks) show good agreement with estimated G using Equation (1) above from EELS (triangle marks). For (b), the 75 nm and 55 nm discs enhance Raman signals better than the other arrays. Raman signal EF could not be properly quantified due to the lack of the control Raman spectra because R6G is highly fluorescent at 532 nm laser excitation.

**Table 1.** Experimental SERS EF of nanodisc and bowtie arrays tabulated from Fig. 5 and Fig. 7. Reported values of related studies are also included here.

Nanoparticles	Size (nm)	Separation (nm)	SERS EF ( $\times 10^5$ )	Misc.	References
Au nanodisc arrays	55	75	0.5-0.9	R6G Raman dye, 638 nm laser.	This work.
	75		0.8-1.6		
	90		2.6-6		
	150		2.3-3		
Au periodic nanocylinders	200	25-100	0.25-0.8	pMA Raman dye, 785 nm laser	Gopinath et al. <sup>43</sup>
Inverted Au nanodisc arrays	370	130	4.2	4-MP Raman dye, 785 nm laser	Yu et al. <sup>44</sup>
Au bowtie arrays	70	20	0.6-1.2	R6G Raman dye, 638 nm laser.	This work.
	100		4.0-8.9		
	140		3.3-5.1		
Au bowties	300	30	3.9	Theoretical work, EF derived from electric field enhancement.	Hrtoň et al. <sup>45</sup>
Au bowties arrays	100	6	100	BPE Raman dye, 785 nm laser.	Zhang et al. <sup>46</sup>
		24	1		

234 show much variation in peak enhancement, which agrees  
235 with their EELS measurements.

236 Although the observation may be regarded as intuitive,  
237 the direct relation between the energy of surface plasmons  
238 in EELS and the intensity of Raman signals has not been  
239 explicitly shown before to our knowledge. Our observation  
240 is also supported by previous work stating that there is no  
241 significant spectral shift between the maxima of EELS and  
242 optical extinction spectroscopy regarding surface  
243 plasmons<sup>47,48</sup>. However, it is reported that the maximum  
244 near-field enhancements occur at lower energies than the  
245 maximum of the corresponding far-field spectrum due to  
246 the system damping in optical studies<sup>22,49</sup>. We suspect  
247 similarly lower resonance energy in EELS compared with  
248 that in far-field optical measurements, but such a red shift  
249 is negligible for the low damping systems investigated here.  
250 Furthermore, in biosensing and other practical applications,  
251 the maximum Raman signals might be achieved with a  
252 lower energy laser than the LSPR energy of nanoparticles  
253 due to the competition of extinction effects in solutions  
254 against SERS enhancement<sup>50</sup>, therefore one of the next  
255 steps in our work would be to test the influence of various  
256 liquid environments, first by Raman spectroscopy, and then  
257 possibly by STEM-EELS using a liquid cell holder. In order to  
258 scale up the nanoparticles for real applications, other  
259 fabrication methods such as printing, lithography or  
260 chemical synthesis, will need to be applied.

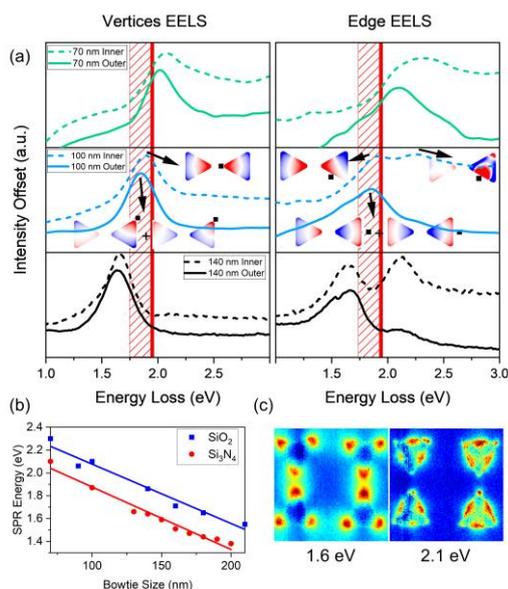
261 Another observation is that the Raman peaks are not  
262 enhanced uniformly. This is thought to be caused by the  
263 variation in local field enhancement at the frequency of  
264 different Raman emissions<sup>51</sup>. Following previous studies<sup>3,15</sup>,  
265 the electromagnetic SERS enhancement  $G$  (a ratio of local  
266 field intensity at the nanoparticle array to that off the array)  
267 is defined by equation:

$$G = I_{Loc}(\omega_L)I_{Loc}(\omega_R) = \frac{|E_{Loc}(\omega_L)|^2}{|E_0(\omega_L)|^2} * \frac{|E_{Loc}(\omega_R)|^2}{|E_0(\omega_R)|^2} \quad (1)$$

268 where  $I_{Loc}$  is the local field enhancement at the laser  
269 excitation frequency  $\omega_L$  and the frequency of the Raman  
270 peak  $\omega_R$ . It is safe to approximate  $\omega_L = \omega_R$ <sup>15</sup>, yielding a  
271 fourth-power dependency on local field at laser excitation  
272 frequency  $G = \left(\frac{E_{Loc}}{E_0}\right)^4$ . However, this approximation  
273 breaks down at large wavenumbers, especially when the  
274 laser energy is in the vicinity of the LSPR energy. The local  
275 field enhancement would vary significantly even across a  
276 relatively narrow spectrometer collection region. For the  
277 150 nm disc array, although the LSPR energy (1.7 eV) is  
278 lower than the 638 nm laser energy (1.9 eV), the  
279 corresponding Raman modes in the range 1200  $\text{cm}^{-1}$  ~1600  
280  $\text{cm}^{-1}$  (tail of the red shaded area in **Fig. 3a**) are much closer  
281 to the LSPR energy, therefore experiencing larger signal  
282 enhancement than those in the range 600  $\text{cm}^{-1}$  ~800  $\text{cm}^{-1}$ .  
283 For the 90 nm size array, since the LSPR energy is close to  
284 the 638 nm laser energy (**Fig. 3a**), smaller Raman shift peaks  
285 exhibit stronger enhancement than those for the 150 nm  
286 size array.

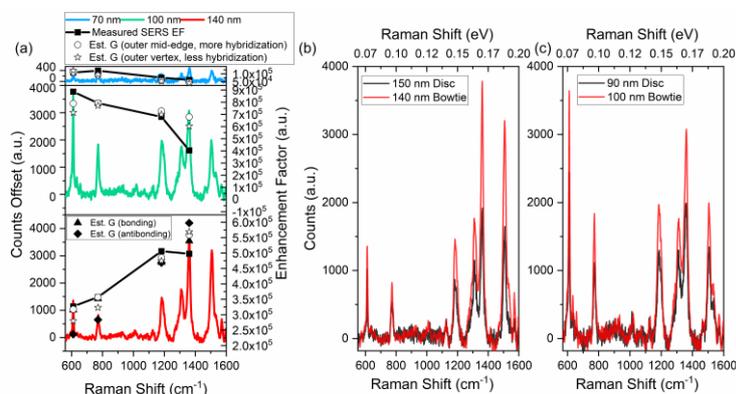
287 4-MP is also used as a probe molecule to characterize  
288 the Raman signal enhancement in addition to R6G and the  
289 results are summarized in **ESI Fig. S8, & S9**. The observed  
290 trend on the same series of nanodisc arrays follows closely  
291 those with R6G, suggesting that the enhancement provided  
292 by the nanoparticles is independent on the type of Raman  
293 dye.

294 There have been some works relating LSPR from EELS to  
295 optical measurements. For example, Husnik et al.<sup>47</sup>  
296 reported good agreement between the LSPR of gold  
297 antennas measured in EELS and optical extinction  
298 spectroscopy. Likewise, Křápek et al.<sup>48</sup> compared EELS of  
299 bowties fabricated by focused ion beam with extinction  
300 spectra of EBL fabricated bowties and showed good  
301 matching of LSPR energy for the transverse dipolar mode.  
302 The direct link between light scattering and EELS of surface  
303 plasmon excitations in metal spheres was also theoretically  
304 demonstrated by modal decomposition<sup>37</sup>. The uniqueness  
305 of our work is that we incorporated the linewidth and



**Fig. 6** Experimental EEL spectra of bowtie arrays and LSPR spatial distribution on  $\text{SiN}_x$ . (a) EEL spectra at bowtie vertices (left column) and edges (right column) show dipolar (1.5–2 eV) and quadrupolar (2–2.5 eV) modes. The extraction points of EEL spectra are also marked as black squares on the simulated electron density distribution (calculated based on 100 nm bowties with a 50 nm gap), i.e. inner vertices and edge midpoints (dashed lines), as well as outer vertices and edge midpoints (solid lines). Surface plasmon excitation at the inner regions favors antibonding dipolar configuration while the outer regions tend to hybridize the bonding and antibonding dipolar modes (represented by a plus sign of two type electron distributions), resulting in a red-shift of 0.07–0.1 eV for outer dipolar peaks. The gap distance is 20 nm and the triangle height ranges from 70 nm to 140 nm. Simulation details are included in ESI Fig. 12. The bold vertical red line and shaded area correspond to the 638 nm (1.94 eV) laser excitation and the Raman spectra collection range from 550–1800  $\text{cm}^{-1}$  (0.07–0.22 eV), respectively. (b) Dipolar LSPR peak energies vary approximately linearly with bowtie size from 70 to 220 nm measured in EELS and the resonance energy is consistently lower with  $\text{SiN}_x$  substrates than  $\text{SiO}_2$  substrates for the same structures. (c) EELS intensity map of the 140 nm bowtie at energy loss of 1.6 and 2.1 eV, showing the distribution of the dipolar (left) and the quadrupolar modes (right).

306 intensity of EELS in addition to the plasmon peak positions  
 307 to correlate and estimate Raman signal enhancement,  
 308 which leads to a practical way of optimizing nanoparticle  
 309 parameters for maximum SERS enhancement.



**Fig. 7** Raman spectra and EF of bowtie arrays and comparison with nanodisc arrays. (a) R6G Raman spectra of different size bowties and their corresponding SERS EF collected using a 638 nm laser show similar enhancement behavior to that of nanodisc arrays. The estimated G using dipolar peaks from outer vertices is similar to that from outer edge midpoints due to relatively small changes in hybridization. The bonding and antibonding dipolar modes from the outer edge midpoint of 140 nm bowties are deconvolved (ESI. Fig. S13) and the estimated G from the bonding dipolar peak shows better fitting with the measured EF than the antibonding dipolar peak. R6G Raman spectra comparison of (b) 150 nm disc and 140 nm bowtie arrays and (c) 90 nm disc and 100 nm bowtie arrays illuminated with a 638 nm laser, shows stronger signal enhancement for bowtie arrays under the same collection conditions.

310 A damped harmonic oscillator model was successfully  
 311 implemented to describe the localized surface plasmon  
 312 response in both optical spectroscopy<sup>49</sup> and EELS<sup>52</sup>, given in  
 313 the simple form of a Cauchy-Lorentz distribution. The  
 314 plasmon induced local field enhancement  $I_{Loc}$  is essentially  
 315 the polarizability of the metallic nanostructure<sup>15</sup>, which can  
 316 be derived from the amplitude of the fitted Lorentzian  
 317 function<sup>49</sup>. In combination with Equation (1), we roughly  
 318 estimated the SERS enhancement G based on the LSPR  
 319 energies of different nanodisc sizes, and compared them  
 320 with experimentally measured enhancement factors (EF) at  
 321 611  $\text{cm}^{-1}$ , 771  $\text{cm}^{-1}$ , 1181  $\text{cm}^{-1}$  and 1361  $\text{cm}^{-1}$  (Fig. 5a) using  
 322 Equation (2). EF and G are comparable in this study because  
 323 most enhancement comes from the electromagnetic field  
 324 interaction. The implementation details can be found in the  
 325 Methods section. Within the same nanodisc array, the  
 326 estimated G for different Raman emissions follows closely  
 327 the experimentally measured EF. Our estimation for  
 328 different nanodisc sizes also reflects their relative Raman  
 329 peak intensities correctly. Although our model complies  
 330 with the trend from inter- and intra-array measurements,  
 331 certain deviations may be caused by (1) uncertainty of  
 332 Raman peak intensity due to noise and autofluorescence  
 333 background; (2) far off-resonance excitation as in the case  
 334 of 150 nm nanodiscs with 532 nm laser excitation.  
 335 Nonetheless, this simple model provides unique insights  
 336 into the Raman signal enhancement from EELS data. The  
 337 experimentally measured EF in Fig. 5a & 7a are tabulated  
 338 along with reported values of related studies<sup>43–45</sup> (Table 1).  
 339 Our optimized nanodiscs show larger EF than the cited  
 340 highest values in the literature. The EF of our bowties are  
 341 also at the same level of reported values of similar  
 342 structures.

### 343 Comparison of bowtie arrays and nanodisc arrays

344 Bowtie arrays, comprised of two sets of equilateral  
 345 triangles pointing towards each other (Fig. 1b), are  
 346 expected to have stronger Raman enhancement due to the  
 347 local field confinement and a “lightning rod effect”<sup>15</sup>. They

348 were fabricated directly on TEM grids in a similar fashion as  
349 for the nanodisc arrays. Most findings from the latter are  
350 applicable to bowtie arrays. For example, larger bowtie size  
351 and support medium dielectric constant (**Figs. 6a, & b**)  
352 result in lower LSPR energy, and the larger interspacing  
353 between two pointing vertices has a small effect on red  
354 shifting the LSPR energy (**ESI Fig. S11**). However, the  
355 reduced symmetry of bowties (compared with discs) allows  
356 multiple LSPR modes that can be excited by the electron  
357 beam due to the delocalized response and beam  
358 broadening effects<sup>53</sup>. **Fig. 6a** shows EEL spectra of different  
359 bowtie sizes on SiN<sub>x</sub> membranes, extracted from the  
360 corresponding black square marked locations of the  
361 simulated charge density map. The dipolar peaks from  
362 outer regions (away from the gap, solid lines) are  
363 approximately 0.07–0.1 eV lower than those from inner gap  
364 regions (dashed lines) because of hybridization of bonding  
365 and anti-bonding dipole configurations<sup>54</sup>. At inner-gap  
366 vertices only the anti-bonding dipolar mode is excited as  
367 indicated by the electron density distributions<sup>27,55</sup>. The peak  
368 positions of bonding and antibonding dipolar modes of 140  
369 nm bowties are spectrally visible at 1.54 and 1.64 eV  
370 respectively (**Fig. 6a**) and subsequently fitted using two  
371 Voigt functions (**ESI Fig. S13**). An additional transverse  
372 dipolar mode at even lower energy is reported for focused-  
373 ion beam fabricated bowties comprised of right triangles  
374 when excited at outer vertices<sup>48</sup>, but not observed here due  
375 to the symmetry of equilateral triangles. Interestingly,  
376 nanodiscs and bowties of similar size also have roughly  
377 similar LSPR energies (**Fig. 3a, & 6a**). Additional results on  
378 dipolar LSPR energies as a function of bowtie size from 70  
379 nm to 220 nm are plotted in **Fig. 6b** for structures on SiN<sub>x</sub>  
380 and SiO<sub>x</sub> substrates. Just like nanodisc arrays, the LSPR  
381 energy of the same structures is higher on the SiO<sub>x</sub> than on  
382 the SiN<sub>x</sub> substrates due to the difference in dielectric  
383 constants.

384 An additional mode at energy loss 2.0–2.5 eV in **Fig. 6a**  
385 when excited at the midpoints of inner edges can be  
386 attributed to a quadrupolar configuration<sup>27</sup>. **Fig. 6c** shows  
387 the spatial distribution of the dipolar LSPR mode (at 1.6 eV)  
388 and dark quadrupolar LSPR mode (at 2.1 eV) in a 140 nm  
389 bowtie extracted from an EELS spectrum image. These  
390 results show that the strongest dipolar modes reside on  
391 triangle vertices while the quadrupolar modes primarily  
392 reside along the sides of the bowties. More detailed  
393 discussion of different plasmon modes in triangular arrays  
394 can be found in the previous study by Koh et al.<sup>27</sup>

395 The Raman enhancement behavior from dipolar surface  
396 plasmons is similar for both bowties and nanodiscs, as  
397 illustrated by the Raman spectra (**Fig. 7a**) collected using a  
398 638 nm laser for different size bowties on a SiN<sub>x</sub> substrate.  
399 100 nm bowtie arrays have overall strongest signal  
400 enhancement due to close match between the incident  
401 laser energy and dipolar LSPR energy. The quadrupolar  
402 mode is believed to be a dark mode<sup>26,27</sup> and thus should  
403 have insignificant effect on Raman signal enhancement (**ESI**  
404 **Fig. S14**). The measured EF of four Raman emissions are also

405 plotted in **Fig. 7a**. Using the same damped harmonic  
406 oscillator model, the calculated enhancement G based on  
407 the less hybridized dipolar surface plasmon peaks on outer  
408 vertices deviates away from the EF at small wavenumbers  
409 (611 cm<sup>-1</sup>), while it agrees better at large wavenumbers  
410 (1361 cm<sup>-1</sup>) compared with that based on the more  
411 hybridized plasmons on the corresponding outer edge  
412 midpoints for the 100 nm bowties. Overall, G from outer  
413 vertices does not differ much from outer edge midpoints  
414 due to relatively small changes in hybridization. However, a  
415 preliminary estimation of G from the bonding dipolar mode  
416 shows better agreement with experimentally measured EF  
417 than that from the antibonding dipolar mode for 140 nm  
418 sized bowtie arrays (**Fig. 7a**) based on the fitted peaks in **ESI**  
419 **Fig. S13** (details in Methods), suggesting that the bonding  
420 dipolar mode is the dominant factor for enhancement  
421 under the laser excitation. This is reasonable because the  
422 antibonding mode is a dark mode and therefore would not  
423 be efficiently excited with a laser. Besides, the electric field  
424 in the gap is only strongly enhanced by the bonding dipole  
425 mode, but not the antibonding mode<sup>56</sup>. Hence, the  
426 measured EF would mainly reflect bonding mode behavior.  
427 Future studies can aim to further test the relation of SERS  
428 EF and estimated G from antibonding dipolar, transverse  
429 and longitudinal dipolar, and other surface plasmon modes  
430 using higher energy resolution STEM-EELS and polarized  
431 Raman spectroscopy on less symmetric nanostructures.

432 A rough comparison of Raman spectra between  
433 approximately similar sized nanodisc and bowtie arrays  
434 under the same illumination conditions (**Fig. 7b, c**) shows  
435 higher signal enhancement for bowtie arrays due to the  
436 stronger electric field near the sharp vertices, given that  
437 their LSPR energy difference is small. Similar behavior is also  
438 observed in other geometric configurations such as  
439 plasmonic heterodimers for SERS hotspots<sup>57</sup>, where the  
440 separation gap is extremely small (< 5 nm). However, the  
441 shape effect on Raman signal enhancement is weaker for  
442 small size arrays (**Fig. 6c**) than that for large size arrays (**Fig.**  
443 **6b**), possibly due to the decline of fabrication quality as  
444 nanostructure features become smaller.

## 445 Conclusions

446 In summary, we have systematically varied gold  
447 nanoparticle size, interspacing and shape using electron  
448 beam lithography fabrication, and showed that these  
449 nanoparticle parameters as well as local dielectric  
450 environment affect surface plasmon resonance.  
451 Nanoparticle size plays the most important role in fine-  
452 tuning the resonance energy. Pointed structure shapes  
453 have stronger field confinement and therefore strongly  
454 enhance the Raman signal. By correlating LSPR energies  
455 from EELS with Raman peaks from laser excitation, we  
456 demonstrate that the Raman signal is most strongly  
457 enhanced when the illuminating laser energy is close to and  
458 slightly higher than the LSPR energy, as in the case of 90 nm  
459 nanodisc arrays measured with a 638 nm laser. Using

460 monochromated STEM-EELS, this study brings insight from  
 461 nanometer level spatial distribution of localized surface  
 462 plasmons to far-field surface enhanced Raman  
 463 spectroscopy. We anticipate that the techniques and  
 464 correlations demonstrated in this study will provide a set of  
 465 tools and guidelines to optimize Raman signal enhancement  
 466 in real applications such as nanomedicine for cancer  
 467 diagnostics and treatment<sup>11,13</sup>.

## 468 Methods

### 469 Nanostructure array fabrication

470 TEM grids with SiN<sub>x</sub> and SiO<sub>x</sub> membranes (Ted Pella Inc.,  
 471 35 nm thick) were first plasma cleaned to remove potential  
 472 organic contaminants. They were then adhered to a piece  
 473 of silicon wafer using polydimethylsiloxane and spin coated  
 474 with 2% 950 kDa PMMA (E-beam resist) in anisole at 2500  
 475 rpm followed by baking for 5 min at 180 °C. The samples  
 476 were loaded near the center of a slot holder and a JEOL JBX  
 477 6300 E-beam lithography system (JEOL, Ltd, Japan) was  
 478 operated as a scanning electron microscope (SEM) to locate  
 479 the small electron transparent windows. To limit random  
 480 electron exposure on the patterning area, the stage  
 481 positions of two opposite corners of the grid were carefully  
 482 found to roughly calculate the coordinates of the grid  
 483 center. The lithography system was then switched to  
 484 pattern writing mode with a 100 kV 500 pA beam and an  
 485 average dose of 2000 μC/cm<sup>2</sup>. The overall pattern  
 486 resolution is approximately 9 nm. The patterns of nanodisc  
 487 and bowtie arrays with different size and spacing were  
 488 described in a proprietary format from JEOL and rendered  
 489 into exposable files using BEAMER software (GenlSys  
 490 GmbH, Germany). After lithography, the samples were  
 491 submerged in a 1:3 methyl isobutyl ketone/2-propanol  
 492 solution for 30 s to selectively dissolve the patterned region  
 493 while keeping the remaining PMMA intact as a mask for  
 494 metallization. The samples were then rinsed in 2-propanol  
 495 and blown dry with compressed air. To avoid the damping  
 496 effect of a metallic adhesion layer, an organic alternative,  
 497 (3-mercaptopropyl) trimethoxysilane (MPTMS) was applied  
 498 by vapor deposition<sup>32</sup>. Gold depositions were performed in  
 499 a Kurt J Lesker E-beam evaporator, and film thickness of  
 500 roughly 30 nm was reported by a crystal monitor. A lift-off  
 501 process was carried out in an acetone bath to strip away the  
 502 PMMA mask and leave only the Au in the patterned  
 503 (unmasked) region. Samples were rinsed in deionized water  
 504 and dried with compressed air.

### 505 Electron energy loss spectroscopy

506 STEM-EELS spectrum images were collected in an image  
 507 C<sub>s</sub> corrected monochromated FEI Titan (Thermo Fisher  
 508 Scientific, USA) at 300 kV with a Gatan Image Filter (GIF)  
 509 Quantum (Gatan, Inc, USA) EEL spectrometer. The  
 510 microscope was operated in STEM mode at a spot size of 11  
 511 with a C2 aperture of 150 μm and a C3 aperture of 50 μm,  
 512 resulting in a convergence semi-angle of 8.4 mrad and an

513 estimated beam size of 0.5 nm in diameter. The GIF  
 514 Quantum was operated in EELS mode with a 2.5 mm  
 515 entrance aperture and a camera length of 38 mm  
 516 (corresponding to a collection angle of 18.3 mrad). EELS  
 517 maps were collected with a 2 nm pixel size and 0.01  
 518 eV/channel dispersion over a typical 100 × 100 array. The  
 519 full width at half maximum (FWHM) of the zero loss peak  
 520 (ZLP) was measured to be from 0.13 to 0.2 eV throughout  
 521 the experiments. Spectral collection time was selected to  
 522 maximize the signal without saturating the EELS detector,  
 523 which is about 2 ms dwell time for this system.

### 524 Surface enhanced Raman spectroscopy

525 All samples were submerged in a 0.1 mg/mL aqueous  
 526 solution of Rhodamine 6G (R6G) or 4-mercaptopyridine (4-  
 527 MP) overnight, rinsed in deionized water and blown dry  
 528 with compressed air. Raman spectroscopy was performed  
 529 on a Horiba XploRA+ system using a 100X objective lens to  
 530 focus the laser beam to the smallest possible spot (~2 μm),  
 531 which is roughly the same as the nanostructure array size.  
 532 An output power of 0.6 mW for the 532 nm laser, 1.7 mW  
 533 for the 638 nm laser, and 8 mW for the 785 nm laser were  
 534 carefully chosen to avoid ablation (described in SI Fig. 7)  
 535 while still maintaining reasonable signal to noise ratio.  
 536 Spectral acquisition time was optimized accordingly, and  
 537 each spectrum was accumulated three times to reduce  
 538 noise and artifacts. Raman spectra were not normalized,  
 539 but the comparison was based on the same acquisition  
 540 conditions. The enhancement factor (EF, a ratio of surface  
 541 enhanced Raman intensity to the control sample Raman  
 542 intensity) for rhodamine 6G (R6G) was calculated using the  
 543 following formula:

$$EF = \left( \frac{I_{SERS}}{I_{bulk}} \right) * \left( \frac{N_{bulk}}{N_{surf}} \right) \quad (2)$$

544 Where  $I_{SERS}$  and  $I_{bulk}$  are the measured peak intensities in  
 545 the SERS and control Raman spectra of R6G respectively.  
 546  $N_{bulk}$  and  $N_{surf}$  are the number of molecules under laser  
 547 illumination for the bulk and SERS sample, respectively. In  
 548 our setup, the bulk sample is 10 mg/mL R6G water solution  
 549 in a cuvette with 1 mm optical path (Raman spectrum in ESI  
 550 Fig. S4). The laser spot is estimated as a 2 μm diameter  
 551 circle, therefore  $N_{bulk}$  is roughly  $4 \times 10^{10}$  molecules. It is  
 552 reported that the average surface density of R6G in densely  
 553 packed monolayers is approximately  $4 \times 10^{-11} \text{ mol/cm}^2$   
 554<sup>58</sup>, thus we estimated  $N_{surf}$  on the  $2 \mu\text{m} \times 2 \mu\text{m}$  array to  
 555 be  $10^6$ . Although recent work demonstrated STEM-EELS  
 556 could be used to map the adsorbed surface molecules<sup>59</sup>, it  
 557 is difficult to achieve for Raman dyes because these organic  
 558 molecules are known to aggregate and build up as carbon  
 559 contamination when exposed to an electron beam.

560 The fluorescence background of measured Raman  
 561 spectra were fitted as polynomial functions and  
 562 subsequently removed using a MATLAB script<sup>60</sup>, before  
 563 extracting the peak intensities to compute the

564 enhancement factors. The script is available online at  
565 <https://github.com/michaelstchen/modPolyFit>.

### 566 Hyperspectral data processing

567 EEL spectrum images were analyzed in Gatan  
568 Microscopy Suite (GMS) 3 (Gatan Inc.). The reflected tail  
569 method implemented in the software was used for zero loss  
570 peak (ZLP) subtraction. EEL spectra were normalized with  
571 respect to the ZLP maximum intensity. EELS intensities at a  
572 particular energy loss were plotted in a colormap using a  
573 MATLAB script. Spectrum images were imported into  
574 MATLAB using a modified version of the algorithm available  
575 online at  
576 [https://www.mathworks.com/matlabcentral/fileexchange/](https://www.mathworks.com/matlabcentral/fileexchange/29351)  
577 [/29351](https://www.mathworks.com/matlabcentral/fileexchange/29351).

### 578 EELS simulation

579 EELS simulations were calculated using the MNPBEM  
580 toolbox<sup>34</sup> with the retarded approximation, similar to a  
581 previously reported approach<sup>20</sup>. These calculations utilized  
582 electron beam parameters consistent with the experiment,  
583 including an energy of 300 keV and a probe diameter of 0.5  
584 nm. EEL spectra were calculated using an electron beam  
585 positioned at similar locations as those used in the  
586 experiment and with an energy step of 0.01 eV. The Au  
587 nanodisc arrays were modelled as a nine disc array  
588 positioned on top of a substrate layer. The number of discs  
589 in the array was limited to nine because of computational  
590 limitation. However, it was found that a nine-disc array was  
591 sufficient for the simulation to closely match the  
592 experimental observation. Additionally, increasing the  
593 array size from four to nine discs had very minor effects on  
594 the simulated results, suggesting that nine discs are  
595 sufficient for capturing the behaviour of EELS signals from  
596 these samples. The geometry of the Au disc array models,  
597 for example the disc diameter and disc spacing, were  
598 created to be consistent with STEM observations. The single  
599 discs were generated from a 20-sided polygon positioned  
600 on top of a 35 nm thick layer of SiN<sub>x</sub> or SiO<sub>x</sub>. Energy-  
601 dependent dielectric values adapted from literature were  
602 used for Au<sup>61</sup>. A dielectric constant of 4.2 and 2.1 were used  
603 for the SiN<sub>x</sub> and SiO<sub>x</sub> substrates, respectively. The bowtie  
604 models were created from two triangular shaped plates  
605 that had a thickness of 30 nm, a length of 100 nm, and a  
606 corner radius of 10 nm, similar to the experimentally  
607 observed structures. The bowtie was given a 50 nm gap and  
608 placed on a 35 nm thick SiN<sub>x</sub> substrate. The surrounding  
609 medium for all models used a vacuum dielectric constant of  
610 1.

611 To simulate the spectral broadening caused by the  
612 experimental EELS energy resolution, simulated spectra  
613 were convolved with a Lorentzian function at a full width  
614 half maxima between 0.13 and 0.2 eV that was measured  
615 from the corresponding experimental data. Simulated EELS  
616 maps, such as those shown in **Figs. 2d-e**, were calculated in  
617 the area around the central disc of a 9 disc array. Then the  
618 simulated map was reproduced 4 times to make it more

619 comparable to the experimentally mapped areas. To help  
620 interpret the experimentally measured LSPR modes, the  
621 complex charge distribution for each mode was studied.  
622 Both the real and imaginary parts of the complex charge  
623 distributions were calculated for each mode, but only the  
624 imaginary part of the charge distribution is presented here,  
625 following previous studies<sup>20,62</sup>.

### 626 Damped harmonic oscillator model

627 Electron energy loss  $\Delta E$  can be computed from the work  
628 performed by the electron against the induced electric  
629 field  $E_{ind}$ <sup>63</sup>  
630  $\Delta E = e \int v \cdot E_{ind}[r(t), t] dt = \int \hbar \omega \Gamma_{EELS}(R, \omega) d\omega$ ,  
631 where  $v$  is the speed of electrons,  $r(t)$  denotes the time  
632 dependent position function and the loss probability  
633  $\Gamma_{EELS}(R, \omega) = \int \mathcal{R}e\{e^{-i\omega t} v \cdot E_{ind}[r(t), \omega]\} dt$  is the work  
634 done by electrons in Fourier space with  $\omega$  being their  
635 frequency. That is, the amplitude of EEL spectra is related  
636 to the local induced electric field. Moreover, it has recently  
637 been shown that in systems with translational invariance  
638 along the direction of electron motion, the electron energy  
639 loss probability is proportional to the photonic local density  
640 of states<sup>64</sup>, the property of which again has been proven to  
641 be proportional to the local field intensity normalized by the  
642 absorbed power<sup>65</sup>. Considering that a damped harmonic  
643 oscillator can be used to model the local field enhancement  
644 in optical studies<sup>49</sup>, we therefore use a similar approach to  
645 describe the LSPR response in EELS given by

$$I(\omega) = \frac{A}{(\omega - \omega_p)^2 + \left(\frac{\Gamma}{2}\right)^2} \quad (3)$$

646 where  $I(\omega)$  is the frequency dependent polarizability of the  
647 oscillator, which we also take as the local field  
648 enhancement in this context<sup>15,49</sup>.  $A$  is a proportionality  
649 factor,  $\omega_p$  is the plasmon frequency, and  $\Gamma$  is the FWHM of  
650 the resonance, which is a measure of the total damping of  
651 the system. One of the challenges when applied in EELS is  
652 the instrument broadening effects on the resonance  
653 linewidth  $\Gamma$  due to the non-monochromaticity of the  
654 electron source. Here we used Olivero and Longbothum's  
655 empirical approach<sup>52,66</sup> by assuming the ZLP is a Gaussian  
656 function and the LSPR follows a Lorentzian profile.

$$\Gamma_V = 0.53\Gamma_L + \sqrt{0.22\Gamma_L^2 + \Gamma_G^2} \quad (4)$$

657 where  $\Gamma_V$  is the FWHM of the convolved surface plasmon  
658 peak which produces a Voigt profile,  $\Gamma_G$  is the FWHM of the  
659 ZLP and  $\Gamma_L$  is approximately the original surface plasmon  
660 linewidth. The convolved plasmon peak was fitted into a  
661 Voigt profile using OriginPro software to obtain  $\Gamma_V$  values.  
662 (For bowties, both the bonding and antibonding dipolar  
663 surface plasmon peaks were fitted and each peak was  
664 analyzed separately using the same method as the  
665 following). The calculated LSPR linewidth along with the  
666 resonance energy were then inserted into Equation (3) to  
667 estimate the local field enhancement. Although the surface

668 plasmons driven by electrons are different from those by  
 669 plane waves, the differences are more related to the spatial  
 670 distribution of hotspots<sup>67,68</sup>. In our study as well as other  
 671 published work that correlate optical and EEL  
 672 spectroscopy<sup>69,70</sup> where traditional hotspots are not  
 673 considered, the localized surface plasmon resonance for  
 674 disperse nanoparticles are reasonably similar in both types  
 675 of excitation. Therefore using Equation (1), the  
 676 electromagnetic SERS enhancement G can be roughly  
 677 estimated from EEL spectra as  $I(\omega_L)I(\omega_R)$ , where  $\omega_L$  is the  
 678 laser excitation frequency and  $\omega_R$  is the Raman peak  
 679 frequency. To directly compare the measured SERS EF and  
 680 the estimated G from EELS in Fig. 5a, a scaling constant  $k$  is  
 681 applied to our estimated G by minimizing the sum of the  
 682 squares of the difference between measured EF and  
 683 estimated G.

## 684 Conflicts of interest

685 There are no conflicts to declare.

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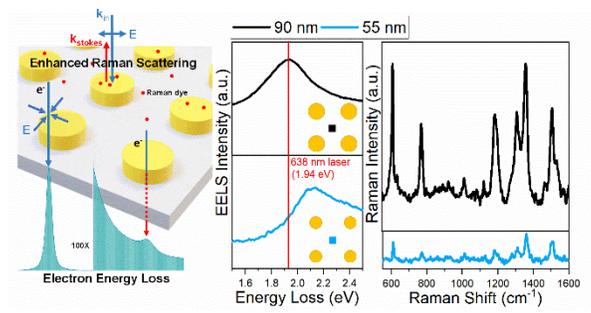
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**Correlation of surface plasmon resonance and surface enhanced Raman scattering:** maximum enhancement achieved when excitation laser match with plasmon resonance.