

Label-free super-resolution stimulated Raman scattering imaging of biomedical specimens

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Abstract: Far-field super-resolution microscopy has unravelled the molecular machinery of biological systems that tolerate fluorescence labelling. Conversely, stimulated Raman scattering (SRS) microscopy provides chemically selective high-speed imaging in a label-free manner by exploiting the intrinsic vibrational properties of specimens. Even though there were various proposals for enabling far-field super-resolution Raman microscopy, the demonstration of a technique compatible with imaging opaque biological specimens has been so far elusive. Here, we demonstrate a single-pixel-based, combined with robust structured illumination, that enables super-resolution in SRS microscopy. The methodology is straightforward to implement and provides label-free super-resolution imaging of thick specimens, therefore paving the way for probing complex biological systems when exogenous labelling is challenging.

1. Introduction

Far-field super-resolution imaging has emerged as a powerful tool in biology to unravel the details of the complex molecular machinery at play at the nanoscale. However, the great majority of super-resolution techniques are based on exogenous markers (fluorophores) that demand chemical preparation protocols and further studies to determine cell viability and specificity to a targeted molecule. Most importantly, fluorescence-based tools only report on the fluorophore information – dynamical or structural – leaving open many fundamental questions on the other outnumbering unlabelled molecular species: e.g., lipids and cholesterol molecular conformation and local composition [1–3] within lipid domains have remained undetected in real cells, or the local composition of the species forming membrane-less organelles which are currently unknown [4, 5]. Therefore, Raman microscopies have emerged as ideal tools for probing heterogeneous biological specimens [6], since they provide chemically resolved images using the intrinsic vibrational properties of molecules, that is, a label-free method. Yet, reaching fast super-resolution capabilities for opaque tissue imaging with Raman contrasts has remained challenging [7].

In the last decade, many attempts have been made to enable vibrational far-field super-resolution in SRS. Computational super-resolution methods, exploiting structured illumination microscopy (SIM), have been demonstrated for the spontaneous Raman contrast [8]. However, the usage of an imaging spectrometer is not compatible with thick tissues, as the resolution enhancement is only provided in one dimension, and the acquisition speeds are too slow for dynamic specimens. Very recently, a solution to this issue has been put forward, but the imaging methodology is still based on a wide-field geometry, potentially challenging to be applied in opaque specimens [9]. Alternatively, coherent Raman microscopies (CRM) could provide fast acquisition speeds: with the two most known contrast mechanisms being Coherent anti-Stokes Raman scattering (CARS) [10] and stimulated Raman scattering (SRS) [11–13]. However, there are various drawbacks that preclude biological specimens super-resolution imaging, in particular methods exploiting coherent control of vibrational dynamics [14–25]. Furthermore, in CARS, interference artifacts complicate chemical quantification analysis [26, 27]. In the case of the background-free

47 SRS process, the current mainstream is to exploit methods to control the dynamics of vibrational
48 energy levels, however using unconventional power levels that may be phototoxic for biological
49 specimens [20, 21, 23, 24, 28–31].

50 While combining computational super-resolution methods with SRS technology could over-
51 come the above-mentioned issues, it cannot provide super-resolution capabilities in thick opaque
52 tissues. Generally, the mathematical framework of computational methods is based on wide-field
53 illumination which itself requires multi-pixel cameras. Unfortunately, wide-field cameras for
54 SRS are technologically challenging because of SRS’ unconventional detection scheme: SRS
55 requires high-sensitivity radio-frequency lock-in amplifier (RF-LIA), which currently is only
56 reliable in a single-pixel scheme. Despite recent developments of multi-pixel RF-LIA [32, 33],
57 the pixel counts do not scale favorably for 1000’s of pixels architecture needed in a camera.
58 Furthermore, wide-field illumination is not suitable for thick tissue imaging due to the lack of
59 sectioning capabilities: even if a camera did exist for using computational methods with SRS, it
60 would be challenging to use due to aberrations and out-of-focus light generated by the solvent or
61 the sample itself.

62 To address these challenges, we present a camera-less (aka single-pixel) chemically selective
63 super-resolution imaging methodology compatible with opaque thick biological specimens.
64 We are interested in demonstrating that this methodology indeed breaks the diffraction-limit
65 resolution barrier of SRS microscopy. We start by describing the mathematical model used in
66 the acquisition step, followed by a proof-of-principle aimed at demonstrating resolution beyond
67 the theoretical diffraction limit. We then finalize demonstrating that its sensitivity is compatible
68 with imaging biological specimens. Remarkably, the framework presented here has a simple
69 alignment procedure: it is simpler than conventional SRS microscopy, which demands overlap of
70 two tightly focused beams.

71 2. Concept

72 Specifically, we developed a single-pixel scheme (Fig. 1) compatible with computational super-
73 resolution methods, therefore allowing for fast imaging capabilities exploiting SRS processes in
74 the form of stimulated Raman gain (SRG) (Fig. 1a). In our arrangement, a structured stationary
75 pump beam is shaped using a spatial light modulator (SLM) and is spatially and temporally
76 overlapped with a focused Stokes beam that scans over the sample (using a set of galvanometric
77 mirrors, Fig. 1b). After acquiring a series of SRS images with multiple structured illuminations
78 (Fig. 1c) the data is treated with algorithms based on standard SIM mathematical framework to
79 recover a super-resolved image [34, 35], as described below. We coin the method Single-pixel
80 blind-SIM SRS (or blind-S³ for short).

81 We describe the forward model of the acquisition procedure. In SRS, the signal detected
82 (ΔI_S), a modulation transfer between the Pump and Stokes beams, at one pixel location (of the
83 un-processed image) is given by [12]:

$$\Delta I_S \propto \Im\{\chi^{(3)}\} I_P I_S \quad (1)$$

84 where $\Im\{\chi^{(3)}\}$ is the imaginary part of the complex-valued nonlinear susceptibility of the sample
85 (related to the Raman cross-section), I_P and I_S the intensity of the Pump and Stokes beam,
86 respectively. In the case of the proposed acquisition method in blind-S³, a static speckle pattern
87 generated by the Pump beam spreads at the sample image plane where the Stokes beam is focused
88 and scanned. To derive an image formation model, we assume a scalar approximation for the
89 local intensity in one blind-S³ image:

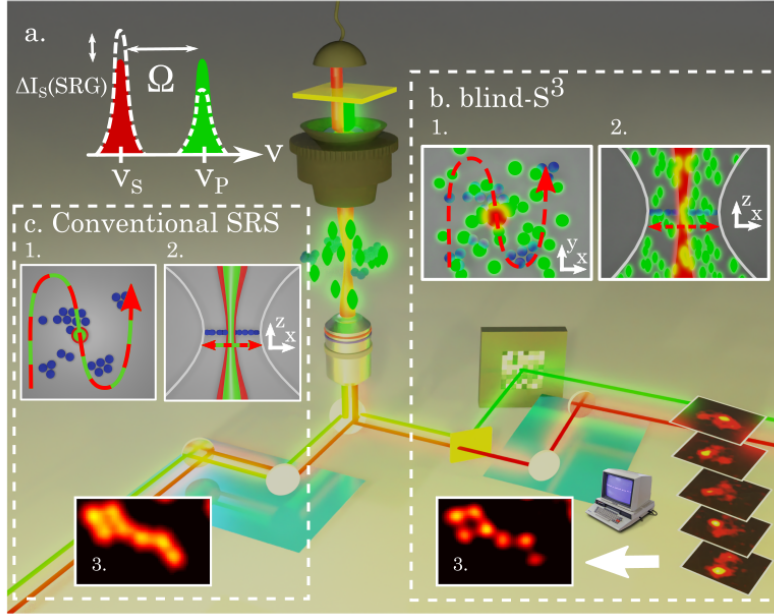


Fig. 1. Principle of blind-S³. Schematic of the setup to achieve super resolution using the SRS process stimulated Raman Gain (SRG) (a) based on a single-pixel SIM scheme. Transverse (b1) and longitudinal (b2) planes of the scanning Stokes beam trajectory (red dash) over the stationary Raman-active specimen (blue) and structured Pump (green), in this case a speckle pattern. For every speckle realization, an SRS image is acquired forming an image stack that is passed to a SIM algorithm to reconstruct a super-resolved image (b3). (c) Conventional SRS, consisting in raster scanning co-propagating Pump and Stokes beams, is used as a control to demonstrate the increase in resolution when compared to standard imaging. Transverse (c1) and longitudinal (c2) planes of the Stokes and focused Pump beams (green and red dash) scanning trajectory over the stationary Raman-active specimen (blue).

$$\begin{aligned} \Delta I_S(x, y) &\propto \iint \mathfrak{I}\{\chi^{(3)}(x', y')\} I_P(x', y') I_S(x - x', y - y') dx' dy' \\ &\propto \left(\mathfrak{I}\{\chi^{(3)}\} I_P \right) \circledast I_S, \end{aligned} \quad (2)$$

90 An image acquired with blind-S³ scheme obeys a forward model of the type $M_i = (O \times$
91 $I_{SIM}) \circledast I_{Stokes}$, where M_i is an SRS image from a single speckle realization, O is the optical
92 response of the excited object (more precisely, $\mathfrak{I}\{\chi^{(3)}\}$), I_{SIM} is the spatial distribution of the
93 structured intensity at the Pump wavelength, I_{Stokes} is the effective PSF of the image formation
94 system, and \circledast denotes a convolution operation. This means that each single image acquired
95 follow the standard forward models in computational super-resolution frameworks of incoherent
96 processes. We chose to work with non-sinusoidal SIM patterns in order to be compatible with
97 thick tissues: we use speckle patterns, since they are resilient in scattering specimens. While we
98 tested the methodology with two SIM algorithms using no prior knowledge on the structured
99 patterns I_{SIM} [34, 35], for the results presented we used the one described in Ref. [35]. In this
100 approximation, we disregard coherent effects as SRS processes are inherently phase-matched.

101 **3. Experimental**

102 *3.1. Microscope design and details*

103 Briefly, the output power of a femtosecond laser source (Coherent, Chameleon Ultra Vision,
104 800 nm, 80 MHz repetition rate, 150 fs pulse length) pumps an optical parametric oscillator (APE,
105 MIRA-OPO) that generates the Stokes beam, centered either at 1058 nm (Fig. 2, 3054 cm^{-1}
106 Raman-shift) or 1042 nm (Fig. 4, 2903 cm^{-1} Raman-shift), and a small power fraction is used
107 as the Pump beam. The Stokes beam is spectrally narrowed using a combination of grating
108 (LightSmyth, T-1000-1040) and adjustable slit width for the purpose of increasing chemical
109 selectivity. The Pump beam is also spectrally narrowed in a pulse-shaper setup using two gratings
110 (LightSmyth Technologies, T-1400-800) and a digital micromirror device (DMD) placed in
111 the Fourier plane (a description of the methods using DMDs for SRS spectroscopy can be
112 found in Ref. [36]). The pump beam is amplitude-modulated at 1 MHz by an acousto-optic
113 modulator (AA Opto-electronic, MT80-B30A1,5 VIS). The specimen is z-displaced using a
114 piezo stage (Thorlabs, DRV517), and the signal generated by the sample is then collected by a
115 1.4 NA oil-immersion condenser, directed to a large-area detector (Thorlabs, DET100A2) and
116 demodulated by a lock-in amplifier (Zurich Instruments, MFLI).

117 We used two configurations for SRS microscopy. Regardless of the configuration used, both
118 beams are spatially and temporally combined at dichroic mirrors, whose location depends on the
119 modality of SRS in use, and focused by an objective (Nikon, Plan APO IR, 60x, NA=1.27). To
120 achieve the best compromise in terms of resolution enhancement (by having the Pump beam
121 as a structured illumination) and sensitivity (by having the Stokes beam as the demodulated
122 beam), we have designed a layout that allows us to quickly swap the direction of the Pump beam
123 between the conventional SRS or blind-S³ configurations using a combination of a half-wave
124 waveplate and a polarizing beam splitter cube. For the blind-S³ configuration, the Pump beam is
125 sent onto a SLM (Meadowlark Optics, HSP512L-1300) to modulate the wavefront with a random
126 phase. The SLM throughput is higher than 80% but it could be further enhanced by replacing the
127 SLM by engineered diffusers since they have no absorption. Galvanometric mirror scanners are
128 used to move either Pump and Stokes beams together (conventional) or Stokes only (blind-S³).
129 Typical average power measured before the objectives were 13 mW (conventional) and 41 mW
130 (blind-S³) for the Pump, and 25 mW for the Stokes beams. However, we note that the energy
131 density levels used for blind-S³ are inherently lower than the conventional SRS configuration:
132 we have estimated a 5 times lower effective energy densities (i.e. product of the energy densities
133 of the Pump and Stokes energy densities), taking into consideration the speckle envelope and
134 the longer integration time in the blind-S³ procedure, when compared to conventional method.
135 Finally, after imaging in conventional SRS and blind-S³, we image a large FOV to detect any
136 sign of phototoxicity such as shown in the wide FOV images of the biological specimens.

137 *3.2. Sample preparation*

138 Samples presented in Fig. 2 were prepared by drop-casting the polystyrene beads on a coverslip
139 and embedded in deuterated water to decrease the spectral congestion with the water vibrational
140 response background. The various diameters (and standard deviation) used were: 239 nm (6 nm,
141 PS Research Particles), 372 nm (10 nm, Polysciences, Inc.), 520 nm (16 nm, Thermo Scientific),
142 740 nm (22 nm, Thermo Scientific) and 990 nm (30 nm, Polysciences, Inc.). Mice brain slices
143 were kindly provided by Laurent Bourdieu and experimental procedures were conducted in
144 accordance with the institutional guidelines and in compliance with French and European laws
145 and policies. All procedures were approved by the ‘Charles Darwin’ Ethics Committee (project
146 number 26667). More precisely, 6-months old C57BL6 male mice were sacrificed, the extracted
147 brain was then stored overnight in a solution of 4% paraformaldehyde and finally rinsed in
148 phosphate buffer solution (PBS). Coronal slices of thickness 100 μm were then cut and stored in

149 PBS. Prior to experiments, the slices were placed between two cover slips with a 120- μm -thick
150 spacer. HeLa cells (ATCC) were incubated with 400 μM oleic acid, washed, fixed with 4%
151 paraformaldehyde, and stored at 4°C before imaging.

152 3.3. Resolution estimation

153 We assume that the theoretical transverse resolution results from the product of two focused
154 Gaussian beams with two different wavelengths λ_P and λ_S for the Pump and Stokes wavelength
155 respectively. Here, we use the Raman resonance 3054 cm^{-1} and the Rayleigh criteria to assess the
156 resolution limit of each beam: $\Delta r_P = \frac{1.22\lambda_P}{2NA} = 384 \text{ nm}$ and $\Delta r_S = \frac{1.22\lambda_S}{2NA} = 508 \text{ nm}$ for the Pump
157 and Stokes beam respectively where $NA = 1.27$, $\lambda_P = 800 \text{ nm}$ and $\lambda_S = 1058 \text{ nm}$. Therefore,
158 the theoretical resolution limit is $\Delta r_{SRS}^{conv} = \frac{1}{\sqrt{\frac{1}{\Delta r_P^2} + \frac{1}{\Delta r_S^2}}} = 307 \text{ nm}$ for conventional SRS while it is

$$159 \Delta r_{SRS}^{blind S^3} = \frac{\Delta r_{SRS}^{conv}}{\sqrt{2}} = 217 \text{ nm for blind-S}^3.$$

160 4. Results and discussion

161 4.1. Proof-of-concept of super-resolution capabilities beyond the diffraction limit

162 We first demonstrate the improvement in the transverse resolution, surpassing the diffraction-limit
163 of usual SRS microscopy. In order to evaluate the gain in resolution, we compare blind-S³ to
164 the conventional scanning methods. For conventional SRS, the theoretical transverse resolution
165 is $\Delta r^{Conv} = 307 \text{ nm}$. This theoretical value is technically challenging to achieve with high
166 numerical aperture (NA) objectives in the near-IR because the wavelengths of the two beams differ
167 by hundreds of nanometers (spectral span necessary for fast quantification of lipids, proteins,
168 and nucleic acids in SRS microscopy), in opposition to the visible range where diffraction
169 limited performance has been reported [37]. Conversely, blind-S³ transverse spatial resolution
170 results from the doubling in resolution dictated by SIM and the speckle grain size limited by
171 diffraction, leading to $\Delta r^{blind S^3} = 217 \text{ nm}$. To show the superior transverse resolution in
172 blind-S³, we imaged 239 nm-diameter polystyrene beads with the two modalities (Fig. 2a-b).
173 Clearly, conventional SRS (Fig. 2a) cannot resolve the beads transversely as the beads size is
174 smaller than the theoretical resolution limit. After multiple speckle pattern illuminations, we feed
175 the resulting images to a blind SIM algorithm to reconstruct a super-resolved image. Notably,
176 blind-S³ methodology (Fig. 2b) resolves several beads in the in-focus layer. The line profiles
177 reveal the distance between the centers of the beads (242 nm) which matches well to the distance
178 of close contact between two beads. We note that the effective region-of-interest (ROI) of blind-S³
179 is modulated by the speckle envelope, hence decreasing the similarity of the two images in the
180 edges of the beads cluster, yet not affecting the resolution gain (see below). The present findings
181 show that the blind-S³ methodology goes beyond the fundamental far-field diffraction-limit
182 resolution of SRS microscopy, by improving the resolution $\geq \sqrt{2}$, without addition of exogenous
183 signal enhancers and using excitation energy densities lower than conventional SRS microscopy,
184 therefore decreasing probability of nonlinear phototoxic effects.

185 Remarkably, super-resolution in blind-S³ comes with intrinsic high z-sectioning capabilities.
186 In each illumination during the blind-S³ procedure, an image is formed based on a wide-field
187 geometry model, that is, an object is convoluted with a linear point-spread function (PSF). In a
188 hypothetical conventional wide-field SRS microscope using multi-pixel cameras, the excitation
189 beams would overlap a large volume. This would in turn reduce the sensitivity due out-of-focus
190 shot-noise, therefore deteriorating image quality and resolution due to the background noise
191 (shot-noise). Conversely, the blind-S³ methodology improves sectioning, without resorting to
192 cameras, as the nonlinear optical response is local in the longitudinal direction: because SRS
193 signals are only generated within the overlap region of the two beams, each SRS image does
194 not contain appreciable out-of-focus shot-noise. To demonstrate the sectioning capabilities of

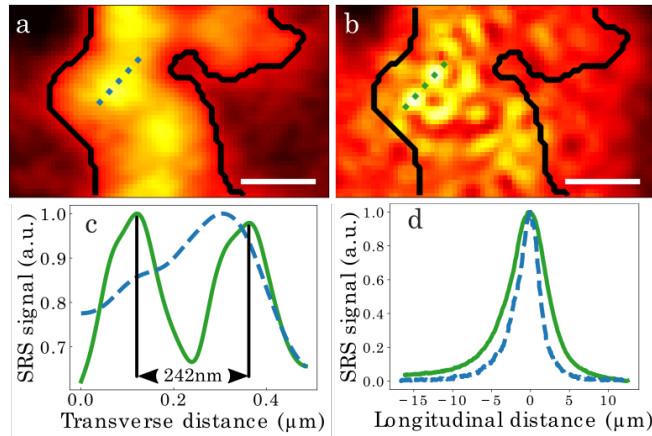


Fig. 2. Proof-of-concept of blind-S³ capabilities to image beyond the diffraction-limit. Conventional (a) and blind-S³ (b) images of 239 nm-diameter polystyrene beads, and line profiles (c) showing the increase in transverse resolution of blind-S³ (line) compared to conventional methods (dash). (d) Conventional SRS (dash) and blind-S³ (line) sectioning capabilities characterization. All scale bars: 500 nm. Pixel dwell times are 73 μ s and 300 μ s for conventional and blind-S³ methods, respectively.

195 blind-S³, we probed a thin film of oil (of few μ m) by scanning it in the longitudinal direction.
 196 Note that we collect the signal generated for each z-position on a ≈ 10 mm-wide detector, hence,
 197 not in a confocal geometry. Clearly, conventional SRS and blind-S³ give a peaked response which
 198 means that those two techniques have inherent longitudinal sectioning (Fig. 2d). Indeed, the
 199 conventional SRS microscope is able to show such z-sectioning capability, due to its nonlinear
 200 longitudinal PSF.

201 Contrary to conventional methods in super-resolution microscopy, in blind-S³ it is not
 202 straightforward to compare the reconstructed images with a "ground truth" object. This arises
 203 from the fact that the FOV in blind-S³ is modulated by the speckle envelope, which is smaller
 204 than conventional SRS microscopy. Therefore, we devised another methodology to insure if
 205 the reconstruction was indeed reaching super-resolution capabilities. We imaged commercially
 206 available calibrated polystyrene beads of various sizes, which are well-known to aggregate and
 207 form close-packed structures. Therefore, we can use the bead close contact distance as a proxy
 208 for the bead diameter. We measured the close contact distances of several beads for several
 209 sizes ranging from smaller than to several times the resolution limit, and also for two different
 210 objectives with different NAs. Although the method is somewhat subjective, we were careful
 211 to chose "spot centers" that had the smallest distances possible. Following this procedure, we
 212 noticed that maximum spot-to-spot center were indeed limited by the bead size, that is, in the
 213 360 nm bead diameter we did not see 240 nm spatial fluctuations. The outcome of this procedure
 214 is shown Fig. 3 and the agreement between the nominal bead diameter and the retrieved diameter
 215 therefore confirms that the features observed in the blind-S³ reconstructions indeed correspond
 216 to physical features beyond the diffraction limit.

217 4.2. Biological compatibility

218 To demonstrate blind-S³ compatibility with biological specimens, we image standard cell lines
 219 and mouse brain tissues. Conventional SRS reveals several μ m-large droplets within the cell in
 220 the FOV (Fig. 4a). Close-up images show different cluster morphology (Fig. 4b), and increased
 221 resolution gain with blind-S³ from the line profiles of selected ROI (Fig. 4c). To demonstrate

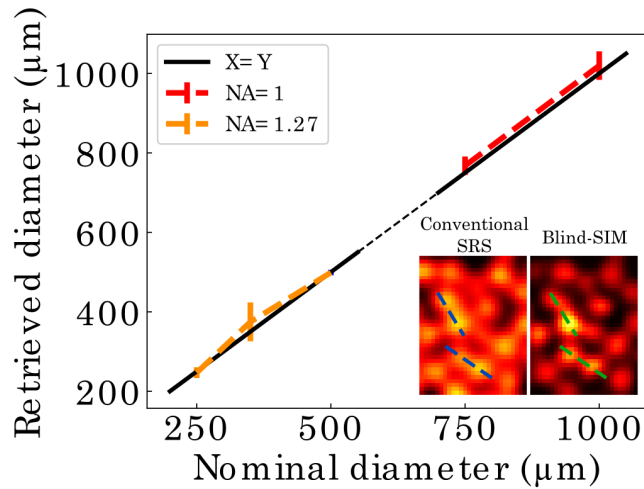


Fig. 3. Transverse resolution analysis for blind-S³. Outcome analysis of the images of various close-contact beads pairs: We use close-contact distances as a proxy for the bead diameter. The inset shows representative images used for analysis, with the dashed lines representing some of the beads chosen for evaluation.

222 capabilities for aberrant and opaque tissues, we have further imaged highly scattering brain slices
 223 at 8 μm -deep in the sample (Fig. 4d-e) with line profiles demonstrating increased resolution power
 224 of the myelin structures (Fig. 4f). The close-up images with super-resolution capabilities (Fig. 4e)
 225 reveal that the structure of the myelin in the tissue is actually not as symmetrically perfect as
 226 inferred from the low-resolution images. These results show that the method is compatible with
 227 thick tissue imaging, despite being completely opaque, a situation where using a hypothetical
 228 SRS widefield camera approach may fail due to background shot-noise.

229 We consider the effects of the idle speckle upon illumination of the sample. One potential
 230 hazardous effect is due heating. While the Stokes is point scanning, there are other regions
 231 of the speckle pattern that constantly illuminate the sample therefore potentially presenting a
 232 phototoxic effect. Here, we assume the peak power of the speckle is too weak to induce nonlinear
 233 photodamage (at least not observed in our experiments and shown by the large FOV images after
 234 the acquisition procedure), and we consider what is the temperature rise due to the small, but
 235 non-negligible, absorption of water at the pump wavelength. This is a safe assumption as the
 236 speckle power used in the experiments is spread over a region that is over 10 \times larger than the spot
 237 size of the conventional SRS imaging system: this would represent a 100 \times weaker peak power. To
 238 analyze the heat effects, we use a well-established heat propagation framework used in the context
 239 of optogenetics [38] which have shown to be accurate in previous experiments. The simulation
 240 was performed with a speckle illumination power of 1 W (20 \times higher than the experiments) and
 241 envelope size of 10 μm . Since heat-diffusion is faster than the image acquisition, the speckle
 242 grains are washed out and only the speckle envelope is important to be considered. Hence, we
 243 plot the maximum of this thermal envelope in Fig. 5 for a illumination that stopped at 10 s and a
 244 continuous one. One can see that the steady-state value saturates at 0.023 $\text{K W}^{-1}\text{MHz}^{-1}$, which
 245 corresponds to temperature rise < 0.1 K in our experiments. Note that the recently reported
 246 photothermal SRS signal [39] could be present, and therefore have a higher temperature rise
 247 than due to the Pump speckle itself. However, in the simulations above, we consider the Pump
 248 speckle envelope, which does not go through the thermal SRS effect as a whole. Furthermore,
 249 this thermal SRS heat mechanism would be highly local and quickly dissipated as the overlap of

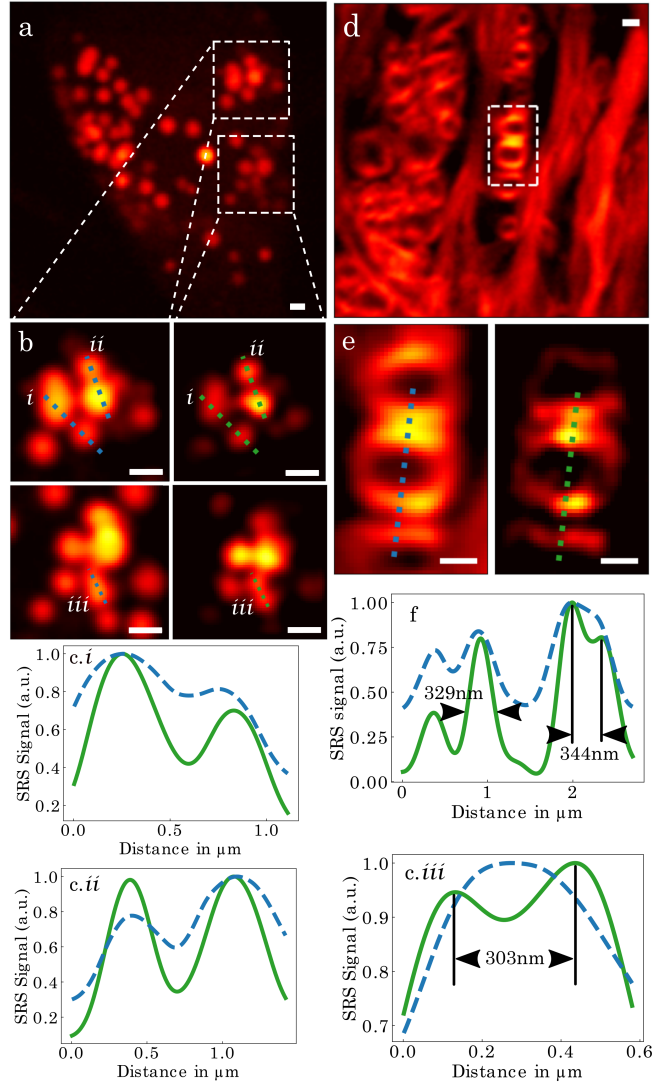


Fig. 4. Bio-compatibility capabilities of blind-S³ at reduced excitation energy densities. (a) Large FOV imaging of lipid droplets within HeLa cells (conventional SRS). Two zoomed-in ROIs (b) are depicted by dashed boxes with conventional SRS (left panels) and blind-S³ (right panels) methods, with various line profiles shown (c, i, ii and iii) for conventional SRS (dash) and blind-S³ (line). (d) Large FOV image of opaque 100 μm thick mouse cerebellum (conventional SRS). A zoomed-in ROI (e) is depicted by dashed boxes with conventional SRS (left panel) and blind-S³ (right panel) methods, with a line profile chosen (f) for conventional (dash) and blind-S³ (line) methods. All scale bars: 500 nm. Pixel dwell times are top row (bottom row), 90 μs and 180 μs (100 μs and 270 μs) for conventional and blind-S³ methods, respectively, in panel b., and 100 μs and 300 μs for conventional and blind-S³ methods, respectively, in panel e.

250 the Pump and Stokes beams is small and as we use water (fast thermal dissipation). Finally, to
 251 reduce the temperature rise due to the idle speckle illuminating the sample, one could alleviate
 252 this by conjugating the excitation speckle plane with a scanning mirror (for instance, using a

253 digital micromirror device).

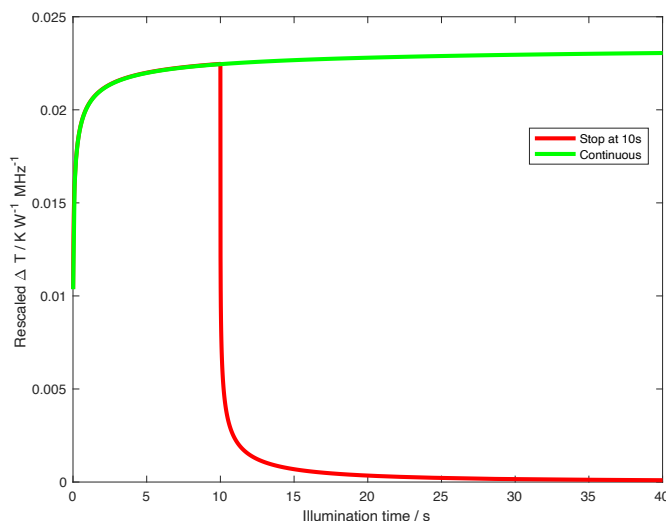


Fig. 5. Maximum temperature rise of the speckle envelope.

254 4.3. Discussion

255 Here, we have demonstrated above that the proposed method reaches resolution beyond the
256 diffraction limit. We further demonstrated that the low excitation power used ensures low
257 phototoxicity. Nevertheless, we discuss below potential issues in the methodology and how to
258 overcome them with further engineering.

259 Further technical improvements could greatly overcome current limitations in these proof-of-
260 principle experiments. In regards to speed and/or increasing the FOV, the current implementation
261 used classical frequency-domain spectral narrowing methods which have lower throughput
262 therefore limiting the largest FOV available (i.e. larger FOV requires more laser power to keep
263 the energy density constant). To address this issue, we envision an improvement using spectral
264 focusing methods, therefore increasing the FOV of the measurement as it can use all laser
265 power available. Despite these proposed follow-up improvements, the blind- S^3 technique is
266 able to super-resolve in strongly opaque biological tissues: indeed, in biomedical applications,
267 aberrations deteriorate the PSF of the microscope, perhaps explaining the lower resolution
268 attained in the biological specimens observed here. Here, while the penetration depth of brain
269 tissues was limited to $8\mu m$, with recent advances of deep SRS imaging [40], this penetration
270 depth could in principle be extended. Finally, we speculate that blind- S^3 could be a route to
271 reach far-field nanoscopy (sub-100-nm resolution). A straightforward route for nanoscopy is
272 to decrease the excitation wavelengths in the UV [37]. However, UV radiation are known to
273 enhance phototoxicity (for instance, by generating DNA photoradicals [41]). With blind- S^3 , one
274 could still use excitation lasers in the visible range, and reach resolutions below the 100-nm
275 barrier because of the structured illumination approach.

276 5. Conclusions

277 In conclusion, we have designed and demonstrated a single-pixel super-resolution technique
278 that is straightforward to implement, i.e. simpler than a conventional SRS microscope. We
279 demonstrated that this technique can image beyond the diffraction limit ($\sqrt{2}$), and that it did

280 not show phototoxic effects in biological specimens imaged. blind-S³ is an universal approach
281 in the sense that it depends neither on the specific vibrational mode ultrafast dynamics [29],
282 nor it requires vibrational signal enhancers [42, 43], or *a priori* knowledge about the specimen,
283 for instance, as gained in the training of neural networks methods [44, 45]. Therefore, these
284 achievements have overcome a decade-long challenge in SRS imaging, paving the way for
285 investigating matter in its most natural environments.

286 After the initial submission of the current work [46], an alternative computational approach
287 has been experimentally demonstrated for SRS super-resolution of biological specimens [47]
288 using deconvolution methods.

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