124-Color Super-resolution Imaging by Engineering DNA-PAINT Blinking Kinetics

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ABSTRACT: Optical super-resolution techniques reach unprecedented spatial resolution down to a few nanometers. However, efficient multiplexing strategies for the simultaneous detection of hundreds of molecular species are still elusive. Here, we introduce an entirely new approach to multiplexed super-resolution microscopy by designing the blinking behavior of targets with engineered binding frequency and duration in DNA-PAINT. We assay this kinetic barcoding approach in silico and in vitro using DNA origami structures, show the applicability for multiplexed RNA and protein detection in cells, and finally experimentally demonstrate 124-plex super-resolution imaging within minutes.

KEYWORDS: Super-resolution microscopy, DNA nanotechnology, DNA-PAINT, barcoding, multiplexing

The development of optical super-resolution techniques allows researchers to unravel molecular properties of biological systems with thus far unprecedented detail.1–4 While recent technical advancements propel the achievable spatial resolution to the true molecular scale of only a few nanometers,5–7 current implementations are still limited when it comes to imaging many molecular species simultaneously in single cells and beyond. This so-called multiplexing is traditionally achieved using spectrally distinct, fixed labels (e.g., dye-conjugated antibodies or nucleic acid probes) on target molecules of interest such as proteins, DNA, or RNA. While spectral multiplexing approaches are relatively straightforward to implement, the amount of “plex” is inherently limited by the number of distinguishable spectral labels in the detectable emission spectrum, which is in most instances three or four.8 However, in order to fully understand the detailed molecular workings of the complex cellular machinery, one ideally would need to be able to look at hundreds if not thousands of unique components and their molecular interplay.

Some efforts to extend spectral multiplexing capabilities include multiparameter and combinatorial detection,9,10 multi-spectral acquisition,11 and spectrally resolved detection.12,13 While these approaches increase the number of detectable targets, they are ultimately still limited by the spectral properties of fluorescent molecules used to label target structures.

To overcome the limitation inherent in spectral separation for multiplexed detection, several approaches have recently been devised that employ sequential labeling and imaging of targets using spectrally indistinct probes14–15 (i.e., the same dye molecule). Some of these implementations rely on simultaneous labeling of target molecules with orthogonal DNA-barcoded affinity reagents (e.g., antibodies) followed by sequential imaging using dye-labeled complementary oligos (e.g., Exchange-PAINT15 or Universal DNA Exchange16,17). Others use sequential labeling, imaging, and quenching based on dye-conjugated antibodies, e.g., STORM.17,18 While both implementations differ slightly in the combined time for labeling and imaging of each target, the overall experimental time eventually scales linearly with the number of targets to be acquired. This fact ultimately sets a practical limit to the amount of multiplexing achievable. While it might be reasonable to obtain tens of targets with sequential multiplexing, it will become prohibitively time-intensive (and eventually impossible) for hundreds or even thousands of targets. Thus, current multiplexing approaches are inherently limited in terms of the achievable coding depth, overall acquisition time, and ease-of-use.

To overcome this limitation, we here propose an entirely orthogonal approach to achieve multiplexed detection in single-molecule-based super-resolution experiments that allows hundreds or more targets to be imaged simultaneously. Instead...
of relying on spectral information or sequential imaging, we engineer targets to blink autonomously with precisely adjustable kinetic signatures (i.e., frequency and duration of blinks), essentially providing a distinct kinetic barcode for hundreds of unique molecular species.

In order to implement and demonstrate the concept of engineered blinking kinetics for simultaneous multiplexing, we chose DNA-PAINT \(^7,^{19}\) as imaging modality. In DNA-PAINT, short dye-labeled oligonucleotides bind transiently to complementary, target-bound DNA molecules, thus creating an apparent blinking at the target site, which in turn is used for stochastic super-resolution microscopy. Due to the versatile programmability of DNA probes, the binding kinetics such as blinking frequency and duration can be tuned precisely and used downstream as “barcodes” for multiplexed detection.

The concept of engineering binding kinetics with DNA-PAINT is schematically shown in Figure 1a. In order to tune the blinking frequency of targets, we label one species with a single DNA-PAINT binding site and an orthogonal species with three binding sites. Assuming a constant influx of imager strands, the blinking frequency will scale linearly with the number of binding sites (e.g., resulting in a blinking frequency of two for the single binding site and a frequency of six for three sites; see Figure 1a). Similarly, we can modulate the blinking duration for a given target molecule by adjusting the length of the docking strand (e.g., 8 nt long docking strands will result in relatively short binding events, while 10 nt long docking sites will result in longer events; see Figure 1a). As binding frequency and duration are independent of each other in DNA-PAINT, these parameters can be combined to perform combinatorial barcoding with just a single imager strand species, thus enabling simultaneous multiplexed imaging.

In order to screen for the optimal conditions to design distinguishable binding kinetics in terms of frequency and duration, we first performed in silico DNA-PAINT experiments. Tuning parameters such as binding time, imager strand concentration, number of binding sites, duration of image acquisition, and others (see online methods for details), we
were able to engineer four distinguishable blinking regimes (two blinking frequencies based on 40 and 120 binding sites and two blinking durations based on 400 ms and 5 s) that can now be used for combinatorial barcoding with a single imager strand species only, allowing four-target super-resolution imaging in a relatively short duration of 25 min (Figure 1b and Supplementary Figure 1).

Next, to experimentally validate the \textit{in silico} results, we turned to DNA origami \cite{20} structures to implement the engineered frequency and duration levels, as these structures are exquisitely programmable for super-resolution microscopy. \cite{21} We designed four structures carrying 40 and 120 are exquisitely programmable for super-resolution microscopy and engineered frequency and duration levels, as these structures show a clearly distinguishable distribution of a low and a high frequency, corresponding to the FISH probe set for TFRC (yellow) and MKI67 (green), respectively. (d) Distinct frequencies are used to assign a pseudocolor for each RNA species. (e) Scheme showing the implementation of duration barcoding for protein detection. Two distinct protein species are labeled with DNA-conjugated antibodies featuring an 8 and 9 nt binding site for DNA-PAINT imaging. (f) Resulting DNA-PAINT data after image acquisition shows CHC and PMP70 proteins as clusters, which are not yet distinguishable. (g) Plotting the binding duration for selected protein locations shows a clearly distinguishable distribution of short and long binding species, corresponding to the two proteins. (h) Distinct durations are used to assign a pseudocolor for each protein species. Scale bars: 1 \( \mu \text{m} \).

Next, we designed two experiments to demonstrate the general applicability of our simultaneous multiplexing approach \textit{in situ} in two biologically relevant settings. First, we implemented two-color frequency barcoding for two distinct mRNA species using a combination of DNA-PAINT implemented on a Spinning Disk Confocal microscope \cite{23} and smRNA-FISH \cite{14,24} (Figure 2a–d). We labeled TFRC and MKI67 mRNA species using two sets of FISH probes displaying 40 and 120 binding sites, respectively (see Figure 2a for probe design and Supplementary Tables 6 and 7 for probe sequences). After image acquisition, the RNA species appear as super-resolved spots in the resulting DNA-PAINT image (Figure 2b, see Methods in the Supporting Information for acquisition details). We then performed kinetic analysis on the individual RNA molecules and obtained a distribution of two populations corresponding to two distinct blinking frequencies, as designed (Figure 2c). Similar to the \textit{in vitro} case (Figure 1), we assigned a pseudocolor to each of the blinking frequencies and rerendered a barcoded data set (Figure 2d), where we are now able to clearly distinguish TFRC from MKI67 mRNA molecules.

To demonstrate that binding duration can be used in a similar fashion to barcode biomolecules in cells, we next used DNA-conjugated antibodies targeting the clathrin heavy chain (CHC) and a peroxisomal membrane protein (PMP70) inside HeLa cells, where each secondary antibody species carries a DNA-PAINT binding site of different length (Figure 2e and Supplementary Table 8). Similar to the mRNA experiments, we performed image acquisition and analysis and obtained a
DNA-PAINT data set (Figure 2f). This was then transformed using kinetic analysis (Figure 2g) into a pseudocolored, barcoded image, where we were able to clearly distinguish areas of CHC and PMP70 based on the blinking duration (Figure 2h).

The proof-of-concept experiments for DNA origami, RNA, and protein barcoding underline the general applicability of the kinetic barcoding concept in vitro and in situ. However, to fully demonstrate the power of kinetic barcoding, we turned our attention to the question of how much simultaneous multiplexing can be achieved within a relatively short period of time. By combining four distinguishable binding frequencies with three spectral colors, we should be able to achieve simultaneous, 124-plex super-resolution imaging within a few minutes acquisition time. To demonstrate that this is indeed feasible, we designed and constructed 124 unique DNA origami structures carrying 0, 3, 9, 22, or 44 copies of three orthogonal binding sites each, respectively (Figure 3a and Supplementary Tables 9 and 10). After folding and purification (Supplementary Figure 9), we pooled all 124 distinct DNA origami structures into a single sample and performed 3-color DNA-PAINT imaging using Atto655-, Cy3B-, or Atto488-labeled orthogonal imager strands (Supplementary Table 11). As before, we performed kinetic analysis on each of the structures and plotted the distribution of binding frequencies for each spectral color separately (Figure 3b). We were able to clearly distinguish four distinct frequency populations in each of the three spectral colors. Using these levels, we assigned a unique barcode ID to each of the origami structures in the sample based on color and frequency and were able to render a full 124 pseudocolor super-resolution data set (Figure 3c, see also Methods in the Supporting Information for identification).

Next, we quantified all DNA origami in the data set and were able to verify that indeed all 124 unique structures could be identified (Figure 3d). Finally, in order to assay the performance in terms of false positive identification of our multiplexing approach, we performed a similar experiment as described above, but now using only a subset of 25 out of the total 124 DNA origami structures (Figure 3e). The resulting quantitative analysis yielded a remarkable accuracy of 97.6%, underlining the robustness of our multiplexing approach based on engineered binding kinetics. We note, however, that this high number of multiplexing and robustness might not be achievable in a straightforward fashion in a cellular setting, e.g., for mRNA barcoding using smRNA-FISH as shown in the examples above, due to the increased complexity in the intracellular environment and suboptimal or target-dependent labeling efficiencies.

In conclusion, we introduced an entirely new barcoding approach for multiplexed detection based on precisely engineered blinking kinetics in stochastic super-resolution microscopy: kinetic barcoding. We demonstrated the implementation using DNA-PAINT both in vitro and in situ, currently reaching 124-plex within minutes. Zooming out, we envision that kinetic barcoding could be applied to ask Systems Biology questions in single cells with super-resolution by simultaneously imaging hundreds of DNA, RNA, and protein targets reaching transcriptomics- and proteomics-style experiments with a simple localization microscopy approach: “Localizomics”. Finally, one could envision its extension to even more multiplexing by implementing readouts such as...
molecular brightness of imager strands, fluorescence lifetime, and more.25

■ ASSOCIATED CONTENT

2 Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acs.nanolett.9b00508.

Materials and methods alongside detailed information about the optical setups, DNA origami self-assembly, RNA-FISH probe design and antibodies, sample preparation and data processing, sequences for DNA origami folding, DNA-PAINT docking and imager sequences, and RNA-FISH probes (PDF)

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These authors contributed equally to this work. O.K.W. and P.S. designed and performed experiments and analyzed data. J.B.W. designed and performed experiments and analyzed data. P.C.N. designed and performed DNA origami experiments and analyzed data. S.S. designed and performed experiments and analyzed data. J.B.W. and R.J. conceived and supervised the initial phase of the study. R.J. and P.Y. are co-founders of Ultivue, Inc.

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