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Quantitative Label-Free Imaging of Lipid Domains in Single Bilayers by Hyperspectral Coherent Raman Scattering

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developed in-house to visualize lipid partitioning in single planar membrane bilayers exhibiting liquid-ordered and liquiddisordered domains. Two home-built instruments were utilized, featuring coherent anti-Stokes Raman scattering and stimulated Raman scattering modalities. Ternary mixtures of dioleoylphosphatidylcholine, sphingomyelin, and cholesterol were used to form phase-separated domains. We show that domains are consistently resolved, both chemically and spatially, in a completely label-free manner. Quantitative Raman susceptibility spectra of the domains are provided alongside their spatially resolved concentration maps.

INTRODUCTION

Lipid bilayers have been investigated for several decades to study lipid–lipid and lipid–protein interactions.¹ They serve as model systems to aid our understanding of the heterogeneous organization of cellular membranes² and in the investigation of many processes, including protein segregation in lipid domains, membrane protein function, drug–receptor interactions, and transmembrane transport. Notably, they are receiving increasing attention as building blocks in bottom-up synthetic biology approaches to creating artificial cells.³

with a quantitative unsupervised data analysis methodology

A widely investigated physicochemical phenomenon of biomimetic membranes is the liquid–liquid phase coexistence occurring when saturated lipids and sterols condense to form a liquid-ordered (L_o) phase which separates from a liquid-disordered (L_d) phase rich in unsaturated lipids.⁴ This is an important phenomenon not only from a fundamental lipid-biophysics point of view but also in relation to the highly debated lipid raft hypothesis, which postulates that cholesterol (Chol)-rich ordered domains within the plasma membrane of cells serve as platforms for protein function and associated cell signaling and trafficking events.² However, the quantitative characterization of these heterogeneous lipid domains in single bilayers is not trivial, and the presently utilized techniques have a number of drawbacks.

Atomic force microscopy (AFM) is a powerful tool to achieve nanometric topology resolution and has been utilized to distinguish the extremely small (~1 nm) height differences between L_o and L_d lipid domains in bilayers.^{5,6} As a contact-force-based method, it must be utilized on supported bilayers adhering onto a substrate. Severe drawbacks of AFM are slow imaging speed and lack of chemical specificity.

Alternatively, optical phase-contrast techniques can provide information on the optical path length and, in turn, membrane thickness when combined with appropriate quantitative analysis. Especially, wide-field imaging techniques offer fast acquisition speeds and can interrogate supported bilayers⁷ as well as suspended bilayers such as giant unilamellar vesicles (GUVs).⁸ However, these methods are also not chemically sensitive.

Domain visualization in lipid membranes can be achieved using fluorescence microscopy with a range of fluorophore-

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labelled lipids and can also feature spatial resolution below the diffraction limit (<200 nm) when combined with superresolution methods. The main limitations of this approach are photobleaching and perturbation to the native lipid behavior by the addition of the fluorescent moiety. For example, it has been shown that many raft-preferring lipids (e.g., sphingolipids and sterols), whose domain preference results from their molecular architecture, do not partition into ordered phases if fluorescently labelled, in contrast to their native counterparts.⁹ Incorporation of these labels into the bilayer structure may significantly perturb lipid packing,¹⁰ and labels have been reported to cause peroxidation of membrane lipids.¹

Alternatively, two main types of label-free, chemically specific, high-resolution microscopy techniques have been used on lipid membranes: imaging mass spectrometry and vibrational optical microscopy. Imaging mass spectrometry⁶ offers very high chemical resolution, whereby biomolecular species can be distinguished and identified by accurate mass analysis. However, it is a destructive technique that works by desorbing and ionizing molecules from a sample surface. The spatial resolution is governed by the focusability of the ionizing beams and can be in the submicron scale using an energetic primary ion beam that ablates the sample surface and generates secondary ions, a process called secondary ion mass spectrometry. Nevertheless, the requirement for measurements to be performed under ultrahigh vacuum limits the application of imaging mass spectrometry to flash-frozen and freeze-dried lipid membranes, that is, membranes under nonphysiological conditions.

Vibrational optical microscopy is based on detecting the Raman-scattered light following the interaction of incident light with the intrinsic vibrational resonances of chemical bonds. It is therefore chemically specific without the need of labelling and also, in principle, noninvasive. However, spontaneous Raman scattering is a very weak process, with typical Raman scattering cross-sections of vibrating modes in organic molecules in the 10^{-29} cm² range, resulting in very low photon fluxes of Raman-scattered light. It is therefore very challenging to detect single lipid membranes, which has led to various strategies to enhance the image contrast. One possibility is to exploit the local field enhancement effect in the vicinity of metallic tips¹² (a process called tip-enhanced Raman scattering) and/or structured metallic substrates (surface-enhanced Raman scattering-SERS).¹³ This approach, however, requires additional sample preparation and the availability of reliable SERS substrates. Recently, Raman imaging was demonstrated on supported lipid monolayers prepared using the Langmuir-Blodgett method,^{14,15} which results in the lipid head groups being strongly attached to a glass substrate. Under these conditions, monolayers are extremely stable and can be imaged with high laser powers and long acquisition times. The use of Raman tags via deuterated lipids¹⁵ or lipids synthesized with a diyne moiety¹⁴ has provided additional chemical specificity. However, monolayers are not quite representative of lipid membranes, which exist as bilayers. Although lipid partitioning can be observed in lipid monolayers, the corresponding phases are different from the L_d and L_o phases of bilayers. Moreover, the presence of Raman tags might change lipid partitioning compared to unlabelled lipids.

Coherent Raman scattering (CRS) microscopy has emerged in the last decade as a chemically specific technique, which improves on the speed limit of spontaneous Raman

microscopy, owing to the constructive interference of Raman-scattered light by identical vibrational modes coherently driven in the CRS excitation process.^{16,17} Briefly, CRS is a third-order nonlinearity (four-wave mixing) in which two laser fields of frequencies $\nu_{\rm p}$ (pump) and $\nu_{\rm S}$ (Stokes) coherently drive a molecular vibration in resonance at their frequency difference $\nu_{\rm vib} = \nu_{\rm p} - \nu_{\rm S}$. CRS can be detected as coherent anti-Stokes Raman scattering (CARS) or as stimulated Raman scattering (SRS). CARS is the anti-Stokes scattering of the pump field by the coherently driven vibration and occurs at the up-shifted frequency $\nu_{\rm p}$ + $\nu_{\rm vib}$ = $2\nu_{\rm p}$ - $\nu_{\rm S}$. SRS is the loss (or gain) at the pump (or Stokes) frequency from the homodyne interference of the coherent Ramanscattered field with the corresponding transmitted beam. Being a nonlinear process, CRS exhibits high spatial resolution beyond the one-photon diffraction limit and offers intrinsic optical sectioning. The coherent enhancement of CRS is particularly beneficial when imaging lipids, owing to the large number of identical CH bonds. Importantly, CRS is applicable to both supported and suspended lipid bilayers. Indeed, the visualization of spatially resolved lipid domains by CARS has been shown in GUVs and in supported lipid bilayers.^{18,19} In these works, chemical contrast was again achieved by inserting deuterated lipids and detecting them at the carbon deuterium (CD) vibrational resonance ($\sim 2150 \text{ cm}^{-1}$), which is significantly shifted compared to the nondeuterated CH stretch vibration (~2850 cm⁻¹). Deuterium labelling was implemented because CARS was excited/detected at a single vibrational resonance, which does not provide sufficient chemical specificity to distinguish lipids of different chemical compositions.

To achieve the full potential of CRS regarding its chemical sensitivity, a multiplex or hyperspectral approach must be applied,^{16,17} where for each spatial position, a wide spectrum of several vibrational resonances is acquired. This also enables a quantitative determination of the concentration of chemical components.²⁰ Notably, while multiplex CARS spectroscopy was reported on supported planar lipid bilayers²¹ and on solutions containing unilamellar vesicles,²² spatially resolved quantitative imaging of lipid domains in single bilayers was not shown, possibly due to the slow acquisition speed of multiplex detection [utilizing a spectrometer and a charge-coupled device (CCD) camera] in these works.

We have recently developed rapid hyperspectral CARS and SRS imaging modalities based on spectral focussing of broadband femtosecond pulses,^{23,24} alongside a powerful quantitative data analysis method, to retrieve the spectra and concentration of chemical components.^{20,25,26} Here, we show the applicability of this approach to spatially resolve and chemically distinguish unlabelled L_o and L_d domains in singlemembrane lipid bilayers.

MATERIALS AND METHODS

Planar Lipid Bilayers. Samples were made using dioleoylphosphatidylcholine (DOPC), sphingomyelin (SM), and Chol in the molar ratios (DOPC/SM/Chol) of 1:0:0 (pure DOPC), 0:7:3 and 1:2:1 (enriched SM, forming a homogeneous L_o phase), and 2:2:1 and 2:1:1 (ternary mixtures, showing coexistence of L_o and L_d domains at room temperature). Samples 1:2:1 and 2:1:1 were prepared using porcine SM; for all other samples, chicken-egg SM was used. All lipids were purchased from Avanti Polar Lipids (Alabaster, USA). For fluorescence labelling, we used 0.5 mol % of the fluorescent lipid analogue 1,2-dioleoyl-*sn*-glycero-3-phosphoethanolamine (7-nitro-2-1,3-benzoxadiazol-4-yl) (NBD-DOPE) which partitions in the L_d phase. NBD-DOPE was from Sigma-Aldrich (Dorset, UK). Lipid stock solutions were handled and sealed under an inert atmosphere within a nitrogen glovebox (Cole-Parmer, UK). All lipids and fluorescent lipid analogues were suspended in 2:1 chloroform/methanol (volume/ volume) or pure chloroform and stored at -20 °C under an inert atmosphere until used.

Planar lipid bilayers were formed via osmotically induced rupture of GUVs onto a hydrophilic glass surface (mixtures 1:0:0, 1:2:1, 2:1:1, and 2:2:1) or via spin-coating (mixtures 1:0:0 and 0:7:3). Glass coverslips were cleaned with acetone to remove inorganic contaminants. They were then submerged in 60 mL of sulfuric acid at 95 °C. 20 mL of hydrogen peroxide was added to the acid after several minutes. The mixture was allowed to react for 1 h, after which the coverslips were washed with distilled water and finally dried under a stream of nitrogen. The etching with acid and hydrogen peroxide served to remove leftover organic contaminants and increase the hydrophilicity of the coverslip surface. Etched coverslips were stored in nitrogen at around 5 °C in order to preserve the hydrophilicity.

GUVs were created using an electroformation protocol published previously.⁸ Briefly, 10 μ L of lipid solution (1 g/L) was spread onto the surface of two tantalum electrodes, followed by removal of the solvent for 1 h under high vacuum. The electrodes were then suspended in 550 μ L of deionized water at 60 °C and subjected to a 1.2 V peak-to-peak square waveform at 10 Hz for 1 h to induce GUV formation. Subsequently, the voltage was increased to 1.5 V peak-to-peak with a sinusoidal waveform, and the frequency was reduced to 5 Hz for 30 min, then 2 Hz for 15 min, and finally 1 Hz for 15 min to encourage the GUVs to go into solution. For GUVs forming lipid domains, the chamber was sealed, and cooling to room temperature was controlled in steps of 4 °C/h to control domain formation. A thin imaging spacer (120 μ m thick with a 20 mm diameter opening, Grace Biolabs) was attached to the treated glass coverslip surface prior to deposition of and incubation with 8 μ L of the aforementioned GUV solution for 15 min. Following incubation, 8 μ L of 75 mM phosphatebuffered saline (PBS) was added to induce GUV rupture, and the chamber was immediately sealed with a clean glass slide. Preparation of the 2:2:1 sample was slightly different, with the last step involving deposition of 65 μ L (rather than 8 μ L) of GUV solution, which was topped up with another 65 μ L after 5, 15, and 25 min; 65 μ L of PBS was then added, and 65 μ L of the medium was exchanged with 65 μ L of PBS 10 times to remove any free-floating GUVs and other lipid debris; this was all done at 55 °C.

When using spin-coating, $150 \ \mu$ L of the mixture was spun on an etched coverslip at 3000 rpm with a 6 s constant acceleration and deceleration on either side of a 30 s period for a total of 42 s. The coverslip was then placed in a plastic centrifuge tube with a small piece of wet tissue. The tube was filled with nitrogen to prevent lipid peroxidation, sealed, and incubated in an oven at 37 °C for 1 h. An imaging spacer was then placed on the lipid-containing side of the coverslip to form a cylindrical well at the bottom of which the lipid sat. This was filled with degassed PBS. Multilamellar (multiplebilayer) versions of the 0:7:3 and 1:0:0 samples were also made following the same procedure as above but using 20 times more lipid in the solution.

Optical Microspectroscopy. Epi-fluorescence and differential interference contrast (DIC) microscopy was performed on an Eclipse Ti-U Nikon microscope stand as described in our previous works.^{7,8} Here, we used a 60×1.27 -NA waterimmersion objective and a 1.34-NA oil-immersion condenser. DIC and fluorescence images were acquired using a CCD camera (Orca 285, Hamamatsu, Japan). DIC illumination was provided by a halogen tungsten lamp (V2-A LL 100W, Nikon) followed by a blue-green filter (BG40, Schott) to block nearinfrared light, for which the DIC polarizers do not have sufficient extinction, and a green filter [GIF, transmission band (550 ± 20) nm; Nikon] to define the wavelength range for the quantitative differential interference contrast (qDIC) analysis. For the measurements shown on the DOPC/SM/Chol 2:1:1 sample, an exposure time of 0.1 s was used for each frame in the DIC images. The average over 512 frames was acquired for each angle of the polarizer (offset phase). For more details, see the Supporting Information. Fluorescence images were acquired with an exposure time of 2.5 s. Epi-fluorescence excitation was performed using a metal-halide lamp (Lumen L200/D, Prior Scientific, USA) at 10% power and an exciter/ emitter/dichroic filter cube (GFP-A-Basic; Semrock, USA) suitable for the NBD dye.

Confocal Raman spectra of bulk lipids were taken using the Ti-U Nikon microscope stand equipped with a 20 \times 0.75-NA objective. A 532 nm continuous-wave laser excitation was filtered with a Semrock laser line filter (LL01-532) and coupled into the microscope by a dichroic mirror (Semrock LPD01-532RS) with a power of 10 mW at the sample. Raman scattering was collected in the epi direction, filtered with a long-pass filter (Semrock BLP01-532R), dispersed by an imaging spectrometer (HORIBA iHR550) with a 600 lines/ mm grating, and detected with a CCD camera (Andor Newton DU971N-BV) with a full width at half-maximum (fwhm) spectral resolution of about 2 cm⁻¹.

CARS was measured using the setup and technique described in our previous work²³ with a 60×1.27 -NA waterimmersion objective and a 1.34-NA oil-immersion condenser (see the Supporting Information for more details). It consists of a home-built microscope with the same Ti-U Nikon microscope stand described above, using a single-broadband 5 fs pulsed Ti:Sa laser source (Venteon, Pulse:One PE) to provide the pump and Stokes beams for CARS, as well as a third beam for two-photon fluorescence (TPF). The pulses are centered at 685 or 689 nm (pump) and 806 nm (Stokes), with a bandwidth at 10% intensity of 65 and 200 nm, respectively. They are linearly chirped using glass blocks, and their delay time is tuned in order to drive vibrational resonances in the 2700-3100 cm⁻¹ wave number range with a spectral resolution of about 10 cm⁻¹, a technique known as spectral focussing.²⁷ TPF excitation is centered at 940 nm, which is suitable to excite the NBD dye, with a Fourier-limited pulse duration of approximately 30 fs at the sample. CARS and TPF are collected in the forward direction by the condenser lens, separated using appropriate filters, and detected using photomultiplier tubes as described in our previous work.²³ A pixel dwell time of 10 μ s was used for all CARS and TPF measurements. Typical pump, Stokes, and TPF excitation powers at the sample were 40, 20, and 25 mW, respectively. Frame averaging was used as indicated in the figure captions. For correlative TPF/CARS imaging, TPF was conducted first; subsequently, the dye was fully photobleached using the CARS pump beam (typically, 10 rasterscans across the sample were

sufficient to remove all residual fluorescence). In this way, CARS imaging was free from fluorescence artefacts. Backgrounds were measured under the same excitation and detection conditions with pump and Stokes pulses out of time overlap and were subtracted from the measured CARS intensities.

SRS imaging was performed using the setup described in detail in our previous work.²⁴ Briefly, a pulsed Ti:Sa laser (Spectra-Physics Mai Tai) emitting 150 fs pulses centered at 820 nm is used as the pump beam for stimulated Raman loss (SRL). An optical parametric oscillator pumped by the second harmonic of the Ti:Sa laser (Radiantis Inspire) provides the Stokes beam. Here, its wavelength was set to 1070 nm, resulting in a central wave number of 2850 cm⁻¹. A spectral range of $2700-3100 \text{ cm}^{-1}$ was scanned by spectral focussing as described above, with a spectral resolution of about 30 cm⁻¹. The sample was mounted on a Nikon Ti-U microscope with a 60× 1.27-NA water-immersion objective (Nikon MRD70650) and a 1.5× tube lens. For SRL detection, the Stokes beam was amplitude-modulated by an acousto-optic modulator using a 2.5 MHz square wave, and the resulting modulation of the pump beam in transmission, collected by a 1.34-NA condenser lens, was measured using a silicon photodiode and a lock-in amplifier. In this setup, forward CARS can be detected simultaneously with SRL using a photomultiplier.²⁴ At the sample, the pump power was about 5 mW and the Stokes power was about 11 mW. A pixel dwell time of 1 ms was used without frame averaging.

All samples were imaged using DIC to identify the regions of interest and to check for photodamage, which was not observed under the indicated excitation and detection conditions. An example comparing DIC acquired before and after SRS imaging is shown in Supporting Information, Section 3.i. When performing long acquisitions for hyperspectral imaging, stability of the image focal plane and of the sample was monitored by repeating the in-plane image acquisition at 2850 cm^{-1} before and after the hyperspectral scan and verifying its reproducibility. Note that CARS hyperspectral datasets were acquired as averages over 10 frames as this repetition was observed to be within the stability and reproducibility limits on all investigated samples.

RESULTS

CARS Microspectroscopy of a Single Lipid Bilayer. To quantify the CARS signal strength and chemical contrast, we compare the CARS spectrum measured on a single planar lipid bilayer consisting of only DOPC with that of bulk DOPC in the CH stretch vibrational range, as shown in Figure 1. For this experiment, we fabricated supported planar lipid bilayers through osmotically induced rupture of GUVs onto a hydrophilic glass surface (see Materials and Methods). CARS microspectroscopy was performed with 10 cm⁻¹ resolution via spectral focusing (see Materials and Methods). xyz images were acquired to locate the bilayer in the optimum focal plane, and a series of xy images at wave numbers of $2700-3100 \text{ cm}^{-1}$ was recorded to resolve the lipid vibrational resonances. The resulting hyperspectral CARS datasets were denoised and corrected from a spatially varying background (using a polynomial fit) to account for slight changes in the spatial overlap between pump and Stokes beams and/or sample tilt over the scan range (for details, see the Supporting Information). The measured intensity at the bilayer (spatially averaged) was then divided by the nonresonant CARS



Figure 1. Top: Spectrum of CARS intensity ratio between bulk DOPC and the glass coverslip support. Center: Spectrum of CARS intensity ratio between a homogeneous DOPC lipid bilayer and either glass (black) or the surrounding aqueous region (red). Bottom: Retrieved imaginary part of the CARS susceptibility $\Im(\overline{\chi})$ for bulk DOPC and the bilayer (mean over 5 bilayer samples, see main text). The measured Raman spectrum of bulk DOPC is shown for comparison (blue dotted curve). CARS spectra in the lipid bilayer were obtained from spatially averaged hyperspectral images of about 15 μ m × 15 μ m measured using a 60 × 1.27-NA water-immersion objective, a pixel dwell time of 0.01 ms, a pixel size of 0.1 μ m, a 10-frame average, and a laser power of 40 mW (pump) and 20 mW (Stokes) at the sample.

intensity measured in the same image from a surrounding region without the bilayer (also spatially averaged) under the same excitation and detection conditions in order to correct for the varying temporal overlap of the pump and Stokes beams and to derive a CARS intensity ratio independent of excitation/detection parameters. The resulting spectrum is shown in Figure 1 (center) and exhibits the characteristic dispersive line shape from the interference between the resonant and nonresonant parts of the CARS susceptibility, which is expected when the resonant material fills only a small fraction of the focal volume, as is the case for a lipid bilayer.²¹ The CARS intensity ratio relative to the nonresonant CARS background measured in the glass coverslip is also shown, with the dispersive lipid resonance being superimposed onto the response from the surround aqueous buffer (PBS). Note that the amplitude of the dispersive lipid resonance is only a small fraction (\sim 3%) of the signal. The CARS intensity ratio relative to glass, measured in bulk DOPC, is given in the top frame for comparison and shows a much larger amplitude, as expected considering the small thickness of the bilayer compared to the size of the axial point-spread function (PSF). From the measured CARS ratio, the imaginary part of the CARS susceptibility, $\Im(\overline{\chi})$, is retrieved using a phase-corrected Kramers-Kronig (PCKK) procedure,²⁰ which recovers a resonant Raman-like spectrum. The bottom panel of Figure 1 shows the $\Im(\widetilde{\gamma})$ retrieved for bulk DOPC together with the measured Raman spectrum. For the bilayer, we further applied

Analytical Chemistry

a factorization procedure^{20,28} (called FSC³) in order to remove residual artefacts at the glass-PBS interface (see also the Supporting Information). The spatially averaged spectrum in the bilayer region of the corresponding component is deduced. This is shown for comparison in the bottom panel of Figure 1 as the mean spectrum for five nominally identical bilayer samples. Notably, the retrieved $\Im(\overline{\widetilde{\chi}})$ spectra of both bulk DOPC and the bilayer greatly resemble the Raman spectrum of DOPC, but the amplitude of $\Im(\overline{\widetilde{\chi}})$ in bulk DOPC is higher than that in the bilayer by a factor of 170. Since $\Im(\overline{\widetilde{\chi}})$ is linear in the number of chemical bonds in the focal volume, this factor reflects the ratio between the bilayer thickness and the effective axial extension of the PSF. Considering a bilayer thickness of about 5 nm, this extension is estimated to be 170 \times 5 = 850 nm, consistent with the measured axial PSF of 0.9 μm fwhm for the CARS field in the setup used.²⁹ It is also useful to estimate the number of DOPC molecules generating the measured CARS for the bilayer, taking into account the lateral PSF extension of 0.3 μ m fwhm for the CARS field²⁹ and the area A per DOPC molecule in the bilayer. Using A = 70.15 $Å^2$, as reported in the literature at room temperature,³⁰ we estimate 2 \times 10⁵ DOPC molecules contributing to the measured CARS signal. Note that, under the excitation and detection conditions indicated in Figure 1, the signal-to-noise ratio observed in each pixel of the CARS image of the bilayer (i.e., without spatial averaging) was about 1 (see the Supporting Information S1). From this, we deduce a sensitivity limit of about 2000 DOPC molecules/ $\sqrt{\text{Hz}}$ for the power and focussing conditions used in Figure 1.

Fluorescence Microscopy and DIC of Lipid Domains. First, we demonstrated domain formation using conventional fluorescence microscopy. An example of a single-membrane planar lipid bilayer containing lipid domains is shown in Figure 2. We used a ternary mixture of DOPC, SM, and Chol in a 2:1:1 molar ratio, which is known to form L_o and L_d domains



Figure 2. (a) DIC differential phase (δ) image of a planar lipid bilayer with a ternary mixture of DOPC/SM/Chol in a 2:1:1 molar ratio exhibiting L_o and L_d domains. (b) Corresponding integrated phase (φ) image. (c) Epi-fluorescence image of the bilayer labelled with the fluorescent lipid analogue NBD-DOPE, which partitions in the L_d phase. (d) Thickness profile across the red line in (b), with transitions from the thinner L_d phase to the thicker L_o phase indicated by the arrows.

at room temperature.³¹ For fluorescence labelling, we used a small percentage (0.5 mol %) of the fluorescent lipid analogue NBD-DOPE, which partitions in the L_d phase.³² An epifluorescence image of the lipid bilayer exhibiting one bright L_d microdomain is shown in Figure 2c.

DIC microscopy measures the difference of the optical phase between two points in the sample plane spatially separated by an amount (the shear) typically comparable with the optical resolution. Based on this principle, we have developed a qDIC image acquisition and analysis procedure to measure the spatial distribution of the optical phase,^{8,33} which for lipid bilayers of known refractive index can in turn be used to calculate their thickness.⁷ Briefly, we start by acquiring a contrast image defined as

$$I_{\rm c} = \frac{I_{+} - I_{-}}{I_{+} + I_{-}}$$

where I_{\pm} are the transmitted intensities for opposite angles of the polarizer in a DIC setup with a de Sénarmont compensator.⁸ The differential phase is defined as $\delta = \varphi_{+} - \varphi_{-}$, where

$$\varphi_{\pm} = \varphi \left(\mathbf{r} \pm \frac{\mathbf{s}}{2} \right)$$

is the optical phase accumulated in the sample for the beam passing through the point $\mathbf{r} \pm \mathbf{s}/2$, \mathbf{s} is the shear vector, and \mathbf{r} is the DIC image coordinate on the sample plane. We calculate δ using the exact analytical solution of the relationship between I_c and δ (see the Supporting Information). The spatial distribution of the optical phase at the sample, $\varphi(\mathbf{r})$, is then calculated from δ by performing a Wiener deconvolution procedure,⁸ further optimized to reduce integration artefacts as discussed in our recent work.⁷ In Figure 2a, we show the qDIC δ image of the bilayer. The corresponding integrated optical phase image is shown in Figure 2b. Notably, $\varphi(\mathbf{r})$ correlates with the epi-fluorescence image as an inverted contrast, which is expected because L_o domains are thicker than L_d domains. The bilayer thickness t can be calculated taking into account that the optical phase introduced by the lipid bilayer is

$$\varphi(\mathbf{r}) = \frac{2\pi\Delta_n}{\lambda_0} t(\mathbf{r})$$

where λ_0 is the wavelength in vacuum, Δ_n is the refractive index change between the lipid bilayer and its surrounding aqueous medium, and $t(\mathbf{r})$ is the thickness profile of the bilayer. Using Δ_n = 0.1159 under the experimental condition λ_0 = 550 nm, we obtain the thickness profile shown in Figure 2d along the red line in Figure 2b. From this profile, we find a thickness of about 4 nm for the bilayer in the L_d domain, in good agreement with the thickness of a DOPC-only bilayer measured by others using ellipsometry,³⁴ and an increase of about 1 nm going from the L_d phase to the L_o phase, also in agreement with findings from AFM studies³⁵ and our recent qDIC work.⁷ Because of the measurement of the differential phase in DIC, thickness steps at the boundaries between domains can be reliably inferred, but absolute thicknesses over large distances carry increasing systematic errors. Even with these limitations, qDIC is a remarkably sensitive label-free optical method for distinguishing lipid domains based on their optical phase differences, as shown in our recent work where the accuracy and precision of the method are discussed in detail.



Figure 3. Hyperspectral CARS imaging of the planar bilayer in Figure 2 exhibiting L_o and L_d domains. (a) Spectra obtained using an unsupervised factorization into chemical components on nine nominally equal bilayer patches exhibiting L_o and L_d domains as mean (solid line) and standard deviation (bar). Red lines are spectra (mean from five nominally equal samples) measured on homogeneous bilayers containing a DOPC/SM/Chol = 1:2:1 mixture forming a homogeneous L_o phase (called SMe) or DOPC only. (b) CARS intensity relative to the spatially averaged intensity in the region surrounding the bilayer, imaged at 2850 cm⁻¹. (c) Retrieved CARS susceptibility $\Im(\widetilde{\chi})$ at 2900 cm⁻¹. (d) TPF image of the bilayer labelled with the fluorescent lipid analogue NBD-DOPE partitioning in the L_d phase. (e,f) Spatial distribution of the L_o and L_d concentration components. Gray scales are from m to M. (g) Color overlay of L_d (blue) and L_o (green). CARS measurements were performed using a 0.01 ms pixel dwell time, 0.1 μ m pixel size, 10-frame average, and laser powers of 40 mW (pump) and 20 mW (Stokes) at the sample. For TPF, the excitation power was 25 mW at the sample, and 20-frame averaging was used.

Chemically Specific Hyperspectral CARS Imaging of Lipid Domains. We then performed hyperspectral CARS imaging on the planar single bilayer shown in Figure 2. Here, the entire hyperspectral image stack as a series of xy images at different frequencies in the 2700-3100 cm⁻¹ range is analyzed using the PCKK phase retrieval and FSC³ factorization methods described previously.²⁰ The spatially resolved distribution of separated chemical components is obtained together with the corresponding $\Im(\overline{\chi})$ spectra. Importantly, the analysis is unsupervised, that is, it does not require prior knowledge of the sample's chemical composition. We find that the method is able to distinguish two main chemical components, as shown in Figure 3. The spatial distribution of the component concentrations (Figure 3e,f) correlates very well with the lipid domains in Figure 2. It also correlates with the intensity distribution of the single-frequency CARS image (as intensity ratio to the surrounding) taken at the CH_2 symmetric stretch resonance, 2850 cm⁻¹, shown in Figure 3b, which is expected on the basis of the molecular packing density difference between L_o and L_d domains.³⁶ Figure 3c shows the phase-retrieved CARS susceptibility at 2900 cm⁻¹, where maximum contrast of the domains in $\Im(\overline{\chi})$ is obtained. Figure 3d is the TPF image of the bilayer labelled with the fluorescent lipid analogue NBD-DOPE, which partitions in the L_d phase. The retrieved $\Im(\overline{\widetilde{\chi}})$ factorized spectra of the two chemical components are shown in Figure 3a. They are compared with reference spectra measured on homogeneous planar bilayers containing either only DOPC (the main component of the L_d phase) or a SM-enriched DOPC/SM/ Chol = 1:2:1 mixture forming a homogeneous L_0 phase. Reference spectra are shown as spatial averages over the bilayer region (as discussed for Figure 1), and their amplitude corresponds to having a spatially averaged concentration of 1. For the spectra of the two chemical components, amplitudes are calculated such that the spectral integral is equal to that of the corresponding reference spectrum. Within the distribution from measurements repeated on nominally identical samples, we find a very good correspondence between the spectra retrieved from the unsupervised analysis in the bilayers containing coexisting lipid domains (using the 2:1:1 mixture) and the reference spectra from homogeneous bilayers, clearly showing the ability of the technique to chemically resolve L_o and L_d domains. We note the differences between the $\Im(\overline{\chi})$ spectrum in the L_o phase, which is narrower and more dominated by the CH₂ symmetric stretch vibration peak at 2850 cm⁻¹, and the spectrum in the L_d phase, which is broader with a pronounced shoulder around 2930 cm^{-1} due to a combination of CH₃ stretch vibrations and CH₂ asymmetric stretch enhanced by the broadening and shift of the CH deformations in the liquid phase. These differences are consistent with previous knowledge from Raman and CARS spectroscopy of saturated, more orderly packed lipids versus unsaturated, disorderly packed lipids.^{21,37,38} Notably, the Raman spectrum of pure SM reported in the literature³⁹ (also measured by us, see Supporting Information S16) exhibits a strong sharp peak near 2880 cm⁻¹ not observed in the $\mathfrak{T}(\overline{\widetilde{\chi}})$ spectrum of the L_o phase. This is because pure SM at room temperature is in the gel (solid) phase. Indeed, to obtain the L_o phase, SM has to be mixed with Chol.³¹ On the other hand, the Raman spectrum of pure Chol has a dominant peak near 2930 cm⁻¹ from the CH₃ symmetric stretch bonds³⁹ (see Supporting Information S16), while in the $\Im(\overline{\chi})$ spectrum of the L_o phase, the 2930 cm⁻¹ band appears as a shoulder of lower amplitude compared to the dominant CH₂ peak at 2850 cm⁻¹. This can be understood considering that a Chol molecule has only 5 CH₃ groups, compared to the long acyl chain with more than 16 CH_2 bonds in SM, and that the L_o phase is enriched in SM with an equilibrium stoichiometry $SM/Chol reported^{40}$ to be near 2:1.



Figure 4. CARS hyperspectral imaging on unlabelled lipid bilayers exhibiting L_o and L_d domains. (a) Unsupervised factorization into chemical components corresponding to the L_o and L_d domains. Spectra are obtained using global factorization on eight nominally identical unlabelled bilayers and compared to the spectra in the nine labelled samples. The spatial distribution of the concentrations is shown in (c) (L_o) and (e) (L_d). (b) DIC differential phase image of one of the lipid bilayers. (d) Optical phase image of the same bilayer. Scale bar: 5 μ m. Gray scales are from m to M. CARS measurements were performed using a 0.01 ms pixel dwell time, 0.1 μ m pixel size, 10-frame average, and laser powers of 50 mW (pump) and 30 mW (Stokes) at the sample.



Figure 5. SRL hyperspectral imaging on label-free planar lipid bilayers made of a ternary mixture of DOPC/SM/Chol in a 2:2:1 molar ratio exhibiting L_o and L_d domains. (a) Unsupervised factorization into chemical components corresponding to the L_o and L_d domains. Spectra are from five nominally identical unlabelled bilayers, shown as mean (solid curve) and standard deviation (bar). Red curves are reference SRL spectra measured on either an SMe bilayer or a pure DOPC homogeneous layer, as indicated. Green curves are the CARS spectra of the unlabelled domains from Figure 4. An example of the spatial distribution of the concentrations corresponding to the SRL spectra of the domains is shown in (c) (L_o) and (e) (L_d). (b) DIC differential phase image of one of the lipid bilayers. (d) Optical phase image of the same bilayer. Scale bar: 5 μ m. Gray scales are from m to M. SRL measurements were performed using a pixel dwell time of 1 ms, a pixel size of 0.072 μ m, and a laser power of 5 mW (pump) and 11 mW (Stokes) at the sample.

Having demonstrated that hyperspectral CARS microscopy analyzed with our unsupervised factorization procedure is able to separate L_o and L_d domains spatially and spectrally in single lipid bilayers, we then tested the method on label-free bilayers. Figure 4 shows the results on eight nominally identical unlabelled bilayers exhibiting L_o and L_d domains. In this case, we performed an unsupervised "global" factorization where we considered spectral components common to all images rather than an individual analysis for each sample separately, as was done to obtain the results in Figure 3. A global analysis was needed because the spatial separation between L_o and L_d domains was generally less marked in the unlabelled bilayers, such that, in some cases, an individual unsupervised analysis was unable to return separate domains. The retrieved $\Im(\tilde{\chi})$ factorized global spectra of the two chemical components corresponding to L_o and L_d are shown in Figure 4a and compared with the spectra of the labelled ternary bilayers from Figure 3a. Here, amplitudes are calculated such that the spectral integral is equal to that of the corresponding homogeneous bilayer mean spectrum shown in Figure 3a. Within errors, we observe a good agreement between the spectral components of the labelled samples and those of the unlabelled ones. An example of the corresponding spatial distributions of the component concentrations is shown in Figure 4c,e and compares well with the spatial profile measured in qDIC, as shown in Figure 4b,d. As mentioned, the spatial

separation between L_o and L_d domains appeared less pronounced in the unlabelled bilayers when compared to the labelled bilayers across all investigated samples (see Supporting Information S6 and S7 for an overview). This suggests that the inclusion of the dye, while not altering the spectra, influences the spatial separation of the domains.

SRS Hyperspectral Imaging of Lipid Domains. After having shown that CARS is able to image L_o and L_d domains and determine their $\Im(\overline{\widetilde{\chi}})$ spectra, we investigated label-free single lipid bilayers by SRS hyperspectral microscopy. We used the ternary mixture 2:2:1 as this resulted in spatially wellseparated L_o and L_d domains. SRS was measured in the form of SRL. Our setup enabled simultaneous acquisition of forwardtransmitted CARS intensity (see Materials and Methods). As was done for the CARS data sets, measured hyperspectral SRL data sets were first denoised and corrected from a spatially varying background (using a polynomial fit) to account for slight changes in the spatial overlap between pump and Stokes beams and/or sample tilt over the scan range (for details see the Supporting Information). The aforementioned unsupervised FSC³ procedure was then applied to retrieve the spectra and concentration maps of the L_o and L_d components. SRL spectra are not affected by vibrationally nonresonant background and are thus Raman-like; therefore, it is not necessary to apply the PCKK field-retrieval procedure which is used for the CARS ratio.²⁰

In order to correct the SRL spectra for the varying pump-Stokes pulse overlap during spectral focusing, we used the CARS intensity, which is dominated by the nonresonant background and measured simultaneously to the SRL. We note that the CARS intensity is proportional to $|E_p|^4|E_s|^2$, where E_p is the pump field and E_s is the Stokes field, while the SRL intensity is proportional to $|E_p|^2|E_s|$. For the correction, we therefore divide the SRL signal by the square root of the spatially averaged CARS intensity, normalized to unity at the center wave number of the SRL hyperspectral scan range.

To represent the measured SRL spectra as $\Im(\widetilde{\chi})$, we then used the aqueous buffer PBS as a reference value since the $\Im(\widetilde{\chi})$ of PBS is known (almost identical to that of water).²⁹ For this purpose, the SRL signal at the center wave number, in the region outside the lipid bilayer, was assigned to half the $\Im(\widetilde{\chi})$ value of PBS since only one half of the PSF contains the buffer, while the other half contains glass with a negligible $\Im(\widetilde{\chi})$. This determined the factor to convert SRL spectra from measured units (volts) into $\Im(\widetilde{\chi})$ values, as discussed in more detail in the Supporting Information (Section S4.ii).

Figure 5a shows the SRL spectra for the L_o and L_d domains obtained on five different regions of the ternary 2:2:1 sample, where nominally identical single lipid bilayers were found. SRL spectra were also measured on control samples consisting of pure DOPC (a thick layer formed by spin-coating) and a SMe homogeneous single bilayer (DOPC/SM/Chol molar ratio 0:7:3) and are shown as red curves in Figure 5a (the SMe spectrum is the mean over four nominally identical bilayers). For comparison to the amplitude of the measured CARS spectra discussed in the previous sections, the spectral integral of each SRL spectrum was set equal to that of the corresponding $\Im(\tilde{\chi})$ mean spectrum of the homogeneous bilayer measured by CARS (see Figure 3). We see that SRL spectra for L_o and L_d coincide with the reference spectra of the homogeneous samples within errors. They are also consistent with the measured CARS spectra, shown as green curves in Figure 5a (taken from the unlabelled ternary mixtures in Figure 4). The observed differences between CARS and SRL spectra are attributed to the different spectral resolutions and pulse temporal/spectral widths in the two measurements. The CARS setup used offered a narrower spectral resolution and a broader wave number range that can be accessed with a good signal-tonoise ratio within the time overlap of the chirped pump and Stokes pulses (see Materials and Methods). As a result, SRS spectra exhibit a less-sharply-rising edge around 2850 cm⁻¹ and have more noise in the spectral region above 2950 cm^{-1} . Otherwise, spectra measured in CARS and SRL have a comparable line shape, confirming the ability of our label-free hyperspectral imaging and unsupervised analysis to consistently differentiate between L_o and L_d domains. An example of the spatial maps of the L_o and L_d components obtained with SRL for one of the five investigated layers is shown in Figure 5 alongside the corresponding DIC differential and integrated optical phase image. Also here, we see excellent correlation between the spatial pattern of thicker domains observed in DIC and the L_o domains found in SRL. More results are shown in the Supporting Information (Section S5).

CONCLUSIONS

In summary, we have shown that hyperspectral CRS microscopy, combined with a quantitative unsupervised factorization of the measured data sets, can be used to resolve lipid partitioning and phase-separated domains in single lipid bilayers, both spatially and spectrally. Notably, to date, Raman microscopy of lipid domains in single membranes has largely exploited "Raman tags" to increase chemical specificity and has not yet taken full advantage of the inherently label-free capabilities of the technique.

By applying this analysis to lipid bilayers formed with ternary mixtures of DOPC, SM, and Chol, we have extracted the Raman spectra of L_o and L_d domains in susceptibility units relative to a nonresonant medium (glass or PBS) and correspondingly quantified the spatial distribution of the concentration of these components. We find that the spectra of the L_d components are equal within error to those of pure DOPC. Similarly, the spectra of the L_0 domains are identical to those measured in homogeneous mixtures enriched in SM and Chol. A comparative study between bilayers formed using fluorescently labelled NBD-DOPE versus unlabelled DOPE in the ternary mixture suggests that the fluorescent lipid analogue is affecting the spatial distribution of the domains but not their spectra. It should be noted that the unsupervised factorization does not resolve the individual distribution of SM and Chol within the L_o domain. To that end, the use of Raman tags on a specific lipid species (e.g., SM) provides useful complementary information.

It is important to point out that imaging planar single bilayers pushes the detection sensitivity of CRS to its limit (as exemplified in Figure 1, comparing the signal from a bulk lipid to that of a single bilayer). This is because the coherent signal enhancement of the technique relies on having a large number of identical chemical bonds in the focal volume, and only a bidimensional layer of chemical bonds is available in a single bilayer. It is therefore remarkable that, despite the low signal levels, hyperspectral CRS imaging does encode sufficient information to retrieve the spectra and concentration of the domains via an unsupervised factorization algorithm with no prior knowledge.

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In the future, this methodology could be applied to a variety of biomimetic membranes, including model systems closer to the complexity of cellular membranes (e.g., incorporating proteins). Notably, CRS is amenable to correlative fluorescence microscopy of tagged proteins in the same instrument, opening the prospect to non-invasively gain new insights into the relationship between lipid domains, their spatially resolved chemical composition, and lipid—protein interactions.

ASSOCIATED CONTENT

1 Supporting Information

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acs.analchem.0c03179.

Quantitative DIC acquisition and analysis, CARS and SRS setups, and hyperspectral CARS and SRS analyses (PDF)

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Notes

The authors declare no competing financial interest. Information on the data presented here, including how to access them, can be found in the Cardiff University data archive http://doi.org/10.17035/d.2020.0112949840.

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Analytical Chemistry

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