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# 1 Introduction

Fluorescence microscopy has been established as an invaluable tool for the study of life sciences, thanks to features such as non-invasiveness, molecular specificity, and sensitivity. Furthermore, the introduction of super-resolution microscopy techniques has allowed us to overcome the spatial resolution limit imposed by diffraction,<sup>1</sup> and thus to investigate biological phenomena with unprecedented resolution.<sup>2</sup> Stimulated emission depletion (STED) microscopy was one of the firstly introduced super-resolution techniques;<sup>3,4</sup> the standard point scanning STED microscope co-aligns the conventional Gaussian excitation beam with the so-called STED beam, engineered to generate a donut-shaped intensity distribution

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# Photon-separation to enhance the spatial resolution of pulsed STED microscopy

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Stimulated emission depletion microscopy (STED) is one of the pivotal super-resolution techniques. It overcomes the spatial resolution limit imposed by the diffraction by using an additional laser beam, the STED beam, intensity of which is directly related to the achievable resolution. Despite reaching nanometer resolution, much effort in recent years has been devoted to reducing the STED beam intensity because it may lead to photo-damaging effects. Accessing the spatial information encoded in the temporal dynamics of the detected fluorescent photons has been proved to be a powerful strategy and has contributed to the separation by lifetime tuning (SPLIT) technique. The SPLIT method uses the phasor analysis to efficiently distinguish photons emitted from the center and the periphery of the excitation spot. It thus improves the resolution without increasing the STED beam intensity. This method was proposed for architectures based on the STED beam running in continuous waves (CW-STED microscopy). Here, we extend it to pulsed STED beam implementations (pSTED microscopy). We show, through simulated and experimental data, that the pSTED-SPLIT method reduces the detection volume of the pSTED microscope without significantly decreasing the STED beam intensity.

at the focus, *i.e.*, with a "zero"-intensity point in the center. The STED beam forces all fluorophores, except those in the "zero"-intensity point at the center of the excitation spot, to de-excite to the ground state via stimulated emission, thus reducing the region from which the fluorescence signal is emitted and then recorded. Albeit theoretically the resolution of STED microscopy can reach the molecular size by increasing the intensity of the STED beam, practically it is limited by other factors, such as the noise<sup>5</sup> and the amount of laser power that can be delivered to the sample to prevent photodamage effects.<sup>6</sup> For the latter reason, much effort has been made to reduce the peak power of the STED beam necessary to reach a given spatial resolution. One turnkey insight has been the comprehension of the variations in fluorescence temporal dynamics induced by the STED beam itself. The stimulated emission process opens a new fluorophore's de-excitation pathway, which rate (instantaneous probability) strongly depends on the intensity of the STED beam. Since the STED beam intensity is spatially distributed as a donut, the position of the fluorophore with respect to the center of the excitation spot is encoded in its fluorescence temporal decay (slower at the center of the excitation spot and faster at the donut crest). This understanding has been exploited to reduce the peak intensity of the STED beam needed to achieve a target resolution, enabling effective sub-diffraction resolution also under

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such conditions where the STED beam intensity is not sufficient to obtain a complete fluorescence depletion/ quenching.<sup>7–9</sup>

The first application of this principle is the so-called gated continuous-wave (CW) STED microscope.8,10 If the STED beam is implemented with a CW laser, the peak intensity reduces and the effective resolution as well. However, the further is the fluorophore from the focal point, the shorter is its (perturbed) excited state lifetime  $\tau_{\text{STED}}$  (*i.e.*, the average time that the fluorophore spends into the excited state). Thus, by using pulsed excitation and a time-gated detection scheme photons are collected only after a delay from the excitation events - the fluorescence at the periphery due to the incomplete depletion is removed, and the resolution improves. On the other hand, time-gating rejects also a portion of "wanted" photons from the center of the focal spot, resulting in a reduced signal-to-noise ratio (SNR) of the final image that may cancel out the resolution enhancement.5,9 For implementations based on pulsed STED (pSTED) beams, the benefits of exploring the fluorescence temporal dynamics and of the timegated detection depend on the pulse-width of the STED beam itself.9 Early pSTED microscopes used pulse-widths below 200 ps, thus much shorter than the excited-state of typical organic fluorophores ( $\tau_{\rm fl} \sim 1$ –10 ns). This temporal condition makes the fluorescence emitted during the action of the STED beam and the incomplete depletion negligible, and thus the time-gated detection useless.<sup>11</sup> More recently, it has been shown that pSTED microscopy based on sub-nanosecond (~600-1000 ps) pulsed lasers substantially reduces the photobleaching compared to early pSTED implementations:<sup>12</sup> photo-bleaching is supra-linear with the STED beam intensity.<sup>13,14</sup> In this case, since the pulse-width is comparable with the excited-state lifetime  $\tau_{fl}$  and the peak intensity reduces (for a given average intensity of the pulse), the fluorescence emitted during the action of the STED beam is not negligible anymore and the benefit of time-gating is relevant. For these reasons, current pSTED microscopy implementations - including the commercial systems - rely on the sub-nanosecond fiber laser and implement a time-gated detection (gatedpSTED microscopy). However, similarly to gated-CW-STED microscopy, also for gated-pSTED microscopy the SNR of the final image is reduced.

*A-posteriori* approaches, such as multi-image deconvolution<sup>15</sup> and separation of photons by lifetime tuning (SPLIT),<sup>16</sup> can solve this problem. In particular, the SPLIT method analyses the pixel fluorescence temporal decays within the phasor framework and represents a straightforward approach to separate all the photons emitted from the long lifetime fluorophores located in the focal point ("wanted" photons), from the "unwanted" photons emitted from the short lifetime fluorophores located in the focal periphery. Here, we extend the SPLIT method to pulsed STED microscopy (pSTED-SPLIT), allowing us to recover the resolution hidden by the incomplete depletion/quenching, but without impacting the SNR.

A first method based on the phasor analysis of a pSTED image has been developed by us<sup>17</sup> and successively improved

by Wang L. et al.18 This method uses the phasor-plot representation of the pSTED image to generate a pixel segmented version of the raw data; the segmentation selects the pixels characterised by a slow fluorescence temporal dynamic, thus composed primarily of "wanted" photons, and discards the pixels identified by a fast fluorescence temporal dynamic, thus composed primarily of "unwanted" photons. In contrast, the SPLIT approach selects from each pixel only the "wanted" photons, rather than performing a simple binary pixel classification. In essence, the pSTED-SPLIT method that we propose compared to the phasor-plot based segmentation methods sorts photons and not pixels, thus providing more quantitative and artifact-free pSTED images. In the context of quantitative imaging, it is important to highlight that the SPLIT imaging technique preserves the linearity in the image, *i.e.*, the pixel intensity values are linear with the fluorophore concentration.<sup>16</sup>

#### 2 Materials and methods

#### 2.1 Phasor-based analysis

The SPLIT method is based on the analysis of the fluorescent signal dynamics through the so-called phasor analysis. The phasor analysis is a powerful tool able to describe the evolution of a signal (as a function of a variable, such as the time) as a single point in a plane with coordinates g (or cosine transform) and s (the sine transform): the phasor plot.<sup>19</sup> In the context of SPLIT-STED imaging, the phasor approach is performed on every pixel of a time-resolved measurement (e.g., on the histogram of the photon-arrival times associated with any pixel) to discriminate molecular species with different temporal fingerprints. In particular, the phasor analysis is used to discriminate the photons emitted by the fluorophores localised in the center of the STED detection volume from the photons emitted by the fluorophores localised in the peripheral region, because these two classes of fluorophores are characterised by different excited-state lifetime, and thus fluorescence decay dynamics. In brief, it can be used to shrink the detection volume further, thus improving the effective spatial resolution of a STED microscope.

We start by considering a single fluorophore and a CW-STED microscopy architecture, *i.e.*, the STED beam runs in CW. Since the Gaussian-shaped excitation and the donutshaped depletion intensity foci are co-aligned, if the fluorophore is in the very center of the excitation spot (r = 0), it does not interact with STED (or stimulating) photons, and thus it emits fluorescence according to its unperturbed lifetime  $\tau_{\rm fl}$ . The decay dynamics of such a fluorophore (thus, the histogram of the photon-arrival times) may be described with a single exponential  $\exp(-t/\tau_{\rm fl})$  and corresponds to a single point in the phasor space that lies on the semicircle of radius 1/2with center (1/2,0) (Fig. 1). In contrast, if the fluorophore is located in the ring described by  $r = \hat{r}$ , it interacts with STED photons and it is likely to be quenched to the ground state. However, as a result of the not perfect efficiency of the stimulated emission process, it may emit fluorescence nonetheless,



Fig. 1 Phasor plot trajectories of a single molecule exposed to increasing STED beam intensities, for different STED beam pulse-widths. (a) Three cases of increasing  $\gamma = T_{\text{STED}}/\tau_{\text{fl}}$  are represented, where  $T_{\text{STED}}$  is the STED beam pulse-width and  $\tau_{fl}$  the unperturbed fluorescence lifetime:  $\gamma = 0.2$  (light blue),  $\gamma = 1$  (red) and  $\gamma = \infty$ , the continuous-wave STED laser configuration (green). (b) A synthetic pSTED experiment of a single molecule exposed to increasing doses of stimulating photons, for the three pulse-width cases depicted in (a). All trajectories in the phasor space obtained increasing the STED intensity start from the point in the semicircle describing the unperturbed fluorescence lifetime  $\tau_{\text{fl}}$  and end in the point (g,s) = (1,0) describing instantaneous decay. If  $\gamma = 0.2$  (very short STED pulse-width, light blue), the trajectory is a chord in the semicircle; in the limit case of  $\gamma = \infty$  (CW configuration, green), the trajectory is an arc of the semicircle. Values of  $\gamma \in (0.2, \infty)$  lead to trajectories lying between the two limiting cases. (c) We now consider the condition  $\gamma = 1$ (red trajectory): if the molecule lies in the very center of the excitation spot (left, dark blue star) it does not interact with stimulating photons; thus its unperturbed temporal decay is represented in the phasor space as the corresponding point in the semicircle. Increasing the distance of the molecule from the center of the excitation spot leads to faster decays, due to higher STED intensities (center, blue star and right, light blue star): the corresponding points in the phasor space are thus closer to (g,s) = (1,0). Repetition rate of the simulated excitationand STED beams: 60 MHz.

but following the faster single exponential decay law  $\exp(-t/\tau_{\text{STED}}(\hat{r}))$ , where  $\tau_{\text{STED}}(\hat{r}) \propto 1/I_{\text{STED}}(\hat{r})$  and  $I_{\text{STED}}(r)$  is the spatial intensity distribution of the STED beam (we suppose radial symmetry). The corresponding point in the phasor space is still lying on the same semicircle, but shifted toward higher *g* values; the limiting case of infinite STED intensity is the point (1,0) (Fig. 1).

The key difference between pSTED and CW-STED implementations resides on the temporal dynamics of the fluorescent photons from the peripheral region of the excitation spot: the intensity temporal decay of a fluorophore illuminated by the pulsed STED beam, that can be described with a piecewise function, is faster during the STED pulse ( $0 \le t < T_{\text{STED}}$ ), and slower when the STED beam is off ( $t \ge T_{\text{STED}}$ ):

$$I(t) \propto \begin{cases} \exp^{-t/\tau_{\text{STED}}} & \text{if } 0 \le t < T_{\text{STED}} \\ \exp^{-T_{\text{STED}}/\tau_{\text{STED}}} \exp^{-(t-T_{\text{STED}})/\tau_{\text{fl}}} & \text{if } t \ge T_{\text{STED}} \end{cases}$$
(1)

As a result, a fluorophore in the periphery of the excitation spot is represented in the phasor space by a point that is lying inside of the semicircle, conversely to the CW-STED implementation. In particular, this point is lying on a trajectory which again moves from the point associated with the unperturbed fluorophore (no stimulating photons) to the point (1,0), for increasing STED intensities. Notably, the shape of the trajectory in a pSTED system depends on the ratio  $\gamma = T_{\text{STED}}/\tau_{\text{fl}}$ , where  $T_{\text{STED}}$  is the pulse-width of the STED beam, and  $\tau_{\text{fl}}$  is the natural lifetime of the fluorophore. The two considered limit cases for  $\gamma$  are (i) very small pulse-width,  $\gamma = 0.2$ : the trajectory is a chord in the semicircle (Fig. 1b, light blue trajectory); infinite large pulse-width,  $\gamma \gg 1$  (equivalent to a CW-STED implementation): the trajectory is an arc of the semicircle (Fig. 1b, green trajectory).

In a real STED imaging experiment, the fluorescent signal registered by each pixel is the sum of the signals provided by all the fluorophores located within the detection region associated with the pixel. The phasor analysis isolates, from the fluorescent signal of each pixel, the component associated with the fluorophores located in the center of the excitation region, *i.e.*, the slower components. It thus allows reducing the effective detection region and therefore improving the resolution, without increasing the STED intensity.

Although the dependency  $\tau_{\text{STED}}(r)$  yields to a continuous family of populations of emitters located at increasing distances from the center of the excitation spot and with increasingly faster temporal decays, for simplicity reasons it is convenient to consider only two species: the first one related to the center of the excitation spot (species 1,  $P_1$  in the phasor space) and the second one related to the periphery (species 2,  $\mathbf{P}_2$  in the phasor space) that yields the undesired signal. Now, the problem becomes isolating the component of the signal generated from the first species. As per the rules of phasors, a combination of such two species will be represented in the phasor space as a point lying on the line  $P_1P_2$ . As described by the SPLIT technique,16 the contributions from these two species can be separated via a linear decomposition approach, to extract only the signal originated from fluorophores in the center of the excitation spot.

We now consider a time-resolved measurement. The total number of collected photons N in a given pixel is the sum of photons  $N_1$  and  $N_2$ , emitted by molecules in the center and in the periphery of the excitation spot, respectively. As described before, the corresponding vector in the phasor space P can be

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described as the linear combination of the two vectors  $\mathbf{P}_1 = (g_1, s_1)$  and  $\mathbf{P}_2 = (g_2, s_2)$  describing the two pure species:  $\mathbf{P} = (N_1\mathbf{P}_1 + N_1\mathbf{P}_2)/N = f_1\mathbf{P}_1 + f_2\mathbf{P}_2$ , where  $f_1$  and  $f_2$  are the fractional components of the detected photons. We can write this linear system in the matrix form  $\mathbf{P} = M \mathbf{f}$ , where  $\mathbf{f} = (f_1, f_2)$ , and  $M = (\mathbf{P}_1, \mathbf{P}_2)$  is the matrix containing the temporal dynamics of the two species in the phasor domain. The solution  $\mathbf{f} = M^{-1} \mathbf{P}$  allows separating photons emitted by molecules in the center of the excitation spot  $N_1 = f_1N$  from the undesired contributions of peripheral molecules  $N_2 = f_2N$ . The final image with higher resolution is obtained by iterating this process for each pixel of the raw time-resolved image.

It is important to observe that this phasor analysis is not restricted to a simple single-exponential decay, as for the CW-STED implementation, but it is valid in general for each signal evolution, thus also for the signal generated by the fluorophores in the case of pSTED microscopy.

#### 2.2 Pulsed-STED microscope

For this study we performed measurements using an ISS Alba confocal/STED laser scanning microscopy system (http://www. iss.com/microscopy/instruments/alba.html) coupled with a Nikon Te2000 microscope.<sup>17</sup> The excitation source is a 640 nm picosecond pulsed diode laser (Becker Hickl, BDL-SMN-640, 120 ps pulse width). A 775 nm sub-nanosecond pulsed fiber laser (OneFive, Katana 775, 600 ps pulse width) provides the STED beam. The two lasers are synchronised by either (a) using the depletion laser at the 40 MHz repetition rate (master) to trigger the excitation laser (slave); or (b) using the excitation laser at the 50 MHz repetition rate (master) to trigger the depletion laser (slave). Both lasers are also synchronised to the FastFLIM module to perform time-resolved STED measurements. The 640 nm excitation laser is mounted on the ISS 3-diode laser launcher to control its intensity, and then delivered to the Alba system via a single mode polarisation maintained fiber (QiOptics). The 775 nm STED laser intensity is controlled by the ISS intensity control unit consisting of a custom-made motorised rotating half-wave plate and a fixed Glan-Thompson polariser. We use an optical delay line (custom made) for the fine tuning (picoseconds) of the temporal delay between the STED pulses with respect to the excitation beam; the STED laser is then delivered via a single mode PMF (Thorlabs) to the STED beam conditioning module (custom made), to generate the donut-shaped profile of the depletion beam. Inside the Alba module, the excitation and the STED beams are combined using a 670 long-pass dichroic mirror (Semrock); we use a pair of galvanometric mirrors to scan both beams in the plane of the sample perpendicular to the optical axes. The objective is the highly numerical aperture Nikon Plan APO  $\lambda$  60×/1.4NA oil. The scanning device is synchronised to the data acquisition unit (FastFLIM by ISS) for time-resolved Digital Frequency Domanin (DFD) measurements. We use another dichroic mirror (custom made by Chroma) to separate the descanned fluorescence signal from the excitation and STED light. We filter the emitted fluorescence by both a 720 nm short-pass NIR light blocking filter

(Optical Density 8, Chroma), and a 679/41 nm band-pass emission filter (Semrock). We set the motorised confocal pinhole (from ~20  $\mu$ m to 1 mm) placed before the detector to 60  $\mu$ m in diameter (~1 Airy unit) for STED measurements. The detection unit is the single photon counting module avalanche photodiode (SPCM-ARQH-15 byExcelitas). Data acquisition is performed using the ISS VistaVision 64-bit software; phasor analysis is performed by using a custom written Matlab code, which is provided upon request.

#### 2.3 Sample preparation

Fluorescent beads: Crimson fluorescent beads of 60 nm diameter (FluoSpheres Red and Crimson), were diluted in water 1:1000 (v/v) for a sparse sample. We dropped the diluted solution of fluorescent beads onto a poly-L-lysine (Sigma) coated glass coverslip and waited for 5 min; then we washed the coverslip with water and dried it by blowing nitrogen onto it. Finally, we mounted it with a special medium (Mounting Medium, Invitrogen). Fixed HeLa cells: Human HeLa cells were transfected with plasmid DNA encoding GFP-ActA-Halotag<sup>20</sup> (ActA binds to the outer mitochondrial membrane) overnight using Lipofectamine 2000 (Life Technologies) following the protocol of the manufacturer. The cells were fixed using 4% paraformaldehyde (Fisher Scientific), and permeabilised with 0.2% Triton-X 100 (Sigma). The cells were then labeled with ATTO647-GBP (GFP-Booster, Chromotek) in the presence of 3% bovine serum albumin (BSA) in PBS. After labeling, the cells were fixed using 4% paraformaldehyde for 15 minutes.

## 3 Results

#### 3.1 Synthetic data

We first applied the SPLIT method on the synthetic pSTED image of a single fluorophore. This simulation allows us also to derive the point-spread-function (PSF) of the pSTED-SPLIT system (Fig. 2a). In this context, it is important to remember that the SPLIT-STED microscope is - in general - a linear and space-invariant system;<sup>21</sup> thus its PSF fully describes the imaging characteristics of the system: e.g., the spatial resolution is often measured as the full-width at half maximum (FWHM) of the PSF itself. Given the Gaussian- and donutshaped focal intensity distributions of the excitation and depletion beams, respectively, and considering a STED pulse width of  $T_{\text{STED}}$  = 600 ps, we calculated the expected fluorescence decay for each pixel of the image (eqn (1)), i.e. the socalled temporal effective PSF (tE-PSF) of the pSTED microscope. In essence, the calculation of the tE-PSF is equivalent to simulating molecules located at different distances between the center of the excitation spot (r = 0), where the STED power is theoretically null, and  $r_{\text{crest}}$ , where the STED intensity is maxed.

Successively, for each pixel, we computed the phasor values and we reported them in the phasor plot. The corresponding family of phasors describes a trajectory that: (i) starts (phasor corresponding to the point r = 0) in a position located inside



Fig. 2 The pSTED-SPLIT method applied to synthetic data. (a) Simulation of the temporal effective point spread function (tE-PSF) of a pSTED experiment, equivalent to simulate the temporal dynamics of molecules located at different distances r with respect to the center of the excitation spot. The g and s images of the raw STED data indicate different temporal dynamics as a function of r. Notably, also for r = 0(center of the excitation spot), the temporal decay of the molecule is perturbed, since the depletion intensity profile features a non-zero minimum to mimic real-life pSTED experiments. Thus, the point  $P_1$ representing such molecule in the phasor space (b) does not lie exactly on the semicircle. As expected, increasing r values are related to points closer to (g,s) = (1,0). Given two points  $P_1$  and  $P_2$  related to central molecules and peripheral ones, respectively, the pSTED-SPLIT method removes the fluorescence signal arising from the latter (a, incomplete depletion) via a linear decomposition approach. The result (a, pSTED-SPLIT) shows a shrunk PSF compared to the raw STED counterpart. (c, left) Simulations of pSTED experiments with increasing saturation factor  $\zeta$ : the resolution enhancement of the pSTED-SPLIT method over the traditional raw STED counterpart is evaluated measuring the full-width at half-maximum (FWHM) of the corresponding PSFs. The ratio of the STED intensity needed for a pSTED-SPLIT over traditional STED measurement is plotted as a function of the achieved resolution (c, right).

the semicircle, since we simulated a realistic situation in which the center of the donut is not a perfect "zero"-intensity point; and (ii) does not terminate (phasor corresponding to the point  $r_{\text{crest}}$ , where the STED intensity is maxed) in the limiting position (1,0), due to the limited intensity of the STED beam (Fig. 2b).

We then applied the linear decomposition described above. As the  $P_1$  component ("wanted" central signal), we chose the starting point of the trajectory, the one associated with the slowest dynamics, and as  $P_2$  ("unwanted" peripheral signal) a point located at the tail of the trajectory. Results show that the method is effective in rejecting the contribution of fluorophores from the periphery of the excitation spot, thus leading to a reduction of the effective PSF (Fig. 2a). To quantitatively assess the resolution enhancement, we iterated the abovedescribed simulation for increasing values of the saturation factor  $\zeta_{\text{STED}} = I_{\text{STED}}/I_{\text{s}}$ , where  $I_{\text{s}}$  is the STED saturation intensity, i.e., the intensity at which the rate of stimulated emission  $k_{\text{STED}} = 1/\tau_{\text{STED}}$  during the STED pulse equals the spontaneous rate of de-excitation  $k_{\rm fl} = 1/\tau_{\rm fl}$ . We conclude that the pSTED-SPLIT approach allows using notably less STED intensity to achieve a given resolution when compared to the raw STED counterpart (e.g., 50% ISTED for a target FWHM of 140 nm, Fig. 2c).

#### 3.2 Real data

We successively validated the pSTED-SPLIT approach on real data, using a phantom sample of fluorescent beads and a biological sample.

We first tested the performances of our setup by performing a series of time-resolved pSTED measurements with increasing depletion power, imaging a sample of 60 nm sized Crimson fluorescent beads (Fig. 3). The cluster of phasors, related to all pixels in the image, lies close to the semicircle when the STED beam is off (the not perfect overlapping may be a consequence of the high concentration of fluorophores on the beads, which induces a self-quenching phenomenon<sup>9</sup>). As the depletion power increases, and the spatial resolution of the resulting images improves, the cluster elongates toward the point (1,0), following the simulated expected trajectory.

We then tested the linear decomposition approach on the same sample of 60 nm sized crimson fluorescent beads. When considering real data, a critical aspect of the pSTED-SPLIT approach is the choice of the two points  $P_1$  and  $P_2$  in the phasor plot. In this work we applied the following protocol for each measurement (Fig. 4): (i) perform a time-resolved confocal measurement (the STED beam is off) to retrieve the unperturbed fluorescence lifetime of the fluorophore; fix  $\mathbf{P}_n$  as the corresponding phasor on the semicircle at the shortest distance from the center of mass (CoM) of the resulting cluster of phasors; (ii) simulate via a custom-made Matlab tool a molecule/fluorophore with a lifetime described by  $\mathbf{P}_n$ ; we then consider a STED impulse of duration  $T_{\text{STED}}$  = 600 ps, and calculate the different temporal behaviours of such molecules when interacting with increasing doses of stimulating photons: the different decays are described by a family of



**Fig. 3** Time-resolved pSTED measurements of 60 nm sized fluorescent beads with increasing STED power. Images clearly reveal a resolution improvement when increasing the STED power, from confocal imaging ( $P_{\text{STED}} = 0$  mW, left) to pSTED imaging ( $P_{\text{STED}} = 25$  mW, center; and  $P_{\text{STED}} = 91$  mW, right). Magnified views of the recorded images are also shown. The phasor analysis (bottom) unveils the increasingly perturbed temporal dynamics of incomplete-depleted fluorophores, as expected from simulations (dotted red line). Pixel-dwell time: 100 µs. Pixel-size: 20 nm. Format: 512 × 512 pixels. Scale bars: 1 µm.

points in the phasor plot, or expected trajectory; (iii) perform a time-resolved pSTED measurement of the same area of step (i): the phasor analysis reveals a distribution of points in accordance with the expected trajectory; (iv) select both  $P_1$  and  $P_2$  on the simulated trajectory. A point  $P_1$  shifted towards the (1,0) with respect to  $\mathbf{P}_n$  allows taking into consideration the nonideal "zero" intensity condition; (v) force all the phasors P(x,y)to the line in between  $P_1P_2$  and the expected trajectory; then find the fractional components  $f(x,y) = M^{-1}(x,y)P(x,y)$ . We finally obtain the pSTED-SPLIT image as  $N_1(x,y) = \mathbf{f}_1(x,y)N(x,y)$ (Fig. 4b, top). Following this procedure, the pSTED-SPLIT approach succeeds in rejecting contributions from the periphery of the excitation spot and thus shrinks the size of the effective PSF when compared to the raw STED counterpart, i.e., the raw data collected during the time-resolved pSTED measurement, before applying the decomposition algorithm (FWHM of the gaussian fitting, averaged over n = 300 beads:  $79 \pm 28$  nm and  $69 \pm 4$  nm, for the raw STED and pSTED-SPLIT images, respectively). The reduced effective PSF of the pSTED-SPLIT method leads ultimately to better resolved images. Notably, the maximum counts of the raw and pSTED-SPLIT images are similar, which indicate that the SNR is not reduced during the process.

At this stage, it is also interesting to compare the pSTED-SPLIT approach with the phasor-based segmentation that we proposed in ref. 17. In short, we used the CoM of the cluster of points in the phasor plot to generate two circular regions of interest with the same radius and touching – exter-



**Fig. 4** pSTED-SPLIT analysis of fluorescent beads. Results of the linear decomposition and the pixel segmentation approaches for time-resolved pSTED measurements of 60 nm sized crimson fluorescent beads. (a) Resolution is increasing from confocal imaging (top) to pSTED imaging (bottom); magnified views of the original measurements are reported. The phasor analysis (a, right) shows how the STED beam perturbs the temporal dynamics of the fluorophores. (b, top) The pSTED-SPLIT method shown for magnified views of recorded data: points  $P_1$  and  $P_2$  are chosen from the phasor plot on the simulated trajectory (red dot line) calculated for point  $P_n$ . For each pixel, "wanted" and "unwanted" photons are sorted thanks to the linear decomposition approach: the corresponding fractional components  $f_1$  and  $f_2$  allow generating the final pSTED-SPLIT result and the image obtained solely by the rejected photon, respectively. Notably, the signal to noise ratio of the raw pSTED image is preserved by the pSTED-SPLIT analysis. (b, bottom) The pixel segmentation approach: in the phasor space, we define a circular region of interest (RoI) centered in the limiting point  $P_1 = (1,0)$  passing through the center of mass (CoM, black star) of the distribution of points (brown circle). A second circular RoI with the same radius is defined to be tangent with the first one and with the center lying on the straight line identified by CoM- $P_1$  (green circle). The two resulting binary maps are related to pixels dominated by peripheral and central fluorophores, respectively. The final segmentation result is then obtained by applying the binary map on the raw pSTED intensity image. Pixel-dwell time: 100 µs. Pixel-size: 20 nm. Format: 512 × 512 pixels. Scale bars: 1 µm.

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nally tangent - in the cluster's CoM. The first region - centered in the point (1,0) – selects pixels with a shorter fluorescence temporal decay, and is thus composed primarily of "unwanted" photons. The second region selects pixels with a longer fluorescence temporal decay, and is thus composed primarily of "wanted" photons. By back-projecting the pixels lying in the second region we obtained a segmented pSTED image (Fig. 4b, bottom). Notably, the method proposed in ref. 18 better selects the two regions in the phasor plot ("abandoned" and "selected" areas), since it allows considering all the pixels contained in the semicircle, but the final pSTED result is still a segmented version of the raw image. Importantly, the nonlinear nature of the segmentation operation (*i.e.* the intensity of the final images is not anymore linear with the fluorophore concentration) suggests that the measured "PSF" may not be indicative of the performance of the system. For these reasons, even if the pSTED-SPLIT method shows only a marginal improvement over the phasor-based segmentation method on fluorescent bead imaging, it performs substantially better when imaging more convoluted structures, such as the mitochondria membrane (Fig. 5). Thanks to the photon separation - rather than the pixel separation, the pSTED-SPLIT method is able to reveal the localisation of the TOM20 proteins in the membrane of the mithocondria with higher spatial resolution (with respect to confocal) and without introducing artifacts. In contrast, the phasor-based segmentation method tends to generate spotty structures, which may not adequately represent the real morphology of the mitochondria membrane. Similarly to intensity-based segmentation approaches, the



Fig. 5 pSTED-SPLIT analysis of fixed cells. Confocal image (left) and the results of the pixel segmentation (center) and linear decomposition analysis (right) of time-resolved pSTED measurements of a sample of a fixed cell with Atto 647N labeling mitochondria. Magnified views (central row) and phasor plot analysis (bottom) are also shown. Pixel-dwell time: 100  $\mu$ s. Pixel-size: 24 nm. Format: 512  $\times$  512 pixels. Scale bars: 1  $\mu$ m.

phasor-based segmentation methods highlight the brighter pixels, producing good-looking results when imaging well separated point-like structures such as fluorescent beads, but tending to lose morphological information for other structures.

## 4 Discussion

In this study, we have extended the SPLIT technique introduced by us<sup>16</sup> to the case of a pSTED implementation. We demonstrated with synthetic and real data that the pSTED-SPLIT method is able to enhance the spatial resolution of a time-resolved pSTED measurement with no degradation of the SNR and without introducing artifacts. The pSTED-SPLIT method rejects the photons emitted in the periphery of the excitation spot, *via* a simple linear decomposition algorithm in the phasor space, thus reducing the effective detection region and improving the spatial resolution, without increasing the intensity of the STED beam. A comparison with a phasor-based segmentation method is also carried out to demonstrate the higher robustness.

Thanks to the continuous emerging of high photon collection efficiency (>100 Mcps) time-resolved detection architectures,<sup>17</sup> we envisage the integration of the pSTED-SPLIT method on any commercial STED microscope. Further studies will be concentrated in the application of the SPLIT approach in the context of point-scanning reversible saturable optical linear fluorescence transition (RESOLFT) microscopy with reversible-switching fluorescent proteins (rsFP).<sup>22</sup> Here, the rsFP's fluorescence signal induced during the RESOLFT illumination cycle (activation, de-activation, and read-out), similar to the STED microscopy, shows dynamics which change as the distance of the rsFPs from the center of the focus. Such spatial information encoded in the fluorescence dynamics can be decoded using the SPLIT approach to further enhance the resolution of the RESOFT images.

# Conflicts of interest

Beniamino Barbieri is the President, and Yuansheng Sun is an employee of ISS Inc., a company commercialising microscopes.

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