# Resolution of Optical Microscope Redefined

by Sripad Ram, Dr. E. Sally Ward and Dr. Raimund J. Ober

## Digital imaging requires a re-examination of the resolution limits of optical microscopy.

ptical microscopy is an important tool for studying live biological cells in life sciences research, enabling the observation of various biological processes in real time. The study of nanoscale single molecular activities such as protein-protein interactions is vital for understanding cellular processes and aids in the development of new drugs. Recent advances in imaging technology and labeling methodology have enabled the study of single biomolecules even within a cellular environment.

It is widely believed that optical mi-

croscopes have a finite resolution limit given by Rayleigh's criterion. This limitation has long been held as an impediment to studying nanoscale molecular interactions. However, it is well-known that the criterion is based on heuristic notions.

Formulated within a deterministic framework at a time when the unaided human eye was typically used as the detector, Rayleigh's criterion neglects the statistics of the detected photons and does not take into account the total number of them. Therefore, it is not suited for current microscopy techniques that use

highly sensitive photon-counting detectors. Not surprisingly, recent single-molecule experiments have shown that Rayleigh's criterion can be surpassed. La Thus, its inadequacy necessitates a reassessment of the resolution limits for optical microscopes.

In particular, to properly plan an experiment, it is important to have a methodology to assess the accuracy at which the distance between two point sources can be determined. Recently, a resolution measure that overcomes the limitations of Rayleigh's criterion was proposed. It predicts that the resolution of an optical microscope is not limited and that it can be improved by increasing the number of detected photons from the point sources. Single-molecule imaging experiments have verified that distances

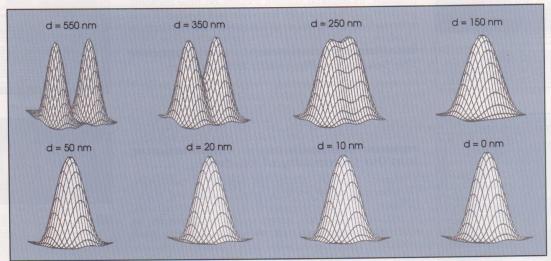


Figure 1. These simulations show GFP single molecules imaged at different distances (d) of separation. Rayleigh's resolution limit for the GFP molecules is ~ 220 nm.

between single molecules that are well below Rayleigh's criterion can be measured with an accuracy in accordance with that prediction.<sup>3</sup>

### The resolution measure

According to optical diffraction theory, the image of an in-focus point source is described by an intensity distribution profile; i.e., the point-spread function. In fluorescence microscopy, the image of two point sources can be described as the sum of two point-spread functions. Rayleigh's criterion is based on the spatial overlap between two point-spread functions. The minimum resolvable distance between two point sources is given by  $0.61 \text{ A}/n_{a'}$  where  $\lambda$  denotes the wavelength of the photons and  $n_a$  denotes the numerical aperture of the objective lens.

The resolution limit specified by Rayleigh's criterion can be thought of as an attempt to quantify the distance between two point sources such that their presence can be visually distinguished in their image. That is, point sources that are spaced far apart are resolvable because their image contains two well-separated peaks, each of which corresponds to a point-spread function, whose presence can be visually identified in the image by a human observer. As the distance of separation between the point sources decreases, there is significant overlap between the two point-spread functions such that the presence of two peaks can no longer be visually identifiable in the image (Figure 1). In this case, the point sources are said to be unresolvable.

However, the image of two point sources is distinct from that of a single point source because, mathematically, the sum of two point-spread functions is different from that of a single point-spread function. Although this was known even during Lord Rayleigh's time, it was not taken into consideration, possibly because of the insensitivity of the unaided human eye to detect subtle shape changes.

With the advent of digital technology, images can be captured easily by a digital imaging sensor and analyzed with appropriate computer algorithms. This, in turn, means that distances well below Rayleigh's resolution limit can be resolved in data acquired in an optical microscope setup. Photon statistics play a crucial role

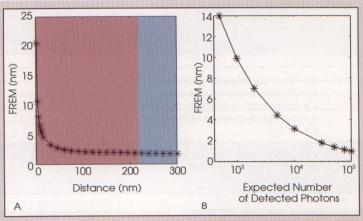


Figure 2. The FREM results vary depending upon distance (A) and photon count (B) for a pair of GFP molecules. For a given photon count, the FREM deteriorates with decreasing distances of separation because its numerical value becomes larger as the distance of separation between two point sources becomes smaller (A). Because of the inverse square root dependence of the FREM on photon count, this deterioration can be offset by collecting more photons from the point sources (B). For comparison purposes, Rayleigh's criterion is shown graphically in A, where the red and blue regions denote distances that are irresolvable and resolvable, respectively, and the corresponding Rayleigh's resolution limit is ~220 nm. The numerical values used to generate the plots are identical to those used in Table 1. Reprinted with permission of PNAS.

because collecting a large number of photons (i.e., data points) from the two point sources provides more information about the shape of their image, which leads to higher accuracy in determining the distance between them.

### Fundamental resolution measure

An interdisciplinary approach was used to obtain the new resolution measure in which tools of advanced statistical image processing4 address a classical problem in optical microscopy. The task of determining the distance between two point sources is a parameter-estimation problem. By using the theory concerning the Fisher information matrix, a bound/limit is obtained to the accuracy with which the distance can be estimated for a given imaging condition. An analytical expression for the fundamental resolution measure (FREM) is obtained by assuming imaging conditions analogous to those of Rayleigh's criterion - i.e., two identical, self-luminous, in-focus point sources emitting unpolarized, incoherent light (Table 1).

The FREM predicts how accurately the distance between two point sources can be resolved. A small numerical value of the FREM predicts a high accuracy in determining the distance, while a large numerical value predicts poor accuracy.

For example, consider a pair of GFP molecules that are imaged by a 1.45-NA objective. According to Rayleigh's criterion, distances of 8, 50 and 200 nm between the GFP molecules cannot be resolved because the smallest resolvable distance is about 220 nm. On the other hand, the new measure predicts that these distances can be resolved with accuracy not smaller than ±6.4, ±2.7 and ±1.9 nm, respectively, when 3000 photons, on average, are detected from each molecule. This implies that, for distances of 50 and 200 nm, the FREM predicts a high accuracy in resolving the distance, while for 8 nm, it predicts poor accuracy in resolving the distance (Figure 2A).

Because the FREM takes into account the photon statistics, the accuracy of resolving a distance of 8 nm can be greatly improved by increasing the number of

TABLE 1.	
Fundamental Resolution Measure (FREM)	Rayleigh's Criterion
$\frac{1}{\sqrt{4\pi \cdot \Lambda_0 \cdot (t - t_0) \cdot \Gamma_0(d)}} \cdot \frac{\lambda}{n_a},$	$0.61\frac{\lambda}{n_a}$
$\begin{split} \Gamma_0(d) &:= \int_{\mathbb{R}^2} \frac{1}{\frac{J_1^2(\alpha r_{01})}{r_{01}^3} + \frac{J_1^2(\alpha r_{02})}{r_{02}^2}} \left( (x + \frac{d}{2}) \frac{J_1(\alpha r_{01})J_2(\alpha r_{01})}{r_{01}^3} - (x - \frac{d}{2}) \frac{J_1(\alpha r_{02})J_2(\alpha r_{02})}{r_{02}^3} \right)^2 dx dy, \\ J_n &= \text{nth order Bessel function of the first kind} \\ \Lambda_0 &= \text{Photon detection rate of the point sources} \\ \lambda &= \text{wavelength of the detected photons} \\ n_a &= \text{numerical aperture of the objective lens} \\ \alpha &= 2 \pi \ n_a / \lambda \end{split}$	$\lambda$ = wavelength of the detected photons $n_a$ = numerical aperture of the objective lens
<ul> <li>Depends on the photon/light budget of the point sources and the properties of the point-spread function (PSF)</li> <li>Nonlinear dependence on the ratio λ/n<sub>a</sub> because of α.</li> </ul>	<ul> <li>Depends only on the width of the PSF.</li> <li>Depends linearly on λ/n<sub>a</sub></li> </ul>

photons detected from each GFP molecule (Figure 2B). This result is in stark contrast to Rayleigh's criterion, which is independent of the photon count. Moreover, it underscores the importance of considering the photon/light budget when discussing resolution performance, especially in fluorescence imaging applications that typically use photobleachable fluorescent markers.

Several experimental factors can affect the resolvability of two point sources.

For instance, modern imaging detectors are pixelated, and the data acquired is a discretized version of the image. The data also is corrupted by extraneous noise sources such as scattered photons, autofluorescence and detector readout noise. To account for these factors, the practical resolution measure (PREM) was derived. An extension to the FREM, it shows how experimental factors deteriorate the predicted resolution measure.

For example, for a pair of GFP mole-

cules, a comparison of the PREM and the FREM shows that, when taking into account deteriorating factors, there is an approximately twofold deterioration in the resolution measure for distances of 50 and 200 nm and a sevenfold deterioration for a distance of 8 nm (Table 2). Note that the deterioration of the resolution measure is pronounced for small distances. This implies that, during an experiment in which small distances are estimated, extra care must be taken to control noise. Moreover, by comparing the PREM and the FREM, an experimenter also can systematically investigate which experimental factor is a major contributor to the deterioration of the predicted accuracy in a particular scenario. In this way, the new resolution measure also can be used to design and optimize microscopy and experimental

The FREM and PREM are based on the scenario that the acquired image contains photons from both point sources. However, when the point-source pair exhibits

GFP					
Distance (nm)	Photon count per molecule	FREM (nm)	PREM (nm)		
8	3000	6.5	42.0		
10	3000	5.7	37.0		
50	3000	2.7	7.4		
200	3000	1.9	3.0		
Distance (nm)	Photon count per molecule	FREM (nm)	PREM (nm)		
	Photon count				
8	3000 (104)	10.1 (5.5)	76.5 (31.6)		
10	3000 (104)	9.1 (5.0)	47.1 (27.1)		
50	3000 (104)	4.0 (2.2)	12.5 (5.3)		
200	3000 (104)	2.7 (1.5)	4.5 (2.2)		

TABLE 2.

Table 2. The results of the new resolution measure were calculated for a pair of GFP/Cy5 molecules at various distances of separation. The FREM/PREM is
calculated for the case when $n_a = 1.45$
and $\lambda = 520/690$ nm (GFP/Cy5). The
other imaging conditions assumed for the
PREM are as follows: pixel size is 12.9
rkeivi die as ioilows, pixei size is 12.7
× 12.9 µm, pixel array size is 13 ×
13, readout noise is 8 e <sup>-</sup> per pixel, and
background noise is 80 photons per
pixel per second.

TABLE 3.						
GFP						
Distance (nm)	Photon count per molecule before first photobleaching step	Photon count per molecule after first photobleaching step	PREM when using additional spatial information (nm)			
8	2000	2000	8.1			
15	2000	2000	7.9			
25	2000	2000	7.6			
50	2000	2000	6.7			

Table 3. The predicted resolution measure is shown for a pair of GFP molecules when additional spatial information is used. The imaging conditions are identical to those in Table 2.

double-step photobleaching behavior, additional spatial information can be obtained from photons collected from the point source that remain after the first photobleaching step. The theory used to derive the FREM and the PREM also can be used to investigate how the additional spatial information improves the predicted resolution measure.

For example, for two GFP molecules 10 nm apart, the resolution measure predicts an accuracy not better than ±5.8 nm when an average of 5000 photons are collected before and after the first photobleaching step (Table 3). In contrast, when additional information obtained after the first photobleaching step is not used, the resolution measure predicts an accuracy not smaller than ±43 nm to resolve the same distance.

By definition, the resolution measure provides a bound to the accuracy/standard-deviation with which the distance between two point sources can be estimated. Hence, it is important to know whether this bound can be attained in experimental data. To verify this, images of closely spaced Cy5 molecules and a DNA ruler labeled with Cy5 dye at either end were acquired and analyzed. To determine the distance of separation between the single molecules, the maximum likelihood estimation algorithm was implemented in the high-level programming language Matlab from MathWorks in Natick, Mass., and it was verified that the accuracy of the distance estimates comes close to the predicted resolution measure.

#### Single-molecule imaging

The proposed resolution measure shows that certain single-molecule experiments can be performed that were once thought to be unfeasible with an optical microscope; for example, nanoscale protein interactions such as receptordimerization. For this, the protein of interest is tagged with a single fluorophore such as GFP. In addition, the analysis can be extended to resolve distances between more than two single molecules.

Parameter estimation problems play a central role in single-molecule microscopy. Examples include determining the location and photon count of single molecules, resolving the distance of separation between two (or possibly more) molecules and estimating the level of defocus. With all these problems, it is helpful for the experimenter to have analytical tools to assess with what accuracy the various parameters can be estimated.

In the past, several groups have addressed this issue by considering specific estimation techniques, but the results have been limited to the specific estimation technique used. On the other hand, the approach based on the Fisher information matrix provides results independent of specific estimation techniques. In fact, by using this approach, a simple analytical formula provides a fundamental limit to the accuracy with which the location of a single molecule can be determined.<sup>5</sup>

Results also have been obtained for the problem of determining the defocus of the single molecule.<sup>6</sup> In general, this method can be applied to any parameter estimation problem in optical microscopy, and a detailed formulation in this regard was recently reported.<sup>7</sup>

#### Meet the authors

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