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# Large-scale investigation of the effects of nucleobase sequence on fluorescence excitation and Stokes shifts of DNA-stabilized silver clusters†

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DNA-stabilized silver clusters ( $\text{Ag}_N$ -DNAs) exhibit diverse sequence-programmed fluorescence, making these tunable nanoclusters promising sensors and bioimaging probes. Recent advances in the understanding of  $\text{Ag}_N$ -DNA structures and optical properties have largely relied on detailed characterization of single species isolated by chromatography. Because most  $\text{Ag}_N$ -DNAs are unstable under chromatography, such studies do not fully capture the diversity of these clusters. As an alternative method, we use high-throughput synthesis and spectroscopy to measure steady state Stokes shifts of hundreds of  $\text{Ag}_N$ -DNAs. Steady state Stokes shift is of interest because its magnitude is determined by energy relaxation processes which may be sensitive to specific cluster geometry, attachment to the DNA template, and structural engagement of solvent molecules. We identify 305  $\text{Ag}_N$ -DNA samples with single-peaked emission and excitation spectra, a characteristic of pure solutions and single emitters, which thus likely contain a dominant emissive  $\text{Ag}_N$ -DNA species. Steady state Stokes shifts of these samples vary widely, are in agreement with values reported for purified clusters, and are several times larger than for typical organic dyes. We then examine how DNA sequence selects  $\text{Ag}_N$ -DNA excitation energies and Stokes shifts, comment on possible mechanisms for energy relaxation processes in  $\text{Ag}_N$ -DNAs, and discuss how differences in  $\text{Ag}_N$ -DNA structure and DNA conformation may result in the wide distribution of optical properties observed here. These results may aid computational studies seeking to understand the fluorescence process in  $\text{Ag}_N$ -DNAs and the relations of this process to  $\text{Ag}_N$ -DNA structure.

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## 1. Introduction

Certain DNA oligomers can serve as stabilizing ligands for fluorescent silver clusters<sup>1</sup> ( $\text{Ag}_N$ -DNAs), whose structures and optical properties are strongly tuned by DNA sequence.<sup>2–4</sup> Researchers have collectively reported on  $\text{Ag}_N$ -DNAs stabilized by thousands of different DNA strands, representing a diverse palette of fluorescence properties: emission spectra peaked at 450 nm to 1000 nm,<sup>5,6</sup> quantum yields from 3% to 93%,<sup>7–13</sup> Stokes shifts up to 0.73 eV ( $5900 \text{ cm}^{-1}$ ),<sup>14</sup> and light-up or color-switching behavior induced by stimuli.<sup>15–18</sup> These diverse and sequence-tunable fluorescent  $\text{Ag}_N$ -DNAs are

promising for applications ranging from sensing<sup>19–22</sup> and molecular logic schemes<sup>23</sup> to background-free fluorescence microscopy<sup>24–26</sup> and nanophotonics.<sup>10,27,28</sup> Recent breakthroughs are rapidly advancing our understanding of the structures of certain  $\text{Ag}_N$ -DNAs,<sup>5,7,14,29–31</sup> largely due to detailed studies of about 20 different  $\text{Ag}_N$ -DNA species purified by high performance liquid chromatography (HPLC).<sup>32</sup> Purification methods are critical to ensuring interrogation of a single cluster species rather than the heterogeneous mixture of fluorescent and nonfluorescent products formed by  $\text{Ag}_N$ -DNA synthesis.<sup>33</sup> However, because a substantial fraction of  $\text{Ag}_N$ -DNAs are unstable under chromatographic separation,<sup>3</sup> it remains to be determined whether the purified  $\text{Ag}_N$ -DNAs are representative of the entire palette of possible  $\text{Ag}_N$ -DNAs. An alternative examination of these clusters which does not select for stability under chromatography may shed light on this issue.

Detailed compositions of 14 purified fluorescent  $\text{Ag}_N$ -DNAs have been resolved by high resolution mass spectrometry (HR-MS), including numbers of DNA template strands and total silver content ( $N_{\text{tot}}$ ), which can be separated into neutral and cationic silver content ( $N_0$  and  $N_+$ , respectively).<sup>7</sup> (Unpurified  $\text{Ag}_N$ -DNAs have also been characterized by

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HR-MS.<sup>8,34–36</sup>) For purified samples, total silver content ranges from  $N_{\text{tot}} = 10$  to  $N_{\text{tot}} = 30$  Ag atoms.<sup>6,7,29,32</sup> We note that  $N_{\text{tot}}$  cannot *a priori* be assumed to represent cluster size  $N$ : recent crystallographic studies find a minority of Ag atoms are attached to the DNA template but unattached to the silver cluster.<sup>5,14,31</sup> For other ligand-stabilized noble metal clusters, metal atoms within the cluster core are neutral in character, while metal atoms bonded to the ligands are cationic in character.<sup>37</sup> For fluorescent  $\text{Ag}_N$ -DNAs analyzed by HR-MS, just 36% to 57% of  $N_{\text{tot}}$  are in a neutral state while the remaining silvers are cationic. Nonfluorescent silver clusters have also been found, containing  $N_{\text{tot}} = 5$  to  $N_{\text{tot}} = 22$ , with  $N_0 = 2$  to  $N_0 = 10$ .<sup>7,29</sup> In both fluorescent and non-fluorescent clusters, a fraction of the cationic silvers,  $N_+$ , are likely a part of the silver cluster and mediate attachment of the cluster core to the nucleobases, while other  $\text{Ag}^+$  may be unattached to the DNA template but unattached to the silver cluster itself.

Consistent with other ligand-stabilized metal clusters,<sup>37,38</sup> peak excitation wavelength of fluorescent  $\text{Ag}_N$ -DNAs scales with the number of neutral silvers,  $N_0$ , supporting the idea that these silvers form a neutral cluster core.<sup>28,29</sup> Compared to monolayer-protected metal clusters, which are largely globular in shape,<sup>39</sup> peak excitation wavelengths and extinction coefficients of  $\text{Ag}_N$ -DNAs scale more strongly with  $N_0$ .<sup>7,28</sup> Magic number values of  $N_0$  for  $\text{Ag}_N$ -DNAs<sup>29</sup> also differ markedly from globular clusters. These characteristics support a model for HPLC-purified  $\text{Ag}_N$ -DNAs whereby DNA imposes a rod-like cluster geometry onto the  $\text{Ag}_N$  core.<sup>7,8,29,30,40,41</sup> This model was recently verified by the first X-ray crystal structures of purified  $\text{Ag}_N$ -DNAs.<sup>14,31,42</sup> A prior crystal structure of an  $\text{Ag}_8$ -DNA formed by *in situ* crystallization is also elongated to a lesser degree,<sup>5</sup> agreeing with our prediction that smaller  $\text{Ag}_N$ -DNAs have lower aspect ratios.<sup>28</sup>

While understanding of  $\text{Ag}_N$ -DNA structure is rapidly improving for HPLC-purifiable species, less is known about  $\text{Ag}_N$ -DNA photophysics.  $\text{Ag}_N$ -DNAs luminesce by a fluorescence-like process, with 1–4 ns emission lifetimes and quantum yields  $>0.1$  for most purified  $\text{Ag}_N$ -DNAs.<sup>7–11</sup> (This contrasts with the  $\sim\mu\text{s}$  emission lifetimes and lower quantum yields of many phosphorescent metal clusters.<sup>43,44</sup>) However, the  $\text{Ag}_N$ -DNA luminescence process differs from the simple Jablonski diagram of organic fluorophores.<sup>45,46</sup> Excitation and emission spectra of pure  $\text{Ag}_N$ -DNAs exhibit single dominant peaks without the vibronic shoulders characteristic of organic fluorophores.<sup>3</sup> The broad spectral line widths of  $\text{Ag}_N$ -DNAs cooled to below 2 K and the linear scaling of extinction coefficients with  $N_0$  could be consistent with an initial collective electronic excitation leading to fluorescence.<sup>28,47–49</sup> Ultrafast studies of a purified  $\text{Ag}_{20}$ -DNA discovered a sub-100 fs relaxation from an initial excited state to a lower energy state from which fluorescence occurs.<sup>50</sup> Such ultrafast relaxation, which accounts for most of the Stokes shift in  $\text{Ag}_N$ -DNAs,<sup>9,50</sup> is also reported for impure  $\text{Ag}_N$ -DNAs.<sup>51,52</sup> This relaxation is too rapid for typical vibrational relaxation<sup>53</sup> but could instead result from dephasing of a collective electronic excitation<sup>47</sup> or perhaps unusually rapid vibrational relaxation.

Studies of purified  $\text{Ag}_N$ -DNAs also suggest that DNA scaffold conformation and local dielectric environment add diversity and complexity to excited state behavior of  $\text{Ag}_N$ -DNAs. Purified  $\text{Ag}_N$ -DNAs exhibit solvatochromic behavior that is not described by the simple Onsager-based models typically used for organic fluorophores but instead depends on the specific DNA template, and, potentially, its engagement with local solvent environment.<sup>46</sup> Time-resolved and polarization-resolved studies of single  $\text{Ag}_N$ -DNAs within a polymer film find that  $\text{Ag}_N$ -DNA spectral properties are sensitive to slight variations in local environment.<sup>25,41,54</sup> In one case, removing a terminal adenosine from the DNA template of an  $\text{Ag}_{16}$ -DNA increases Stokes shift while leaving cluster geometry, peak absorbance energy, and quantum yield essentially unchanged.<sup>14</sup> Some  $\text{Ag}_N$ -DNAs exhibit temperature-dependent excited state relaxation<sup>9,14</sup> while others do not.<sup>13</sup> Together, these studies paint a complex picture of the range of sequence-dependent excited state behaviors, even for the subset of  $\text{Ag}_N$ -DNAs which survive purification.

Because most  $\text{Ag}_N$ -DNAs are unstable under HPLC,<sup>3</sup> a large-scale investigation is needed to more fully probe the spectral palette of  $\text{Ag}_N$ -DNAs and determine whether the few well-studied purified  $\text{Ag}_N$ -DNAs are generally representative of these fluorophores. We previously reported high-throughput studies of  $10^3$  different  $\text{Ag}_N$ -DNA emission spectra, uncovering the magic numbers of  $\text{Ag}_N$ -DNAs<sup>29</sup> and learning how DNA sequence selects fluorescence emission.<sup>55–57</sup> These studies also illustrated the challenges of high-throughput  $\text{Ag}_N$ -DNA characterization:  $\sim 25\%$  of 10-base DNA strands can stabilize multiple fluorescent  $\text{Ag}_N$ -DNA species with distinct emission peaks.<sup>55</sup> Here, we develop a method to rapidly screen steady state fluorescence excitation and emission spectra of  $\text{Ag}_N$ -DNAs. Motivated by studies showing that purified  $\text{Ag}_N$ -DNAs and single  $\text{Ag}_N$ -DNA emitters exhibit single excitation and emission peaks in the visible to near-infrared (NIR) spectrum,<sup>28,30,32,47,58</sup> we identify solutions likely to contain one dominant fluorescent  $\text{Ag}_N$ -DNA species by using spectral purity as an alternative to harsh purification methods. Performing  $\text{Ag}_N$ -DNA synthesis and steady-state fluorimetry identically on 1880 different 10-base DNA oligomers, we find 305 samples which exhibit single excitation and emission peaks. Stokes shifts of these “spectrally pure” samples vary widely, roughly increasing with peak excitation and emission energies, and generally agree with values for purified  $\text{Ag}_N$ -DNAs. Stokes shifts are several times larger than for typical organic fluorophores, despite comparable quantum yields of organic fluorophores and  $\text{Ag}_N$ -DNAs.<sup>7–11,25</sup> Examining the distribution of Stokes shift *versus* excitation energy, we observe two separate groupings. We hypothesize that these groupings, which appear correlated with the magic cluster sizes of  $\text{Ag}_N$ -DNAs,<sup>29</sup> arise from structural differences, apart from size only, between smaller, green-emissive  $\text{Ag}_N$ -DNAs and larger, red- or NIR-emissive  $\text{Ag}_N$ -DNAs, resulting in differences in excited state relaxation. Correlations of DNA sequence with  $\text{Ag}_N$ -DNA excitation energy and Stokes shift suggest that the primary role of nucleobase sequence is to select silver cluster size and exci-

tation spectrum; more subtle sequence patterns may vary the magnitude of Stokes shift for clusters of equal size by varying cluster geometry. Finally, we observe 180  $\text{Ag}_N$ -DNA species with single emission peaks but two or more excitation peaks, which may arise from variations in silver cluster geometry, pointing to the diversity of the full palette of possible  $\text{Ag}_N$ -DNAs.

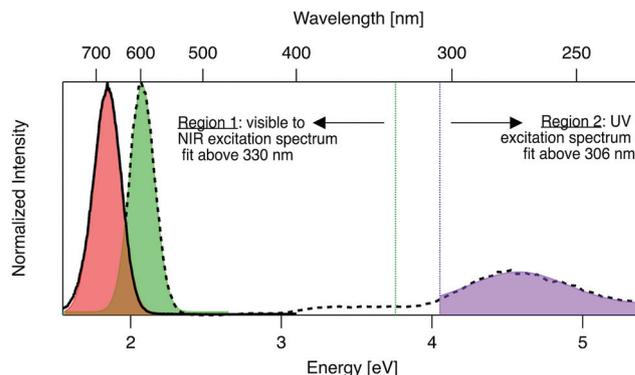
## 2. Methods

### 2.1 Silver cluster synthesis

The 1880 10-base DNA oligomers studied here were subjects of previous studies.<sup>29,55–57</sup> A robotic liquid handler was used to perform parallel  $\text{Ag}_N$ -DNA synthesis in 384 well microplates (described in ESI† and past work<sup>29,56</sup>). To summarize, an aqueous solution of  $\text{AgNO}_3$  and  $\text{NH}_4\text{OAc}$ , pH 7, is mixed *via* pipetting with an aqueous solution of DNA (Integrated DNA Technologies, standard desalting). After 18 minutes, silver-DNA solutions are reduced by a freshly prepared solution of  $\text{NaBH}_4$  in  $\text{H}_2\text{O}$ . Final stoichiometries (20  $\mu\text{M}$  DNA, 10 mM  $\text{NH}_4\text{OAc}$ , 100  $\mu\text{M}$   $\text{AgNO}_3$ , and 50  $\mu\text{M}$   $\text{NaBH}_4$ ) were selected to maximize the number of brightly fluorescent wells and the range of fluorescence colors for 10-base DNA oligomers.<sup>55</sup> Well plates were stored in the dark at 4 °C until measurement 7 days after synthesis. Thus, measured products in this study are time-stable to at least one week.

### 2.2 Spectroscopy and spectral analysis

Emission and excitation spectra were collected with a Tecan Infinite M200 PRO, whose software corrects for lamp profile and detector spectral responsivity. First, 280 nm light was used to universally excite all  $\text{Ag}_N$ -DNA species.<sup>59</sup> Emission spectra were collected from 400 nm to 800 nm (detector sensitivity is significantly limited above  $\sim 800$  nm). A custom routine in Igor Pro (Wavemetrics Inc.) identified wells with single dominant fluorescent products, specifically with emission spectra well-fitted to single Gaussians as a function of energy, with peak energy  $E_{em}$  and full width at half maximum  $< 0.5$  eV (threshold chosen by investigating previously reported linewidths of HPLC-purified  $\text{Ag}_N$ -DNA solutions<sup>7</sup>). For samples satisfying these criteria, excitation spectra were collected by monitoring emission at the fitted peak emission wavelength,  $\lambda_{em} = hc/E_{em}$ , while scanning excitation from 230 nm to  $(\lambda_{em} - 40)$  nm. The portion of each excitation spectrum above 330 nm (Region 1, Fig. 1) was fitted as a function of energy to a single Gaussian to determine peak excitation energy  $E_{ex}$ . The ultraviolet (UV) portion  $< 306$  nm (Region 2, Fig. 1), corresponding to cluster excitation *via* the DNA,<sup>59</sup> was fitted to another single Gaussian. After numerically screening the numbers of peaks and sizes of standard fitting errors to flag outliers, each fit was examined by eye to determine if spectra are truly single Gaussians. For samples whose excitation and emission spectra both exhibit single Gaussian peaks in Region 1, Stokes shift is calculated as  $SS = E_{ex} - E_{em}$ . To compare the relative fluorescence excitation efficiencies in Regions 1 and 2 (Fig. 1), we define the ratio of these peak areas,  $R_{UV/vis} = (\text{area of Region 2 peak})/(\text{area of Region 1 peak})$ , where each peak area is calculated as the product of fitted peak height and fitted peak full width at half maximum. Data is listed in Table S2.†



**Fig. 1** Prototypical excitation (dashed black line) and emission (solid black line) spectra for an  $\text{Ag}_N$ -DNA with single excitation and emission peaks. The emission spectrum is fitted to a single Gaussian (red shading) to determine peak emission energy,  $E_{em}$ . The excitation spectrum is fitted to two single Gaussian peaks, one in the visible-NIR region at fitted peak energy,  $E_{ex}$  (green shaded fit in Region 1), and one in the UV (purple shaded fit in Region 2). Signal between 306–330 nm is excluded due to stray light in some regions of the well plate from an imperfection in the plate reader. Stokes shift,  $SS$ , is calculated as  $SS = E_{ex} - E_{em}$ . The ratio of excitation peak areas in Regions 1 and 2 is defined as  $R_{UV/vis} = (\text{area of green Region 2 peak})/(\text{area of purple Region 1 peak})$ . Fig. S7† shows additional excitation spectra of samples excluded from analysis due to multiple peaks in excitation or emission spectra.

Region 1 peak), where each peak area is calculated as the product of fitted peak height and fitted peak full width at half maximum. Data is listed in Table S2.†

## 3. Results and discussion

$\text{Ag}_N$ -DNAs are well-suited for rapid fluorescence emission spectroscopy due to the universal UV excitation of these clusters *via* the nucleobases. UV excitation of solutions of a single fluorescent  $\text{Ag}_N$ -DNA species (excitation in Region 2, Fig. 1) produces emission spectra of the same line shapes as excitation at the cluster's specific visible-to-NIR excitation peak (green peak in Region 1, Fig. 1).<sup>59</sup> We exploit universal UV excitation for high-throughput spectroscopy to identify samples with single-peaked excitation and emission spectra in Region 1 (Fig. 1). We term this characteristic "spectral purity". HPLC-purified  $\text{Ag}_N$ -DNAs with monodisperse sizes are characterized by (i) emission spectra with single Gaussian peaks with  $< 0.5$  eV linewidths in Region 1,<sup>7,32</sup> and (ii) excitation spectra with two main peaks: a Gaussian peak corresponding to direct excitation of the silver cluster<sup>3</sup> (Fig. 1 Region 1) and a UV peak corresponding to indirect excitation of the cluster *via* the nucleobases<sup>59</sup> (Region 2). Spectral purity in Region 1 can serve as an alternative to harsh chromatographic purification, identifying as-synthesized samples with spectral properties similar to purified  $\text{Ag}_N$ -DNA solutions or to single  $\text{Ag}_N$ -DNA emitters.<sup>47,58</sup> For these spectrally pure  $\text{Ag}_N$ -DNA samples, Stokes shift is  $SS = E_{ex} - E_{em}$ , the difference between peak excitation energy  $E_{ex}$  in Region 1 and peak emission energy  $E_{em}$ .

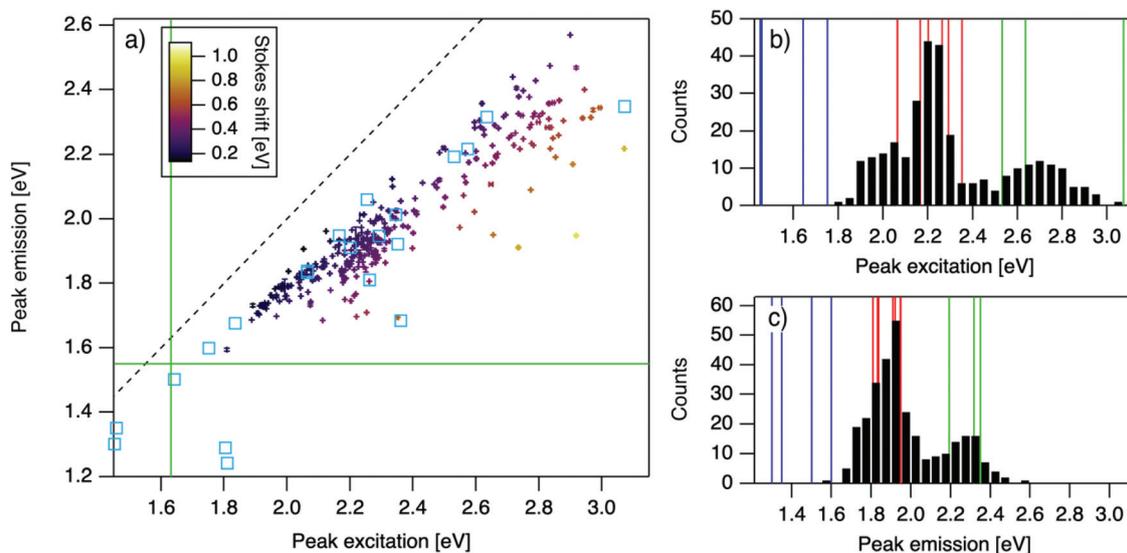
To identify DNA strands which host single dominant fluorescent species, we scanned UV-excited emission spectra of all 1880  $\text{Ag}_N\text{-DNA}$  samples, finding 485 samples with emission spectra well-fitted by a single Gaussian peak of narrow linewidth as a function of energy. Remaining DNA strands either stabilized multiple emissive  $\text{Ag}_N\text{-DNA}$  species, weakly emissive  $\text{Ag}_N\text{-DNAs}$  near or below the detector's signal-to-noise ratio, or no detectable fluorescent  $\text{Ag}_N\text{-DNAs}$  (this study cannot comment on the many  $\text{Ag}_N\text{-DNAs}$  luminescent above  $\sim 800$  nm,<sup>6,60</sup> the effective upper limit of our detector). We then collected excitation spectra in Regions 1 and 2 for the 485 DNA strands by monitoring emission signal at each sample's fitted  $E_{\text{em}}$  (see Methods). 305 of these exhibit single Gaussian excitation peaks centered at  $E_{\text{ex}}$  in Region 1. The remaining 180 samples with single peaked emission spectra but poorly resolved or multi-peaked excitation spectra are discussed in Section 3.5; because we cannot accurately assign  $SS$  in such cases, these samples are excluded from Fig. 2–6. We do not analyze linewidths here because the described method cannot distinguish single  $\text{Ag}_N\text{-DNAs}$  species with broad linewidths from multiple  $\text{Ag}_N\text{-DNA}$  species with very closely spaced energies.

### 3.1 Stokes shifts of spectrally pure $\text{Ag}_N\text{-DNAs}$

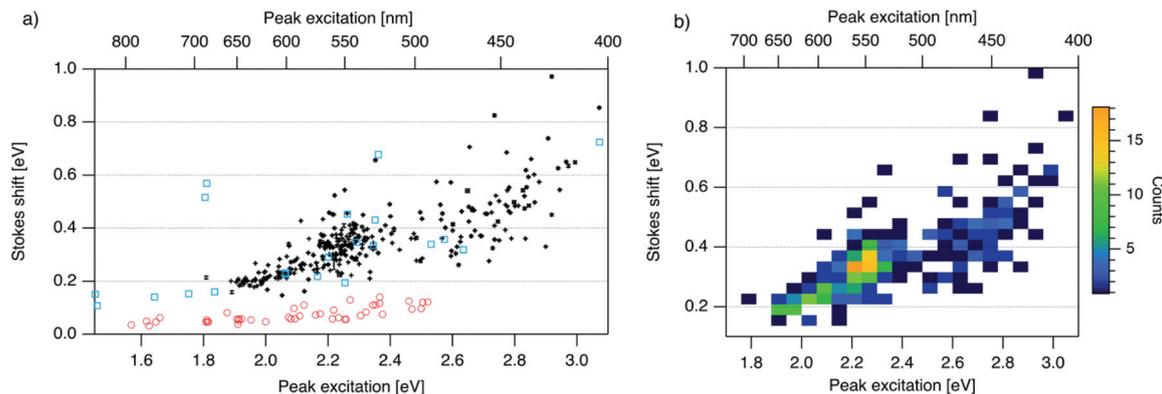
For the 305 spectrally pure samples which may be reasonably assigned to a single  $\text{Ag}_N\text{-DNA}$  species,  $E_{\text{em}}$  scales roughly linearly with  $E_{\text{ex}}$  (Fig. 2a). Such scaling is also characteristic of fluorescent organic dyes.<sup>61</sup> The distribution of  $(E_{\text{ex}}, E_{\text{em}})$  values for spectrally pure samples are comparable to those reported for purified  $\text{Ag}_N\text{-DNAs}$  (cyan squares, Fig. 2a).

The multimodal histograms of  $E_{\text{ex}}$  and  $E_{\text{em}}$  (Fig. 2b and c) are expected due to the enhanced stabilities of certain  $\text{Ag}_N\text{-DNAs}$  with “magic numbers” of neutral silver atoms,  $N_0$ .<sup>29</sup> This magic number behavior has been shown to result in a bimodal distribution of  $E_{\text{em}}$  in the visible spectrum, which agrees with Fig. 2c. Fig. 2b shows that the distribution of  $E_{\text{ex}}$ , which has not previously been reported for  $10^2$   $\text{Ag}_N\text{-DNAs}$ , is also multi-peaked. Comparison of the peaks in Fig. 2b with measured  $E_{\text{ex}}$  for magic number  $\text{Ag}_N\text{-DNAs}$  (colored lines, Fig. 2b) suggests that, just as for peak emission, magic sizes of  $\text{Ag}_N\text{-DNAs}$  lead to enhanced abundances of certain excitation energies due to the strong correlation reported between  $N_0$  and  $E_{\text{ex}}$ .<sup>7,28–30</sup> Two of the purified  $\text{Ag}_N\text{-DNAs}$  with  $E_{\text{ex}}$  and  $E_{\text{em}}$  presented in Fig. 2b and c are stabilized by 10-base DNA strands within the 1880 studied in high throughput here. One of these, a red-emissive  $\text{Ag}_N\text{-DNA}$  with  $N_0 = 6$ , was identified as spectrally pure in our high-throughput studies. The second, a green-emissive  $\text{Ag}_N\text{-DNA}$  with  $N_0 = 4$ , exhibits a small secondary green emission peak (this secondary product may be removed by HPLC) and was therefore excluded from the set of spectrally pure  $\text{Ag}_N\text{-DNAs}$ .<sup>29</sup> HR-MS studies of additional  $\text{Ag}_N\text{-DNAs}$  may further explain the distribution in Fig. 2b, especially in the 1.9–2.4 eV range where multiple peaks may suggest distinct cluster sizes and/or geometries.

To investigate the energy relaxation process in  $\text{Ag}_N\text{-DNAs}$ , we examine the distribution of steady-state Stokes shifts,  $SS$ , of the 305 spectrally pure  $\text{Ag}_N\text{-DNAs}$ . Past high-throughput studies of  $\text{Ag}_N\text{-DNAs}$  focused solely on  $E_{\text{em}}$ ,<sup>29</sup> but it is difficult to discern excited state behavior from  $E_{\text{em}} = E_{\text{ex}} - SS$  because  $E_{\text{ex}}$  and  $SS$  are determined by distinct processes.  $\text{Ag}_N\text{-DNA}$  composition and ground state geometry determine  $E_{\text{ex}}$  (or, rather,



**Fig. 2** (a)  $E_{\text{em}}$  versus  $E_{\text{ex}}$  for purified  $\text{Ag}_N\text{-DNAs}$  (cyan squares; data from previous studies,<sup>6,7,11,28,29,32</sup>) and the spectrally pure  $\text{Ag}_N\text{-DNAs}$  identified here (data points with error bars; colors correlate to Stokes shift magnitude as indicated by upper left color bar). Error bars represent standard deviations of Gaussian least squares fits. Dashed black line indicates  $E_{\text{em}} = E_{\text{ex}}$ , ( $SS = 0$ ). Solid green lines are equivalent to the upper spectral wavelength limits of this study. (b and c) Histograms of (b)  $E_{\text{ex}}$  and (c)  $E_{\text{em}}$  of single-peaked  $\text{Ag}_N\text{-DNA}$  (black bars). Fourteen colored vertical lines represent (b)  $E_{\text{ex}}$  and (c)  $E_{\text{em}}$  of purified  $\text{Ag}_N\text{-DNAs}$  with  $N_0 = 4$  (green),  $N_0 = 6$  (red), and  $N_0 = 10$  to 12 (blue), as determined by MS.<sup>6,7,28,29</sup>



**Fig. 3** (a) *SS* versus  $E_{\text{ex}}$  for spectrally pure solutions of  $\text{Ag}_N$ -DNAs (black), previously characterized HPLC-purified  $\text{Ag}_N$ -DNAs (cyan squares),<sup>6,7,11,28,29,32</sup> and organic fluorophores which are commonly used to label oligonucleotides (red circles).<sup>81</sup> Vertical and horizontal error bars of black points represent standard deviations; other markers are larger in size than associated standard deviations. (b) Heatmap of the data for spectrally pure  $\text{Ag}_N$ -DNAs from (a) illustrates relative abundance of certain pairs of ( $E_{\text{ex}}$ , *SS*) (legend indicates color meaning).

a manifold of excitation energies) required to promote the silver cluster to an initial excited state. This excited state then relaxes to a lower-energy excited state from which photoemission occurs. The energy lost between photoexcitation and photoemission determines *SS*. Thus, to decouple consideration of the initial excitation process from the energetic relaxation process(es), we plot *SS* as a function of  $E_{\text{ex}}$  (Fig. 3a). *SS* grows roughly linearly with  $E_{\text{ex}}$ , but *SS* values vary significantly for a given  $E_{\text{ex}}$ . This variance represents 10–25% of excitation energy at  $E_{\text{ex}} = 2.3$  eV (spectral region corresponding to magic number  $N_0 = 6$ ) and 10–30% at  $E_{\text{ex}} = 2.7$  eV (corresponding to magic number  $N_0 = 4$ ) (Fig. S1†). While *SS* variance is lesser for lower values of  $E_{\text{ex}}$ , we cannot rule out the possibility that this may be caused by reduced spectral sensitivity of the plate reader above 800 nm.

In all spectral regions,  $\text{Ag}_N$ -DNAs exhibit *SS* values which are several times larger than typical organic fluorophores (Table S1†), and *SS* also grows about four times faster with increasing  $E_{\text{ex}}$  for  $\text{Ag}$ -DNAs than for the organic fluorophores (red circles, Fig. 3a, and Fig. S2†). This behavior is remarkable considering the comparably high quantum yields of  $\text{Ag}_N$ -DNAs and organic dyes. General agreement between ( $E_{\text{ex}}$ , *SS*) values for HPLC-purified  $\text{Ag}_N$ -DNAs (cyan squares) and spectrally pure  $\text{Ag}_N$ -DNAs suggests that HPLC-purified  $\text{Ag}_N$ -DNAs are generally representative of excitation and emission properties of  $\text{Ag}_N$ -DNAs produced by the chemical synthesis method here.

We note that black and cyan data points at ( $E_{\text{ex}}$ , *SS*)  $\approx$  (2.35 eV, 0.65 eV) represent the same DNA strand, 5'-CACCTAGCGA-3', which stabilizes an  $\text{Ag}_N$ -DNA with exceptionally high *SS*, whose crystal structure was reported by Cerretani, *et al.*<sup>11,31,42</sup> Second, most of the spectrally pure  $\text{Ag}_N$ -DNAs were designed using machine learning methods.<sup>55–57</sup> The subset of data for DNA template strands with randomly selected DNA sequences is shown in Fig. S3.† This data generally agrees with the trend in Fig. 3a, supporting that the designed  $\text{Ag}_N$ -DNAs do not alter the ( $E_{\text{ex}}$ , *SS*) distribution. Fig. S4† displays a histogram of *SS* for spectrally pure  $\text{Ag}_N$ -DNAs with overlaid *SS*

values for purified  $\text{Ag}_N$ -DNAs sized by HR-MS.<sup>6,7,28,29</sup>  $N_0$  and  $N_+$  values for each of the 14 purified  $\text{Ag}_N$ -DNAs are indicated. While *SS* appears to increase with increasing  $N_+$  for  $\text{Ag}_N$ -DNAs with  $N_0 = 6$ , this trend is not preserved at other  $N_0$ . With few HR-MS data available, more studies are needed to determine how  $N_0$  and  $N_+$  influence *SS*.

Because many data points overlap in Fig. 3a, a heat map in Fig. 3b quantifies abundance of ( $E_{\text{ex}}$ , *SS*) values, showing that data form two distinct groupings below and above  $E_{\text{ex}} = 2.45$  eV. These two populations align with  $E_{\text{ex}}$  values of magic number sizes of HPLC-purified  $\text{Ag}_N$ -DNAs:  $E_{\text{ex}} > 2.5$  eV corresponds to  $N_0 = 4$  neutral  $\text{Ag}$  atoms, and  $2.0 \text{ eV} < E_{\text{ex}} < 2.4$  eV corresponds to  $N_0 = 6$  (Fig. 2b, vertical colored lines).<sup>28,29</sup> It is reasonable to hypothesize that energy relaxation following initial excitation would differ somewhat for distinct sizes of clusters due to differences in energy loss mechanisms. Crystal structures of  $\text{Ag}_N$ -DNAs, while few, suggest that a structural difference between  $N_0 = 4$  and  $N_0 \geq 6$   $\text{Ag}_N$ -DNAs exists, beyond size only. Huard, *et al.*, found an elongated, planar structure for an  $\text{Ag}_8$ -DNA with 450 nm maximum absorption.<sup>5</sup>  $N_0$  is unknown for this  $\text{Ag}_8$ -DNA, but it is spectrally similar to  $N_0 = 4$   $\text{Ag}_N$ -DNAs, and a similar planar structure was suggested by a computational study for a 4-electron cluster.<sup>62</sup> Cerretani, *et al.*, reported cylindrical structures for several  $\text{Ag}_{16}$ -DNAs.<sup>14,31,42</sup> These  $\text{Ag}_{16}$ -DNAs also lack assigned  $N_0$  but have  $E_{\text{ex}}$  and  $E_{\text{em}}$  consistent with  $N_0 \geq 6$   $\text{Ag}_N$ -DNAs. Combined with the trend of *SS* versus  $E_{\text{ex}}$  of the 305 spectrally pure  $\text{Ag}_N$ -DNAs, these few reported crystal structures could support that the silver cluster structure undergoes a planar-to-cylindrical transition between  $N_0 = 4$  and  $N_0 = 6$ . Such a structural transition would change the number of nearest-neighbor bonds formed between  $\text{Ag}$  atoms in the cluster, possibly resulting in different energy relaxation for these two structures. Future studies are needed to test this hypothesis.

### 3.2 Comparison of direct and indirect $\text{Ag}_N$ -DNA excitation

In addition to direct excitation of the silver cluster at the visible/NIR excitation peak  $E_{\text{ex}}$  which depends on cluster struc-

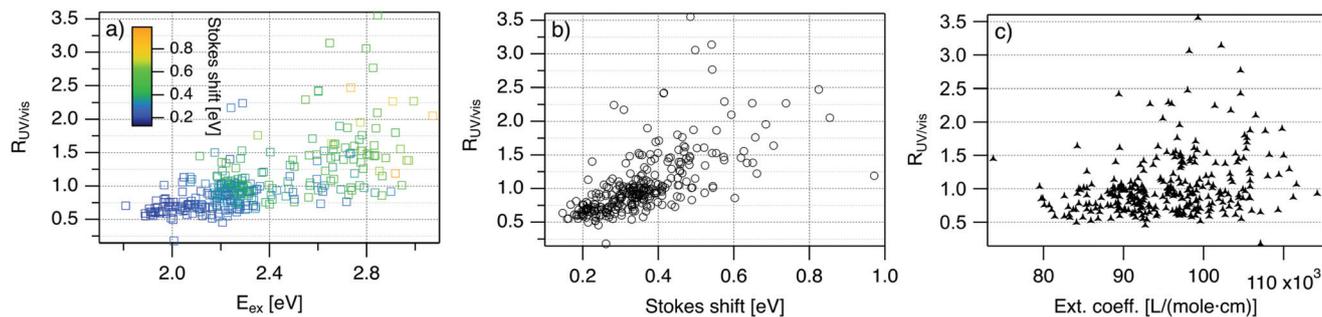


Fig. 4  $R_{UV/vis}$ , ratio of areas of UV excitation peak (Region 2) to excitation peak (Region 1), as a function of (a)  $E_{ex}$ , (b) SS, and (c) extinction coefficient of the template DNA strand, calculated using the nearest neighbor model.<sup>64,65</sup>

ture,<sup>3</sup> the same  $Ag_N$ -DNA fluorescence can be excited indirectly *via* the nucleobases, which absorb most efficiently at 260–280 nm.<sup>59</sup> This UV excitation enables rapid emission spectroscopy of  $Ag_N$ -DNA<sup>29</sup> but remains poorly understood. For purified fluorescent  $Ag_N$ -DNAs, direct and indirect excitation produce emission spectra with identical shapes and line-widths.<sup>59</sup> One study reported ultrafast energy transfer from DNA bases to  $Ag_N$ -DNAs following UV-excitation,<sup>63</sup> but the authors are not aware of studies directly comparing lifetimes or quantum yields of direct *versus* indirect excitation of  $Ag_N$ -DNA fluorescence.

To investigate the UV-excited fluorescence process of  $Ag_N$ -DNAs, we compare the excitation efficiencies of indirect and direct excitation. We use the ratio of indirect to direct excitation peak areas,  $R_{UV/vis}$ , as a *relative* metric of excitation efficiency. The absolute excitation peak area, which is determined by a combination of extinction coefficient, fluorescence quantum yield, and chemical yield of  $Ag_N$ -DNA synthesis, cannot be used to compare multiple samples because an  $Ag_N$ -DNA species produced in high synthesis yield but with low extinction coefficient and low quantum yield is indistinguishable from an  $Ag_N$ -DNA species produced in low synthesis yield with high extinction coefficient and high quantum yield. Instead, a relative comparison of excitation peaks in Regions 1 and 2 (Fig. 1) using the metric  $R_{UV/vis}$  allows us to decouple chemical yield from other factors determining excitation efficiency.

Fig. 4 displays  $R_{UV/vis}$  as a function of  $E_{ex}$ , SS, and extinction coefficient. On average,  $R_{UV/vis}$  increases with increasing  $E_{ex}$ , corresponding to greater UV excitation efficiency of smaller clusters with larger  $E_{ex}$  than of larger clusters with lower  $E_{ex}$  (Fig. 4a).  $R_{UV/vis}$  also generally increases as SS increases (Fig. 4b); this is expected due to the trend of SS *versus*  $E_{ex}$  in Fig. 3, but  $R_{UV/vis}$  does trend more strongly with SS than with  $E_{ex}$ .  $R_{UV/vis}$  does not depend strongly on extinction coefficient of the DNA template strand, which is a function of nucleobase content (Fig. 4c, calculated using the nearest neighbor model.<sup>64,65</sup>). Thus, trends in Fig. 4 are not only due to how well the DNA template absorbs UV photons but also to the properties of silver clusters themselves.

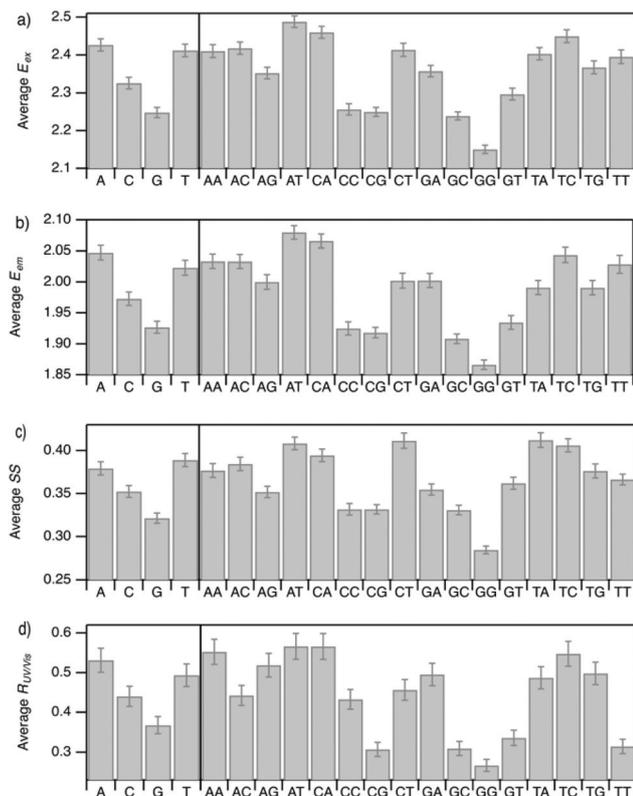
The correlation of  $R_{UV/vis}$  with  $E_{ex}$  can be rationalized by two factors. First,  $Ag_N$ -DNA cluster core size,  $N_0$ , increases as  $E_{ex}$  decreases.<sup>29</sup> Because visible-NIR extinction coefficients of  $Ag_N$ -DNAs scale linearly with  $N_0$ ,<sup>28</sup> visible-NIR excitation peak area will increase as  $E_{ex}$  decreases, causing  $R_{UV/vis}$  to decrease as  $E_{ex}$  decreases. Second, UV excitation may be more efficient for smaller, greener  $Ag_N$ -DNAs than for larger, redder clusters due to increased overlap of small clusters' energy levels with the nucleobase energy levels. More detailed studies, such as time-resolved infrared spectroscopy to monitor nucleobase excitations,<sup>66</sup> could investigate whether one or both of these factors determine the behavior in Fig. 4a.

The correlation of  $R_{UV/vis}$  with SS is, in large part, due to the linear correlation of SS with  $E_{ex}$  (Fig. 3a). We speculate that the slightly stronger correlation of  $R_{UV/vis}$  with SS than with  $E_{ex}$  may be caused by stronger coupling of smaller, greener clusters with the DNA, resulting in greater energy relaxation relative to larger clusters. Significant spread of  $R_{UV/vis}$  values for a single SS or  $E_{ex}$  value may arise from variations in cluster attachment to the DNA, *e.g.*, the strength of coupling of the cluster to the nucleobases. Further studies are needed to determine the origin of this spread.

### 3.3 Role of base sequence in selecting $Ag_N$ -DNA optical properties

Improved understanding of the sequence-dependence of  $Ag_N$ -DNAs can enable rational design of fluorophores with custom properties. We previously applied data mining and machine learning to a data library of  $10^3$  DNA sequences to uncover nucleobase patterns (“motifs”) correlated with the value of  $E_{em}$ .<sup>56</sup> When combined with machine learning, these motifs are effective building blocks for designing new  $Ag_N$ -DNAs with desired values of  $E_{em}$ .<sup>56,57</sup> To also investigate how DNA sequence selects  $E_{ex}$ , SS, and  $R_{UV/vis}$ , we analyze correlations of DNA base motifs to values of  $E_{ex}$ ,  $E_{em}$ , SS, and  $R_{UV/vis}$ . (305 spectrally pure  $Ag_N$ -DNAs is rather few for machine learning, so we examine statistical correlations of base patterns with  $Ag_N$ -DNA optical properties.)

Fig. 5 displays mean values of  $E_{ex}$ ,  $E_{em}$ , SS, and  $R_{UV/vis}$  for single nucleobases (A, C, G, T) and two-base motifs in the 305 spectrally pure  $Ag_N$ -DNA template sequences (means are



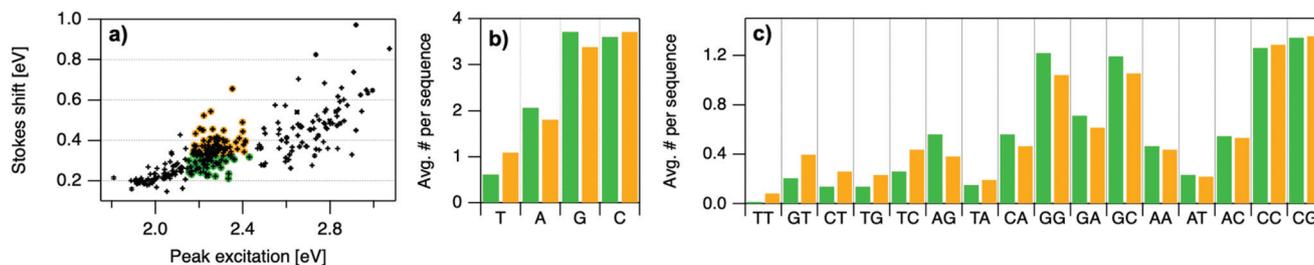
**Fig. 5** Mean values of (a)  $E_{\text{ex}}$ , (b)  $E_{\text{em}}$ , (c)  $SS$ , and (d)  $R_{\text{UV/vis}}$  for each instance of the four nucleobases and the 16 possible two-base motifs in the set of DNA template sequences for the 305 spectrally pure  $\text{Ag}_N$ -DNAs. Error bars represent standard error, as a measure of precision of the mean.

weighted by number of occurrences of each base pattern in a given DNA sequence). Fig. S5† also displays means for three-base motifs. Correlations of DNA sequence with  $E_{\text{em}}$  (Fig. 5b) agree with previous findings<sup>56,57</sup> that A-rich motifs are correlated with greener emission (higher energies) and consecutive G's are strongly correlated with redder emission (lower energies). This agreement is expected because the 305 spectrally pure  $\text{Ag}_N$ -DNAs were included in those previous studies. The association of smaller, greener clusters with A-rich motifs and larger, redder clusters with G-rich motifs has been suggested

to arise from varying affinities of silver cations for different nucleobases.<sup>67</sup>

We observe that relative trends of mean  $E_{\text{ex}}$ ,  $E_{\text{em}}$ ,  $SS$ , and  $R_{\text{UV/vis}}$  values in Fig. 5 are similar to one another. (Because  $E_{\text{em}}$  is a linear combination of  $E_{\text{ex}}$  and  $SS$ , this similarity is expected for  $E_{\text{em}}$ .) In Fig. 5a, c, and d, nucleobases A and T are associated with higher values of  $E_{\text{ex}}$ ,  $SS$ , and  $R_{\text{UV/vis}}$ , while G is associated with lower values of each of these parameters. Trends for two-base motifs are also similar among all parameters, with some distinct differences for  $R_{\text{UV/vis}}$ . This trend is expected given roughly linear correlations of  $SS$  and  $R_{\text{UV/vis}}$  with  $E_{\text{ex}}$  (Fig. 2a, 3a and 4a) and shows that DNA sequence patterns which select for the excitation energy  $E_{\text{ex}}$  from ground state to initial unrelaxed excited state (Franck Condon state) are also predictive of the magnitude of  $SS$ , the energy lost during relaxation following excitation. A lack of obviously distinct sequence patterns which encode  $SS$  and  $E_{\text{ex}}$  could support that energy relaxation is due to a delocalized relaxation across the entire cluster and/or DNA template, as opposed to specific relaxation of one or a few excited nucleobases. Because  $E_{\text{ex}}$ ,  $SS$ , and  $R_{\text{UV/vis}}$  do not appear to be separately tuned by distinct DNA base motifs to a significant degree, designing an  $\text{Ag}_N$ -DNA with custom values for each of these optical properties is likely to be a significant challenge, although three-base motifs may enable such prediction (Fig. S5†), which is the subject of ongoing work.

To elucidate if subtler sequence features determine  $SS$  irrespective of  $E_{\text{ex}}$ , we consider the most abundant peak in Fig. 2b:  $2.15 \text{ eV} < E_{\text{ex}} < 2.45 \text{ eV}$ . HPLC-purified  $\text{Ag}_N$ -DNAs in this spectral range have  $N_0 = 6$  neutral Ag atoms. The 145 DNA sequences in this peak are separated into two categories above and below their median  $SS$  value (Fig. 6a). Average numbers of nucleobase, 2-base, and 3-base patterns are calculated for both categories. Fig. 6b and c display average numbers of bases and 2-base motifs in sequences correlated to higher (orange) and lower (green)  $SS$  categories, with base patterns ordered left-to-right in order of the relative difference between average occurrence in the two classes, which is a metric of predictiveness of  $SS$  value for each base pattern (3-base patterns in Fig. S6†). For this specific spectral window, inclusion of T bases generally increases  $SS$ , while A and G bases tend to reduce  $SS$ . Interestingly, A-rich motifs were correlated to higher  $SS$  values when considering the entire 305 spectrally pure  $\text{Ag}_N$ -DNAs, but



**Fig. 6** (a) Indication of low  $SS$  (green) and high  $SS$  (orange) categories, separated at the median value of  $SS = 0.336 \text{ eV}$ . b, (c) Motifs are sorted left to right in order of greatest relative difference between orange and green bars.

their role for selecting *SS* for a given color window may be more nuanced. C is less predictive of *SS*, and behavior of 2-base motifs containing C's is generally predicted by A, G, and T content.

The differences in *SS* behavior of  $\text{Ag}_N$ -DNAs stabilized by A- and G-rich strands as compared to T-rich strands are somewhat unexpected if one assumes that strength of silver-nucleobase bonds should control *SS* magnitude. Thymines are not expected to bind the silver cluster and adenines are expected to bind rather weakly, as compared to strong affinities of cytosine and guanine for silver.<sup>67,68</sup> The few crystal structures available for  $\text{Ag}_N$ -DNAs show that A can coordinate the silver cluster,<sup>69</sup> although a separate study of a DNA- $\text{Ag}^+$  complex finds that adenines protrude outward from  $\text{Ag}^+$ -mediated DNA duplexes.<sup>5,14,31</sup> T is similarly observed to protrude away from silver clusters.<sup>70</sup> While solved  $\text{Ag}_N$ -DNA structures are scant and may not be representative of general behavior, we note that differences in *SS* of  $\text{Ag}_N$ -DNAs in Fig. 6 do not appear to be explained simply by total silver-binding power of the DNA template, due to the similar *SS* values correlated with A- and G-rich motifs. The relaxation dynamics of a more tightly bound cluster would be expected to differ from a weakly bound cluster. Since G likely binds to the cluster more strongly than A, this simple model is unlikely.

Other possible mechanisms for finer variations in *SS* behavior include cluster structural variations and slight differences in vibrational modes of nucleic acids, which are measured in the range of 0.19 eV to 0.21 eV.<sup>14,31</sup> Thymine has the highest frequency modes of the set of natural nucleobases in DNA,<sup>71</sup> which could increase *SS* of T-containing  $\text{Ag}_N$ -DNAs if energy relaxation occurs *via* vibrational modes (discussed below). A and G are both purines with bulkier sizes than T, which may affect energy relaxation of the excited cluster. It is unclear whether the vibrational modes of free nucleobases are representative of silver-bound nucleobases, and more crystal structures must be solved to understand how structure contributes to *SS* and how the four nucleobases coordinate silver clusters.

### 3.4 Possible origins of the Stokes shift in $\text{Ag}_N$ -DNAs

By the Franck-Condon principle, *SS* is determined by processes which follow photoexcitation.<sup>71</sup> Possible mechanisms for energy relaxation processes in  $\text{Ag}_N$ -DNAs include electronic dephasing, vibrational relaxation, and charge transfer. Measured vibrational modes of nucleic acids, 0.19 eV to 0.21 eV,<sup>72</sup> roughly correspond to the lower limit of *SS* values observed (Fig. 3a), which could support an energetic relaxation process *via* excitation of one or more vibrational modes in the nucleic acids of the surrounding DNA ligand. However, vibrational modes of nucleic acids bound to silver cations may differ from free nucleic acids. Calculations by Weerawardene and Aikens for thiolate-protected gold clusters found that changes in cluster geometry after excitation, *i.e.* nuclear rearrangement of Au atoms, lead to electronic structure changes that produce a Stokes shifts, and the magnitude of these geometric changes are correlated to the magnitude of *SS*.<sup>53</sup> Calculations of thiolate-protected Ag clusters also find

geometric relaxation following excitation with a magnitude that is smaller for larger clusters, leading to inverse correlation of cluster size and  $SS^{73-75}$  which matches what is observed here for  $\text{Ag}_N$ -DNAs.

The extremely rapid 10–100 fs energy relaxation observed immediately following  $\text{Ag}_N$ -DNA excitation<sup>45</sup> may be too fast to be caused solely by geometric relaxation of cluster and/or DNA ligand structure or by charge transfer.<sup>50-52</sup> However, *ab initio* calculations of small atomic chains of Ag atoms found ~100 fs plasmon dephasing due to certain molecular vibrations in 1-dimensional atomic Ag chains.<sup>71</sup> Thus, the unusual ultrafast energy relaxation process in  $\text{Ag}_N$ -DNAs may be of mixed character, involving both electronic dephasing and geometric relaxation. A recent study used ultrafast time-resolved infrared spectroscopy to monitor vibrational modes of DNA nucleobases following excitation of two green-emissive  $\text{Ag}_N$ -DNAs at their visible excitation wavelengths. Upon excitation, vibrational modes of certain nucleobases were found to bleach.<sup>76</sup> Because isolated nucleobases require higher energy (UV) excitation to undergo bleaching, this suggests an intimate and intriguing connection between the silver cluster and its nucleobase ligands. Future studies are needed to understand how electronic dephasing, vibrational relaxation, and/or charge transfer contribute to the origins of Stokes shift in  $\text{Ag}_N$ -DNAs. Such studies could shed light on why  $\text{Ag}_N$ -DNAs retain high quantum yields and *SS* values several times larger than organic fluorophores, even into the NIR.<sup>66</sup>

### 3.5 Multi-peaked excitation spectra: heterogeneous samples or fundamentally different $\text{Ag}_N$ -DNA structures?

Of the 485  $\text{Ag}_N$ -DNA samples which exhibited single-peaked emission spectra, 305 of these also exhibited single-peaked excitation spectra (*e.g.* Fig. 1) while the remaining 180 samples exhibited excitation spectra with poorly resolved peaks, asymmetric peaks or, for 88 samples, multiple peaks > 350 nm. Fig. S7† illustrates representative examples of these excitation spectra. The most common secondary peak observed was in the near UV between the nucleobase absorption band and the dominant Region 1 peak (Fig. 1); this peak appeared in 63 samples. While it is most convenient to simply dismiss these samples as heterogeneous mixtures of different clusters indiscernible by emission spectra only (which is reasonable for poorly resolved or asymmetric peaks), we cannot rule out the possibility that some multi-peaked samples may represent single  $\text{Ag}_N$ -DNA species with spectral features which fundamentally differ from the well-studied HPLC-stable  $\text{Ag}_N$ -DNAs with single Gaussian excitation peaks in Region 1 (Fig. 1). As described in Methods, all measurements were performed one week after  $\text{Ag}_N$ -DNA synthesis to capture only time-stable products.  $\text{Ag}_N$ -DNAs evolve in the hours to few days after synthesis but generally stabilize well before one week.<sup>13</sup> Thus, it is unlikely that  $\text{Ag}_N$ -DNAs undergo significant evolution in size/shape during collection of emission spectra and excitation spectra, which would cause the appearance of multiple excitation peaks. Another possible cause of  $\text{Ag}_N$ -DNAs with single-peaked emission spectra but multi-peaked excitation

spectra is when a single DNA template strand forms two different  $\text{Ag}_N$ -DNA species with equal  $E_{\text{em}}$ , one with low  $SS$  and one with high  $SS$ . The probability of this occurring in such a large fraction of samples is highly unlikely. Finally, larger silver nanoparticles display size-dependent surface plasmon resonances,<sup>77</sup> but excitation of surface plasmons in nanoparticle impurities should not induce fluorescence in separate  $\text{Ag}_N$ -DNAs that coexist in solution.

A final possibility is that certain  $\text{Ag}_N$ -DNAs inherently have multiplexed excitation spectra, with a dominant visible-NIR peak and a secondary peak, typically between 3 eV and 3.5 eV. Secondary excitation peaks at 3–3.5 eV have been observed in a few HPLC-purified  $\text{Ag}_N$ -DNAs.<sup>78</sup> A particularly stable and bright  $\text{Ag}_N$ -DNA which emits at 670 nm has a primary excitation peak at 600 nm and a secondary excitation peak at 400 nm.<sup>28</sup> Secondary excitation peaks at energies  $>E_{\text{ex}}$  are consistent with fluorescence arising from an initial collective excitation in  $\text{Ag}_N$ -DNAs.<sup>10</sup> In this model, the dominant visible-NIR excitation peak corresponds to a longitudinal collective electronic oscillation along the silver cluster rod. In this rod, a transverse collective mode is also expected. Computational studies find that this mode is damped in straight atomic Ag chains,<sup>28</sup> but simulations of atomic Ag chains with chiral twist find that as chirality increases, transverse excitation peaks become more prominent.<sup>79</sup> We hypothesize that some  $\text{Ag}_N$ -DNAs with increased curvatures host more prominent transverse excitation modes which also lead to  $\text{Ag}_N$ -DNA fluorescence.  $\text{Ag}_N$ -DNAs with higher curvature may not have been observed in large numbers due to lower stabilities under HPLC as compared to straighter  $\text{Ag}_N$ -DNAs.

## 4. Conclusions

We present the first high-throughput study probing Stokes shifts of  $\text{Ag}_N$ -DNAs across the diverse spectral range of these nanoclusters. By using spectral purity to identify 305 samples containing a single fluorescent  $\text{Ag}_N$ -DNA species, we found that Stokes shifts for these samples vary widely and are several times larger than organic fluorophores, despite the molecular-like high quantum yields of  $\text{Ag}_N$ -DNAs.<sup>30,80</sup> The distribution of peak excitation energies and Stokes shifts suggests that there may exist distinctions between excited state relaxation processes in  $\text{Ag}_N$ -DNAs with  $N_0 = 4$  and  $N_0 \geq 6$  neutral Ag atoms. By comparing to crystal structures available for  $\text{Ag}_N$ -DNAs,<sup>5,14,31,42</sup> we propose that  $\text{Ag}_N$ -DNA cluster structure transitions from planar to cylindrical between  $N_0 = 4$  and  $N_0 = 6$ , resulting in different magnitudes of energy relaxation following photoexcitation. Future studies are needed to test this hypothesis.

We also found strong correlations between certain DNA sequence patterns and peak excitation energy. Because Stokes shift scales strongly with excitation energy, sequence patterns predictive only of Stokes shift but not of excitation energy are more subtle. This suggests that the primary role of DNA sequence is to select the silver cluster's structure, which plays

the dominant role in determining the energy relaxation process following photoexcitation. Finer variations of cluster geometry and/or the cluster's interaction with its DNA template may cause the significant spread of Stokes shifts observed for  $\text{Ag}_N$ -DNAs with equal excitation energies. Finally, we observe a significant minority of  $\text{Ag}_N$ -DNAs with single-peaked emission spectra yet multiple peaks in excitation spectra, particularly in the near UV. The prevalence of these samples, and the near UV energies of their peaks, could correspond to transverse collective excitation modes of clusters with greater chirality, as predicted by *ab initio* calculations.<sup>5,14,31</sup> We hope that the extensive data set presented here will enable computational studies of fluorescence excitation and emission processes in  $\text{Ag}_N$ -DNAs.

## Conflicts of interest

There are no conflicts to declare.

## Acknowledgements

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