Supplementary Information for:

# Investigating the Mechanism of Post-Treatment on 

## PEDOT:PSS via Single-Particle Absorption

## Spectroscopy

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Sample Preparation and Treatment Conditions: For the total collected data set of PEDOT:PSS particles shown in the main text, a total of 36 toroidal microresonators over 4 chips (labelled 4I, $2 \mathrm{O}, 3 \mathrm{H}, 4 \mathrm{~J}$ ) were used to collect 147 PEDOT:PSS particles in the pristine data set. For thermal treatment conditions, see Methods. For DMSO treatment, $80-100 \mu \mathrm{~L}$ of HPLC or biology grade DMSO was pipetted on the toroid chip, wetting the whole chip, and was left to stand for 5 minutes, then spun at 4000 rpm for $60-120$ seconds to dry the chips. Sometimes, an additional spin-coating at 5300 rpm was needed to completely dry the DMSO off the chip. Sometimes, DMSO introduced additional large contaminants, and any objects overwhelmed by the photothermal signal of contaminants were excluded from the DMSO data set. Differences between data sets from different chips for the M and $\sigma$ values as well as their changes are plotted below and show no significant differences (Figure S1). Spin-coating was used rather than air drying or heating because of concerns of the longer DMSO exposure's ability to completely solubilize and wash away all the particles on the resonator.


Figure S1. a) Experimentally observed values of $M$ vs. $\sigma$ and b) $\Delta \mathrm{M}$ vs. $\Delta \sigma$ for Chip $2 \mathrm{O}(-)$, Chip 3H (-), Chip 4I (-), and Chip 4J (-).

Calculations: As stated in the main text, the average absorption cross section $(\sigma)$ for a given particle was calculated by averaging the absorption cross section spectrum over the wavelength range from 1285 nm to 1335 nm , truncating the ends of the laser's tunability range due to noise from low laser power at the ends of its spectral range. Because the cross sections of the particles measured span several orders of magnitude, the absorption cross sections are plotted on a log scale. The changes in absorption cross section after a given treatment is also given as a log plot: $\Delta \sigma=\log _{10}\left(\sigma_{\text {after treatment }} / \sigma_{\text {before treatment }}\right)$, where $\sigma_{\text {before treatment }}$ is the absorption cross section of the particle before a given treatment, and $\sigma_{\text {after treatment }}$ is the absorption cross section of the particle after a treatment. Thus, $\Delta \sigma_{\text {post-heat }}=\log _{10}\left(\sigma_{\text {post-heat }} / \sigma_{\text {pristine }}\right)$ and $\Delta \sigma_{\text {post-DMSO }}=\log _{10}\left(\sigma_{\text {post-DMSO }} / \sigma_{\text {post- }}\right.$ heat).

The depth of modulation (M) was found as previously described ${ }^{1-2}$ similar to studies of fluorescent polymers ${ }^{1,3}$. The polarization dependent absorbance was fit to the following equation: $\sigma(\theta)=\sigma_{\max }\left(1-\mathrm{M} \sin ^{2}\left(\theta-\theta_{\max }\right)\right)$, where $\sigma(\theta)$ is the absorption cross section at a given polarization angle of the pump beam's linearly polarized light. $\sigma_{\max }$ is the maximum absorption cross section at the pump polarization angle $\theta_{\text {max }}$, referred to as a particle's peak angle. M is the
depth of modulation with $\mathrm{M}=1$ indicating well aligned chromophores and $\mathrm{M}=0$ indicating poorly aligned chromophores.

The difference in depth of modulation is given by: $\Delta \mathrm{M}=\mathrm{M}_{\text {after treatment }}-\mathrm{M}_{\text {before treatment }}$, where $\mathrm{M}_{\text {before treatment }}$ is a particle's depth of modulation before treatment, and $\mathrm{M}_{\text {after treatment }}$ is the depth of modulation after a given treatment. Thus, $\Delta \mathrm{M}_{\text {post-heat }}=\mathrm{M}_{\text {post-heat }}-\mathrm{M}_{\text {pristine }}$ and $\Delta \mathrm{M}_{\text {post-DMSO }}$ $=\mathrm{M}_{\text {post-DMSO }}-\mathrm{M}_{\text {post-heat }}$.

Between treatments, the pump polarization angle at which maximum absorption occurred, referred to as peak angle or $\theta_{\text {max }}$, would change. As rotating pump polarization is equivalent for two angles $180^{\circ}$ apart (e.g. a pump beam polarization of $30^{\circ}$ and $210^{\circ}$ will yield equivalent absorbance signals of a given particle within error), the two $\theta_{\max }$ that were found while rotating the half wave plate $360^{\circ}$ were considered equivalent. This change in peak angle was calculated using: $\Delta \theta_{\max }=\mid\left(\theta_{\max }\right.$ after treatment $\left.\left.-\theta_{\max \text { before treatment }}+90\right) \bmod 180\right) \mid$, where $\bmod$ is a modulus that takes the remainder after dividing $\left(\theta_{\max }\right.$ after treatment $\left.-\theta_{\max \text { before treatment }}+90\right)$ by 180 . $\theta_{\text {max }}$ before treatment is the pump polarization angle at which maximum absorption occurs before a given treatment, and $\theta_{\text {max after treatment }}$ is the peak angle after treatment, so that: $\Delta \theta_{\text {max post-heat }}=\mid\left(\theta_{\max }\right.$ post-heat $-\theta_{\max }$ pristine +90$\left.) \bmod 180\right) \mid$, and $\Delta \theta_{\max }$ post-DMSO $=\mid\left(\theta_{\max }\right.$ post-DMSO $\left.-\theta_{\max \text { post-heat }}+90\right) \bmod$ 180)|.

Simulations: The $\Delta \mathrm{M}$ and $\Delta \sigma$ for a particle of initial M and $\sigma$ were simulated using a previously developed simulation that modelled the average order for PEDOT:PSS oligomers ${ }^{2}$. This simulation is similar to models that track rotational motion of colloidal clusters ${ }^{4}$. As stated in the main text, a PEDOT:PSS particle is modeled by first randomly assigning an initial orientation of a dipole (representing a chromophore) in spherical coordinates. These spherical coordinates include a $\theta$ chosen from a square distribution between $0^{\circ}$ and $360^{\circ}$ and a $\varphi$ taken from a square
distribution of $\cos (\varphi)$ from -1 to 1 . Once an initial orientation of the chromophore (represented as a unit vector) has been chosen, another chromophore is added to the end of the previous chromophore. The orientation of this previous chromophore is determined by randomly rotating the previous chromophore about the Cartesian coordinate system $\mathrm{x}\left(\mathrm{R}_{\mathrm{x}}\right)$, $\mathrm{y}\left(\mathrm{R}_{\mathrm{y}}\right)$, and $\mathrm{z}\left(\mathrm{R}_{\mathrm{z}}\right)$ represented by:

$$
\left[\begin{array}{l}
x_{i+1} \\
y_{i+1} \\
z_{i+1}
\end{array}\right]=R_{x}(\Delta) R_{y}(\Delta) R_{z}(\Delta)\left[\begin{array}{l}
x_{i} \\
y_{i} \\
z_{i}
\end{array}\right]
$$

where the coordinate system is represented as:

$$
\begin{gathered}
R_{x}(\Delta)=\left[\begin{array}{ccc}
1 & 0 & 0 \\
0 & \cos (\Delta) & -\sin (\Delta) \\
0 & \sin (\Delta) & \cos (\Delta)
\end{array}\right] ; R_{y}(\Delta)=\left[\begin{array}{ccc}
\cos (\Delta) & 0 & \sin (\Delta) \\
0 & 1 & 0 \\
-\sin (\Delta) & 0 & \cos (\Delta)
\end{array}\right] \\
R_{z}(\Delta)=\left[\begin{array}{ccc}
\cos (\Delta) & -\sin (\Delta) & 0 \\
\sin (\Delta) & \cos (\Delta) & 0 \\
0 & 0 & 1
\end{array}\right]
\end{gathered}
$$

The angular deviation $(\Delta)$ for a given chromophore from its previous chromophore is determined from a Gaussian weighted number generator centered at zero with a standard deviation of $\Delta=2.4^{\circ}$. This standard deviation $\Delta=2.4^{\circ}$ was calculated by fitting the DMSO treated M and $\sigma$ values for all of the particles to a logistic function: $M=\frac{1}{\left(1+10^{(\sigma-\beta)}\right)}$, where $M$ is the depth of modulation; $\sigma$ is the absorption cross section; and $\beta$ is the $50 \%$ falloff of the logistic function representing average relative chromophore alignment for PEDOT:PSS. This $\beta$ value can be compared previous simulations ${ }^{2}$ which determined $\beta$ values based on a given angular deviation with standard deviation of $\Delta$. The logistic function fit to the data yielded $\beta=-12.2$ which matched with an angular deviation of $2.4^{\circ}$. This $\beta$ value matches previously obtained values in past studies where $\beta=-12 \cdot 17 .{ }^{2}$ Adding these chromophores sequentially from the previous chromophore with a deviation determined from a Gaussian probability creates a random walk of
absorbing chromophores. From this model, the angular dependence of the 2D intensity in the xy plane is calculated, reflecting experimental conditions where the linearly polarized pump beam is rotated to maximize absorption and generate the angular dependence needed to calculate M . From this angular dependence of the 2 D intensity, M and the maximum intensity at $\theta_{\max }$ are calculated. Each unit in the random walk represents one bipolaron chromophore, so the 2D intensity is later converted to $\sigma$ by multiplying each chromophore by $4.2 \times 10^{-16} \mathrm{~cm}^{2}$ which is the absorption cross section of a single bipolaron chromophore. ${ }^{2,5}$ The 2D intensity is calculated by:

$$
\mathrm{I}_{\mathrm{i}}(\theta)=\sin ^{2}\left(\phi_{\mathrm{i}}\right) \cos ^{2}\left(\theta-\theta_{\mathrm{i}}\right)
$$

where $\mathrm{I}_{\mathrm{i}}(\theta)$ is the 2 D intensity of a given chromophore i , and $\theta_{\mathrm{i}}$ and $\phi_{\mathrm{i}}$ are spherical coordinates of a given chromophore. The angular rotation of the pump beam is represented by $\theta$ and is sampled from 0 to $180^{\circ}$ to generate the angular dependence of intensity. The total 2D intensity of a given chain is represented as the sum of individual chromophore 2D intensities. Because chains were incrementally increased in size by orders of magnitudes, gaps between the initial chains sizes are observed since only discrete values of chromophore lengths were sampled.

After the initial M and $\sigma$ were calculated, approximately $61 \%$ of chromophores were deleted in various ways. With the remaining chromophores, M and $\sigma$ were recalculated and the $\Delta \mathrm{M}$ and $\Delta \sigma$ were calculated from the M and $\sigma$ values before and after chromophore deletion (Figure S2). The chromophores were deleted using various methods described in the main text. In addition to the methods described in the main text, consecutive chromophores were also deleted in set size portions of 10 continuous portions of chromophores. In other words, one random oscillator was selected and then the 10 consecutive oscillators chosen around that randomly selected chromophores were deleted. This was repeated again until at least $61 \%$ of the chromophores were deleted, referred to as deletion of portions by set size. Duplicates of deleted
chromophores were removed so that an already selected and deleted chromophore was not doubly counted if selected and deleted again. Because continuous portions of chromophores were deleted from one randomly chosen and over half of the chromophores were deleted, it was possible that consecutive portions greater than 10 oscillators in length were deleted. Despite these slight differences in deletion, the average $\Delta \sigma$ remained close to the experimentally observed value (Table 1 below). Also, because consecutive portions were deleted until at least $61 \%$ of chromophores were deleted, sometimes slightly over $61 \%$ of chromophores were deleted.

A simulation was run where portions of 100 consecutive chromophores in size were deleted.
Finally, all chromophores were deleted except for consecutive portions of $39 \%$ of chromophores at the end of the length of the chromophore chain representative of PEDOT:PSS. The results of these simulations are shown below.

| Table S1. Comparison of $\Delta \sigma$ and $\Delta \mathrm{M}$ values for different types of simulated chromophore deletions and experimentally observed values |  |  |
| :---: | :---: | :---: |
| Conditions of Deletion | $\Delta \sigma$ | $\Delta \mathrm{M}$ |
| Experimentally observed values for after DMSO treatment | -0.408 | 0.088 |
| Random Deletion of single chromophores | -0.408 | 0.001 |
| Deletion of 10 consecutive chromophores portions | -0.410 | 0.004 |
| Deletion of 100 consecutive chromophores portions | -0.438 | 0.027 |
| Deletion of 100 consecutive chromophores portions excluding particles with only 100 initial chromophores | -0.403 | 0.027 |
| Deletion of consecutive chromophores in $2 \%$ portions of the total number of chromophores | -0.404 | 0.027 |
| Deletion of consecutive chromophores in 10\% portions of the total number of chromophores | -0.410 | 0.052 |
| Deletion of consecutive chromophores in 20\% portions of the total number of chromophores | -0.434 | 0.058 |
| Deletion of consecutive chromophores in 33.3\% portions of the total number of chromophores | -0.425 | 0.065 |
| Deletion of $61 \%$ of chromophores at the end of the simulated polymer chain (first 39\% of chromophores kept) | -0.377 | 0.084 |
| Deletion of $61 \%$ of chromophores at the beginning of the simulated polymer chain | -0.374 | 0.081 |
| Changing angular deviation from $\Delta=2.4^{\circ}$ to $\Delta=2.0^{\circ}$ with no deletion of chromophores | 0.0560 | 0.0235 |


| Deletion of $61 \%$ of chromophores at the end of the simulated <br> polymer chain and changing angular deviation from $\Delta=2.4^{\circ}$ to <br> $\Delta=2.0^{\circ}$ with remaining chromophores. | -0.3221 | 0.1078 |
| :--- | :--- | :--- |



Figure S2. Color plots of the i) $\Delta \mathrm{M}$ and ii) $\Delta \sigma$ after varied chromophore deletions for each particle plotted against the simulated M and $\sigma$ of each particle before chromophore deletion. iii) Histograms of simulated $\Delta \theta_{\max }(\square)$ are compared to the experimentally observed values ( $\square$ ). Different methods of deleting chromophores are simulated including: a) Randomly deleting single chromophores. b) Deleting 10 consecutive chromophores in one portion. c) Deleting 100 consecutive chromophores in one portion. d) Deleting consecutive chromophores that are $2 \%$ the size of the total number of chromophores. e) Deleting consecutive chromophores that are $10 \%$ the size of the total number of chromophores. f) Deleting consecutive chromophores that are $20 \%$ the size of the total number of chromophores. g) Deleting $61 \%$ of chromophores at the end of the chain. h) Deleting $61 \%$ of chromophores at the beginning of the chain.

Variability in Simulations: Additional simulations which model the rotational order of

PEDOT:PSS were also run varying the standard deviation of the angular deviation $(\Delta)$ and the number of chromophores deleted. These additional simulations were run to see how sensitive the trend (where smaller objects with low structural order increase $M$ ) was to the average deviation between consecutive chromophores or the fraction of chromophores deleted. To see if this trend could be reproduced while varying the angular deviation ( $\Delta$ ), simulations as described above

## a. Deletion of $61 \%$ of chromophores at the end of the simulated chain with $\Delta=1^{\text {a }}$


b. Deletion of $61 \%$ of chromophores at the end of the simulated chain with $\Delta=2.4^{\circ}$

c. Deletion of $61 \%$ of chromophores at the end of the simulated chain with $\Delta=4^{\circ}$


Figure S3. Color plots of the i) $\Delta \mathrm{M}$ and ii) $\Delta \sigma$ after chromophore deletions for each particle plotted against the simulated M and $\sigma$ of each particle before chromophore deletion. Histograms (iii) of simulated peak angle changes (■) are compared to the experimentally observed values (■). Chromophores were deleted in one continuous portion at the end of the simulated chain. The size of this deleted portion was $61 \%$ of the total number of chromophores for a given chain of chromophores. The angle deviations were varied so that a) $\Delta=1^{\circ}$, b) $\Delta=2.4^{\circ}$ (in main text), and b) $\Delta=4^{\circ}$.
were run using angular deviations from a Gaussian distribution with a standard deviation of $\Delta=1^{\circ}, \Delta=2.4^{\circ}$ (in main text), $\Delta=4^{\circ}$ (Figure S3). Because the trend of increased M after deletion was seen most clearly by deleting continuous portions, simulations were run deleting all chromophores but a continuous portion of the first $39 \%$ of chromophores at the beginning of the simulated chain. Although there are differences in the distributions of $\Delta \theta_{\max }$, the trend was roughly preserved for all simulations that vary in angular deviation, showing that our conclusions are robust to the average angular deviation used in the simulation. Additional simulations were also run varying the amount of the chromophores deleted to see if the trend was preserved (Figure S4). With $\Delta=2.4^{\circ}$ kept constant, deleted portions that were $75 \%, 61 \%$, and $50 \%$ of the total number of chromophores were deleted from the end of the simulated polymer chain. The trend where smaller, disordered particles tend to increase M is also roughly preserved showing that variations in the amount deleted also do not drastically change conclusions.
a. Deletion of $50 \%$ of chromophores at the end of the simulated chain with $\Delta=2.4^{\circ}$

b. Deletion of $61 \%$ of chromophores at the end of the simulated chain with $\Delta=2.4^{\circ}$

c. Deletion of $\mathbf{7 5 \%}$ of chromophores at the end of the simulated chain with $\Delta=2.4^{\circ}$


Figure S 4 . Color plots of the i) $\Delta \mathrm{M}$ and ii) $\Delta \sigma$ after varied chromophore deletions for each particle plotted against the simulated M and $\sigma$ of each particle before chromophore deletion. Histograms (iii) of simulated peak angle changes ( $\square$ ) are compared to the experimentally observed values ( $\square$ ). Chromophores were deleted in one continuous portion at the end of the simulated chain. The size of deleted portions were a) $50 \%$, b) $61 \%$, and c) $75 \%$ of the total number of chromophores.

Chromophore rotation: To see whether or not rotation of chromophores alone could explain the experimental trends, simulations were performed where chromophores were rotated by performing another random walk with more constricted angular deviation instead of deleting chromophores (Figure S5). To do this, a random walk of chromophores was "built" as described above and in the main text and represented the initial polymer chain. A $\Delta=2.4^{\circ}$ was used for the initial random walk of polymers. Then, another random walk of the same length of chromophores was created but with a decreased $\Delta$ value of $\Delta=2.0^{\circ}$ to represent a rotation of all
oligomers that leads to an increased alignment of chromophores. Although the trend where smaller, poorly ordered polymers tend to increase $M$ was preserved, the average absorption cross section actually increases, in contrast to experimentally observed values (Table S1).

Furthermore, the distribution of $\Delta \theta_{\max }$ values also differs from the experimentally observed distributions if only chromophore rotation occurs. This collection of differences suggests that rotation of chromophores leading to increased rotational alignment cannot fully explain the experimentally observed trends alone. Deletion of chromophores was included in another simulation so that the last $61 \%$ of chromophores on a chain are deleted and then the remaining chromophores are rotated changing the angular deviation from $\Delta=2.4^{\circ}$ to $\Delta=2.0^{\circ}$. Although this decreases the $\Delta \sigma$ values to more closely represent the experimentally observed average, it still fails to reproduce the experimental distribution of $\Delta \theta_{\max }$ values.

Confidence Intervals for linear fits: Confidence intervals (95\%) for each of the linear fits are
shown below in Table 2. A linear fit is not expected to accurately represent the correlation between property changes and initial properties. The linear fit is only used to determine if a positive or negative correlation could be claimed between certain properties and their changes after treatment. If both the upper and lower bound of the confidence intervals are negative, then a negative correlation is claimed, and if both bounds are positive, then a positive correlation is claimed. Otherwise, if the lower bound is negative, and the upper bound is positive, no correlation is claimed.
a. No deletion of Chromophores. Angular Deviation changed from $\Delta=2.4^{\circ}$ to $\Delta=2.0^{\circ}$

b. Deletion of $61 \%$ of chromophores at the end of the chain and $\Delta$ changed from $\Delta=2.4^{\circ}$ to $\Delta=2.0^{\circ}$


Figure S5. Color plots of the i) $\Delta \mathrm{M}$ and ii) $\Delta \sigma$ after varied chromophore deletions for each particle plotted against the simulated $M$ and $\sigma$ of each particle before chromophore deletion. Histograms (iii) of simulated peak angle changes ( $\square$ ) are compared to the experimentally observed values ( $\square$ ). a) No chromophores were deleted and $\Delta$ was changed from $\Delta=2.4^{\circ}$ to $\Delta=2.0^{\circ}$ to simulate increased crystallinity in the simulated chain. b) The last $61 \%$ of chromophores at the end of the chain were deleted and $\Delta$ was changed for the remaining chromophores from $\Delta=2.4^{\circ}$ to $\Delta=2.0^{\circ}$ to simulate increased crystallinity in the simulated chain.

Table S2. Linear fits and confidence intervals (95\%) bounds of various properties and changed in properties after a treatment

| Figure | Treatment <br> type | x axis | y axis | Slope | Lower bound <br> (Confidence 95\%) | Upper bound <br> (Confidence 95\%) |
| :--- | :--- | :--- | :--- | ---: | ---: | ---: |
| SI 7a | Thermal | $\Delta \mathrm{M}$ | $\Delta \theta_{\max }$ | -23.732 | -40.292 | -7.172 |
| SI 7a | Thermal | $\Delta \mathrm{M}$ | $\Delta \theta_{\max }$ if $\mathrm{M}>0.2$ | -14.872 | -28.084 | -1.660 |
| SI 7b | DMSO | $\Delta \mathrm{M}$ | $\Delta \theta_{\max }$ | 24.669 | -3.922 | 53.259 |
| SI 7b | DMSO | $\Delta \mathrm{M}$ | $\Delta \theta_{\max }$ if $\mathrm{M}>0.2$ | 24.392 | -6.484 | 55.267 |
| SI 7c | Thermal | $\Delta \sigma$ | $\Delta \theta_{\max }$ | -2.181 | -9.959 | 5.596 |
| SI 7c | Thermal | $\Delta \sigma$ | $\Delta \theta_{\max }$ if $\mathrm{M}>0.2$ | -4.663 | -11.103 | 1.777 |
| SI 7d | DMSO | $\Delta \sigma$ | $\Delta \theta_{\max }$ | -6.562 | -22.865 | 9.741 |
| SI 7d | DMSO | $\Delta \sigma$ | $\Delta \theta_{\max }$ if $\mathrm{M}>0.2$ | -6.523 | -25.486 | 12.439 |
| 4a | Thermal | $\sigma$ | $\Delta \sigma$ | 0.022 | -0.039 | 0.082 |
| 4b | Thermal | $\sigma$ | $\Delta \mathrm{M}$ | -0.014 | -0.042 | 0.013 |
| SI 6a | Thermal | $\sigma$ | $\Delta \theta_{\max }$ | 0.354 | -2.404 | 3.112 |
| SI 6a | Thermal | $\sigma$ | $\Delta \theta_{\max }$ if $\mathrm{M}>0.2$ | -2.066 | -4.314 | 0.182 |
| 5a | DMSO | $\sigma$ | $\Delta \sigma$ | -0.057 | -0.166 | 0.052 |
| 5b | DMSO | $\sigma$ | $\Delta \mathrm{M}$ | -0.068 | -0.128 | -0.008 |
| SI 6b | DMSO | $\sigma$ | $\Delta \theta_{\max }$ | -15.264 | -22.457 | -7.971 |
| SI 6b | DMSO | $\sigma$ | $\Delta \theta_{\max }$ if $\mathrm{M}>0.2$ | -2.066 | -23.863 | 0.180 |
| 4c | Thermal | M | $\Delta \sigma$ | -0.187 | 0.021 |  |
| 4d | Thermal | M | $\Delta \mathrm{M}$ | -0.146 | 6.889 |  |
| SI 6c | Thermal | M | $\Delta \theta_{\max }$ | -22.758 | 0.791 |  |
| SI 6c | Thermal | M | $\Delta \theta_{\max }$ if $\mathrm{M}>0.2$ | -6.582 | -13.954 | 0.132 |
| 5c | DMSO | M | $\Delta \sigma$ | -0.535 | -0.187 |  |
| 5d | DMSO | M | $\Delta \mathrm{M}$ | -0.201 | -0.359 | -21.885 |
| SI 6d | DMSO | M | $\Delta \theta_{\max }$ | -13.199 | 48.022 |  |
| SI 6d | DMSO | M | $\Delta \theta_{\max }$ if $\mathrm{M}>0.2$ | -6.582 |  | 4.393 |

Additional Correlations: In addition to comparing the $\Delta \mathrm{M}$ and $\Delta \sigma$ due to treatment against the initial M and $\sigma$ before treatments (shown as Figures 4 and 5 in the main text), the $\Delta \theta_{\max }$ were also compared to the initial M and $\sigma$ pictured below. For the thermal anneal, no significant dependence was shown on either M or $\sigma$ for the $\Delta \theta_{\max }$ (Figure S6). For the DMSO anneal (Figure S7), no dependence on $M$ was seen for $\Delta \theta_{\max }$. However, $\Delta \theta_{\max }$ does have a negative correlation with $\sigma$ even with the exclusion of points with $\mathrm{M}<0.2$ due to low signal to noise (shown as light


Figure S6. a) Comparison of $\Delta \theta_{\max }$ after the thermal anneal to the $\sigma$ of the pristine particle before annealing. b) Comparison of $\Delta \theta_{\max }$ after the DMSO treatment to the $\sigma$ of the particle after the thermal anneal. c) Comparison of $\Delta \theta_{\max }$ after the thermal anneal to the $M$ of the pristine particle. d) Comparison of $\Delta \theta_{\max }$ after the DMSO treatment to the M of the particle after the thermal anneal. The dark grey lines are a linear fit of the data while the lighter dashed grey lines are a linear fit of the data excluding data points with $M<0.2$ because a low $M$ makes it difficult to determine the $\theta_{\max }$ due to low signal to noise.
grey dashed lines).

Additionally, the $\Delta \theta_{\max }$ was compared to the $\Delta \mathrm{M}$ and $\Delta \sigma$ for each treatment, shown below. For the thermal anneal, a negative correlation was observed between $\Delta \theta_{\max }$ and $\Delta \mathrm{M}$ even with exclusion of points where $M<0.2$. No such correlation is observed comparing $\Delta \theta_{\max }$ to $\Delta \sigma$, however. For the DMSO treatment, no significant correlations between the $\Delta \theta_{\max }$ and either $\Delta \mathrm{M}$ or $\Delta \sigma$ were observed.


Figure S7. Peak angle changes $\left(\Delta \theta_{\max }\right)$ after thermal ( $\square$ ) and DMSO ( $\square$ ) treatments are compared to the $(\mathrm{a}, \mathrm{b}) \Delta \mathrm{M}$ and $(\mathrm{c}, \mathrm{d}) \Delta \sigma$ after each treatment for each object. The dark grey lines are a linear fit of the data while the lighter dashed grey lines are a linear fit of the data excluding data points with $\mathrm{M}<0.2$ because a low M makes it difficult to determine the $\theta_{\text {max }}$ due to low signal to noise.

Multiple Variable Linear Regression for Figure 6: In addition to establishing a correlation between the $\Delta \mathrm{M}$ or $\Delta \sigma$ against a single variable, a multiple linear regression was performed between $\Delta \mathrm{M}$ or $\Delta \sigma$ and M and $\sigma$. A negative correlation was seen with $\Delta \mathrm{M}$ against both M and $\sigma$
within the $95 \%$ confidence intervals, suggesting a negative correlation where $\Delta \mathrm{M}$ tends to decrease with larger (greater $\sigma$ ), more ordered (greater M ) objects, Figure 6a. For $\Delta \sigma$ dependence on M and $\sigma$, since the slope crosses zero within the $95 \%$ confidence bounds, no positive or negative relationship can be claimed with certainty, Figure 6 b.


Figure S8. Experimental data (blue) of a) $\Delta \mathrm{M}$ or b) $\Delta \sigma$ values plotted against the M and $\sigma$ before DMSO exposure. The data is fit using a multivariable regression, plotted as a color mesh.

| Table S3. Linear fits and confidence intervals (95\%) bounds of various properties and changed in properties <br> after a treatment after multiple linear regression with independent variables M and $\sigma$ |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| Figure | Treatment <br> type | x or y <br> axis | z (color) axis | Slope | Lower bound <br> (Confidence $95 \%)$ | Upper bound <br> (Confidence 95\%) |
| SI 8a | DMSO | $\sigma$ | $\Delta \mathrm{M}$ | -.1159 | -.1688 | -.0629 |
| SI 8a | DMSO | M | $\Delta \mathrm{M}$ | -.4695 | -.6320 | -.3070 |
| SI 8b | DMSO | $\sigma$ | $\Delta \sigma$ | -.0858 | -.1995 | 0.0278 |
| SI 8b | DMSO | M | $\Delta \sigma$ | -.2837 | -.6323 | 0.0649 |

Absorption Coefficient Calculation from Resonance Shift: As mentioned in the Methods, COMSOL simulations are used to convert a resonance shift into an absorption cross section of the deposited PEDOT:PSS particles on different parts of the toroidal microresonator and have been described previously ${ }^{1-2,6-7}$. Briefly, the thermal response of the toroid is simulated using the Heat Transfer Module of COMSOL where heat transfer from a point source on the microresonator is simulated to yield a temperature distribution of the toroid (and thus a refractive
index distribution). This simulation is repeated several times where the point source position is varied to account for particles depositing on different parts of the microresonator. In a separate simulation, the fundamental optical mode is simulated in COMSOL. The shift in resonance frequency is then calculated by overlapping the fundamental mode and temperature distribution of the toroid and scaling by the thermo-optic coefficient of silica to relate a change in temperatures to a shift in resonance frequency of the toroid. Thus, because the location of the object is known, dissipated heat can then be related to the resonance shift of the toroid. When the excitation intensity (by measuring the power and spot size) and quantum yield of thermalization ( $\sim 100 \%$ for PEDOT:PSS) are also known, the absorption cross section of the object can be quantitatively determined. This process has been shown to produce cross sections that quantitatively agree with known absorption cross sections for carbon nanotubes and gold nanorods ${ }^{1,7}$.

Treatment Effects on Microresonators: To ensure that the property changes of the PEDOT:PSS from the thermal and DMSO exposures came from changes to the nanoparticles and not changes to the microresonator, behaviors of three different microresonators were monitored over several days both before treatment, after thermal anneal, and after DMSO exposure. This was performed by photoexciting the silicon pillar of the microresonator with a 633 nm laser and measuring the resonance shift produced by silicon's absorption of visible light. This procedure essentially quantifies the photothermal response of the resonator. The average resonance shift of each pillar and its standard deviation are in Table S 4 . Toroid A was measured 10 times throughout 19 days before treatment, 5 times over 6 days after the thermal anneal, and 3 times over 3 days after the DMSO exposure. Toroid B was measured 7 times throughout 19 days before treatment, 2 times over 7 days after the thermal anneal, and 2 times in one day after the DMSO exposure. The
subsequent average resonance shifts of the pillars are within one standard deviation of the pillar's average resonance shifts before treatment, suggesting that no significant changes in the toroid occur with treatment.

Table S4. Average Resonance Shift of resonator pillar and its standard deviation before treatment, after thermal annealing, and after DMSO exposure.

|  | Average Resonance Shift of resonator pillar (fm) before treatment | Standard Deviation of Resonance Shift of resonator pillar (fm) before treatment | Average Resonance Shift of resonator pillar (fm) after thermal anneal | Standard <br> Deviation of Resonance Shift of resonator pillar (fm) after thermal anneal | Average <br> Resonance Shift of resonator pillar (fm) after DMSO exposure | Standard <br> Deviation of Resonance Shift of resonator pillar (fm) after DMSO exposure |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Toroid A | 2.578 | 0.464 | 2.945 | 0.261 | 2.873 | 0.266 |
| Toroid B | 2.597 | 0.640 | 3.058 | 0.476 | 2.947 | 0.064 |

Reproducibility of Data: To explore the reproducibility of our data, photothermal measurements were repeatedly taken on five different PEDOT:PSS objects before any thermal or DMSO annealing. Some uncertainty is to be expected due to taper drift (change in coupling between the taper and toroid as the taper drifts away from the toroid due to air currents) which is actively corrected for during experiments. Object A was measured 10 times throughout 19 days, except for the M and $\theta_{\max }$ which were only measured 9 times. Object B was measured 6 times throughout 17 days, except for the $M$ and $\theta_{\max }$ which were only measured 3 times. Object $C$ was measured 6 times throughout 17 days, except for the $M$ and $\theta_{\max }$ which were only measured 3 times. Object D was measured 7 times throughout 17 days, except for the M and $\theta_{\text {max }}$ which were only measured 3 times. Object E was measured 8 times throughout 17 days, except for the M and $\theta_{\max }$ which were only measured 5 times. One sees that the average properties of $M$ and $\theta_{\max }$ remained consistent and with smaller standard deviations. This is also true for $\sigma$ although Object E does have larger relative standard deviation compared to the other objects for unknown reasons. The average $M$ and $\sigma$ standard deviations are plotted in Figure S9.

| PEDOT:PSS <br> Object | Average $\sigma$ <br> $\left(\mathrm{cm}^{2}\right)$ | Standard <br> Deviation of $\sigma$ | Average <br> M | Standard <br> Deviation of M | Average <br> $\theta_{\max }$ | Standard <br> Deviation of $\theta_{\max }$ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| A | $1.08 \mathrm{E}-11$ | $2.25 \mathrm{E}-12$ | 0.32 | 0.01 | 32.24 | 1.38 |
| B | $4.32 \mathrm{E}-14$ | $1.17 \mathrm{E}-14$ | 0.84 | 0.03 | 160.18 | 2.02 |
| C | $2.151 \mathrm{E}-12$ | $2.56 \mathrm{E}-13$ | 0.77 | 0.01 | 98.82 | 1.70 |
| D | $2.28 \mathrm{E}-12$ | $3.96 \mathrm{E}-13$ | 0.43 | 0.01 | 176.20 | 2.73 |
| E | $1.48 \mathrm{E}-13$ | $5.76 \mathrm{E}-14$ | 0.43 | 0.17 | 146.24 | 6.58 |

## Additional Figures:



Figure S9. Average M and $\sigma$ with standard deviations as error bars of objects A through E.


Figure S10. Polarization spectra of a low M object before treatment ( $\square$ ) and after the thermal ( $\square$ ) treatment. The low M makes it difficult to assign a $\theta_{\max }$.


Figure S11. Representative absorption spectra of PEDOT:PSS before treatment ( $\square$ ) and after the thermal ( $\square$ ) and DMSO ( $\square$ ) treatments. The spectra remain relatively flat in the NIR range with no dramatic emergence or disappearance or spectral peaks observed within experimental noise, which is largely caused by the tapered optical fiber carrying the probe beam drifting from the toroid.


Figure S12. Histograms of $\Delta \theta_{\max }$ after the thermal ( $\square$ ) and DMSO ( $\square$ ) treatments based on a) absolute number of objects and $b$ ) normalized by probability.


Figure S13. Density distributions of the experimentally observed depth of modulations (M) and absorption cross sections ( $\sigma$ ) for all objects, including those that do not survive subsequent treatment. Individual objects are represented by the blue-green-yellow contour plot, with experimentally observed values plotted as points for the a) pristine $(\diamond), b$ ) thermally annealed $(\Delta)$, and c) DMSO-treated objects for all objects $(\bigcirc)$.

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