Electronic Supplementary Material (ESI) for Chemical Science. This journal is © The Royal Society of Chemistry 2020

## Supplementary Information for

## <u>Dye-sensitized solar cells under Ambient Light Powering Machine Learning:</u> <u>Towards autonomous smart sensors for Internet of Things</u>

Hannes Michaels, Michael Rinderle, Richard Freitag, Iacopo Benesperi, Tomas Edvinsson, Richard Socher, Alessio Gagliardi, Marina Freitag

Correspondence to: marina.freitag@newcastle.ac.uk

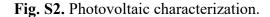
## This PDF file includes:

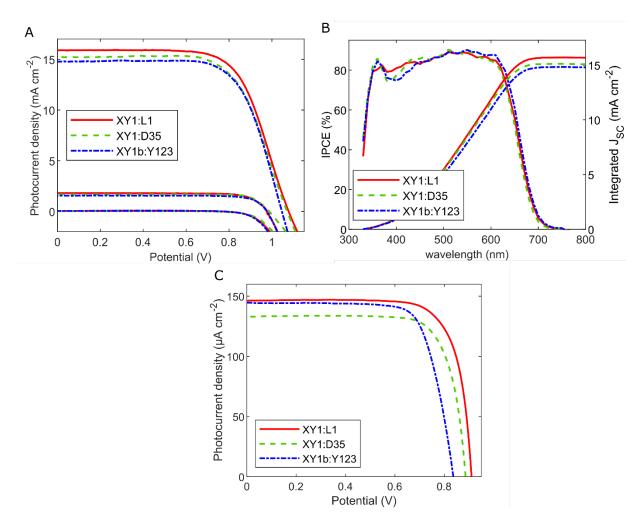
Figures S1-S11

Tables S1-S6

Fig. S1 Structures of dyes and copper complexes.

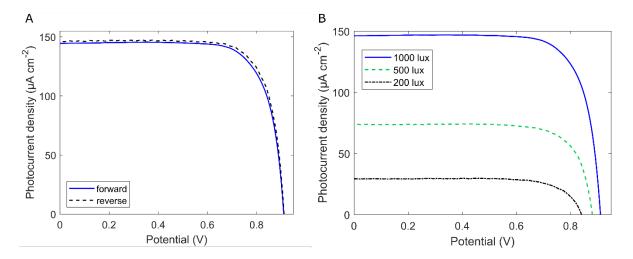
**Fig. S1.** Chemical structures of investigated dyes L1, XY1 as well as copper redox mediator Cu(tmby)<sub>2</sub> (counterions omitted for clarity).





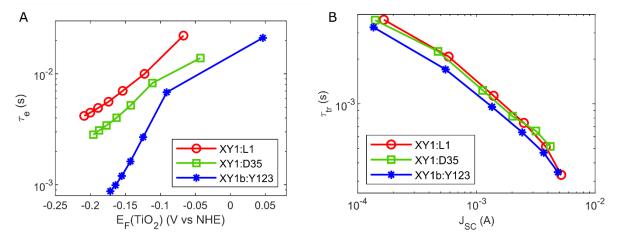
**Fig. S2. (A)** Photovoltaic performance under simulated sunlight (AM 1.5G, 100 mW cm<sup>-2</sup>), 10% sunlight as well as dark currents and **(B)** Incident-photon-to-current-conversion efficiency comparing XY1:L1-sensitized solar cells to sensitizer combinations XY1:D35 and XY1b:Y123. All corresponding parameters are listed in Table S1. **(C)** Photovoltaic performance of XY1:L1, XY1:D35 and XY1b:Y123 sensitized solar cells illuminated with 1000 lux fluorescent light. Corresponding parameters are listed in Table S3.

Fig. S3. Photovoltaic characterization.



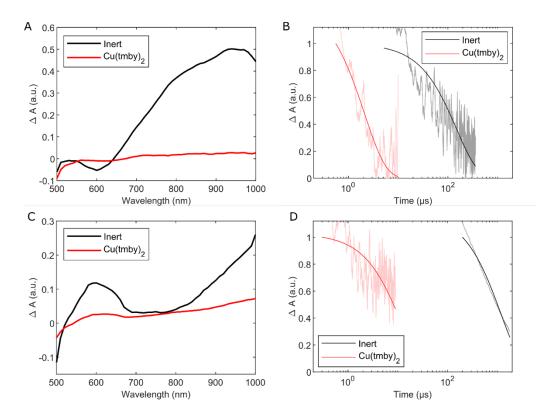
**Fig. S3. (A)** Forward (33.1%) and reverse (34.0%) scan of an XY1:L1-sensitized solar cell under 1000 lux fluorescent light. Full parameter list in Table S4. **(B)** Photovoltaic performance of an XY1:L1-sensitized solar cell illuminated by a fluorescent lamp at different intensities. Parameters in Table 1.

Fig. S4. Electron lifetime and transport time.



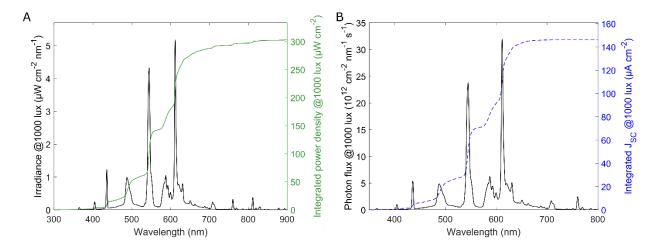
**Fig. S4.** (A) Electron lifetime in XY1:L1, XY1:D35 and XY1:Y123-sensitized solar cells. The measurements were aligned to the effective Fermi energy of electrons in the  $TiO_2$  (in Volts vs NHE), which was calculated via  $E_F = V_{OC} - E_{redox}$ , where  $V_{OC}$  is the open-circuit voltage of the cell and Eredox represents the redox potential of the  $Cu^{II/I}(tmby)_2$  redox electrolyte. (B) Transport time.

Fig. S5. Dye regeneration.



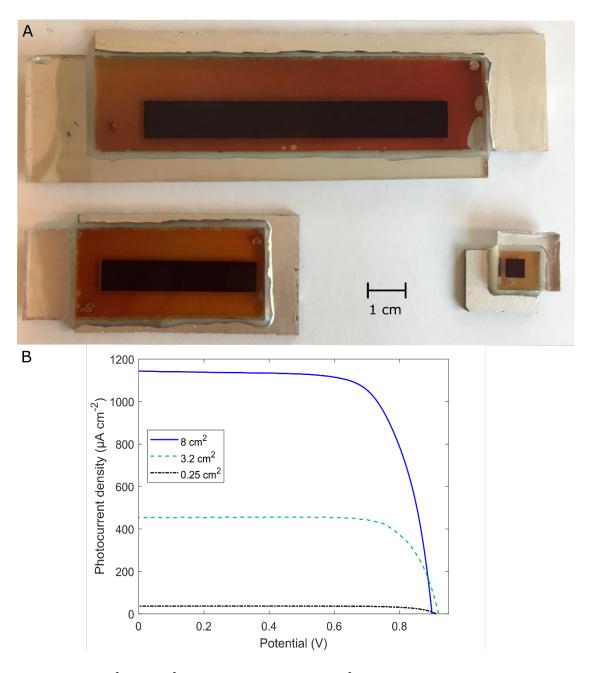
**Fig. S5: (A)** Photoinduced absorption spectra of XY1-sensitized photoanodes in inert and Cu<sup>II/I</sup>(tmby)<sub>2</sub> electrolyte. **(B)** Transient absorption spectra of XY1-sensitized photoanodes in inert and Cu<sup>II/I</sup>(tmby)<sub>2</sub> electrolyte with single-exponential fits. The pump wavelength was 555 nm, the absorption was monitored at 780 nm. Half-times of the absorption decay yield a recombination time of 33 μs in the inert measurement and a 1.9 μs regeneration time for the Cu<sup>II/I</sup>(tmby)<sub>2</sub> redox couple, resulting in a regeneration efficiency of 94%. **(C)** Photoinduced absorption spectra of L1-sensitized photoanodes in inert and Cu<sup>II/I</sup>(tmby)<sub>2</sub> electrolyte. **(D)** Transient absorption spectra of L1-sensitized photoanodes in inert and Cu<sup>II/I</sup>(tmby)<sub>2</sub> electrolyte with single-exponential fits. The pump wavelength was 470 nm, the absorption was monitored at 620 nm. Half-times of the absorption decay yield a recombination time of 1.02 ms in the inert measurement and a 0.8 μs regeneration time for the Cu<sup>II/I</sup>(tmby)<sub>2</sub> redox couple, resulting in a regeneration efficiency of 99.9%.

Fig. S6. Spectrum of the OSRAM fluorescent tube.



**Fig. S6: (A)** Spectrum of the Osram 930 warm white fluorescent tube. After calibration with a lux meter, the spectral distribution was weighed with the luminous efficiency function to obtain the power distribution (right axis). The power density was integrated to yield 303.1  $\mu$ W cm<sup>-2</sup>. **(B)** The photon flux of the fluorescent lamp integrated with the IPCE spectrum of an XY1:L1-sensitized solar cell (shown in Fig. 2C) to obtain a photocurrent density of 146  $\mu$ A cm<sup>-2</sup> (compare Fig. S2, Table S3: 147  $\mu$ A cm<sup>-2</sup>).

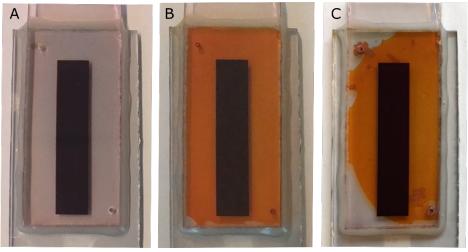
Fig. S7. Characterization of large DSCs.



**Fig S7: (A)** 0.25 cm<sup>2</sup>, 3.2 cm<sup>2</sup> (4 cm x 0.8 cm) and 8 cm<sup>2</sup> (8 cm x 1 cm) XY1:L1 sensitized solar cells with Cu<sup>II/I</sup>(tmby)<sub>2</sub> electrolyte. **(B)** Photovoltaic characterization of XY1:L1-sensitized solar cells under 1000 lux fluorescent light. Corresponding parameters in Table S5.

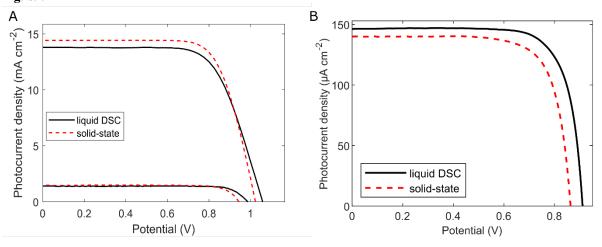
S

Fig. S8. Fabrication of solid-state 'Zombie' DSCs.



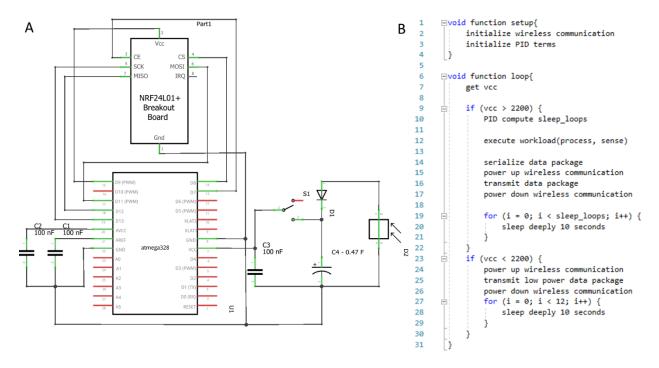
**Fig. S8.** The fabrication of solid-state 'Zombie' DSCs. **(A)** The XY1:L1 co-sensitized photoanode assembled with PEDOT counter electrode in inert electrolyte (0.1 M LiTFSI, 0.6 M *tert*-buylpyridine in acetonitrile). **(B)** Assembled cell filled with Cu<sup>II/I</sup>(tmby)<sub>2</sub> electrolyte. **(C)** The electrolyte dries in ambient air to form the 'Zombie' solid-state DSC.

Fig. S9. Characterization of 'Zombie' solid-state DSCs.



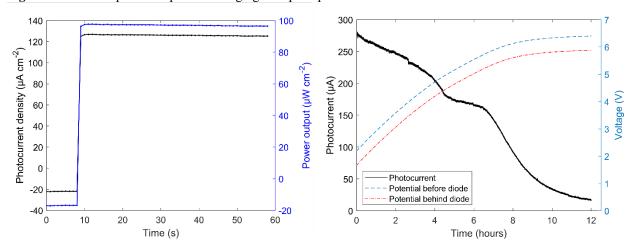
**Fig. S9. (A)** Photovoltaic characterization of liquid-DSCs and solid-state 'Zombie' DSCs with XY1:L1 as sensitizers and Cu<sup>II/I</sup>(tmby)<sub>2</sub> as electrolyte / hole transport material under AM 1.5G simulated sunlight as well as 10% sunlight and **(B)** under 1000 lux fluorescent light. All corresponding parameters can be found in Table S6.

Fig. S10. Energy harvester and pseudocode.



**Fig. S10. (A)** Schematic of the basic energy harvester with microcontroller U1, wireless transceiver P1, light harvester L1 and energy buffer (C4) **(B)** Pseudocode of benchmarks running on energy harvesting circuit

Fig. S11. Stabilized power output and charging of supercapacitor.



**Fig. S11. (A)** Steady-state power output at the maximum power point (MPP) of a DSC under 1000 lux fluorescent light, recorded at  $V_{\rm MPP}=0.77~\rm V$ . A  $J_{\rm MPP}$  of 126 μA cm<sup>-2</sup> and  $P_{\rm MPP}$  of 97.0 μW cm<sup>-2</sup> translate into 32.0% steady-state power conversion efficiency. **(B)** A 1.5 F @ 5 V supercapacitor is being charged by an array of eight serial 3.2 cm-2 XY1:L1-sensitized solar cells through a rectifying diode. As the potential in the capacitor is building up (right), the photocurrent decreases. The *S*-shape of the charging curve is likely attributed to slight MPP mismatching within the serial solar cell array.

Table S1. Photovoltaic characterization of DSCs under simulated sunlight.

**Table S1.** Photovoltaic parameters for XY1:L1, XY1:D35 and XY1b:Y123 sensitized solar cells under AM 1.5G illumination (100 mW cm<sup>-2</sup>). Photovoltaic parameters under 10% sunlight in parentheses. Scanning the champion XY1:L1-sensitized cell in darkness yielded a saturation current of 5 nA cm<sup>-2</sup> as well as an ideality factor of 1.92.

	XY1	L1	XY1:L1	XY1:D35	XY1b:Y123
Voc (mV)	1000	910	1080	1070	1050
	(930)	(830)	(980)	(980)	(970)
$J_{ m SC}$ (mA cm <sup>-2</sup> )	13.3	9.4	15.9	15.3	14.7
	(1.59)	(1.00)	(1.80)	(1.69)	(1.56)
$J_{ m SC,IPCE} \  m (mA~cm^{-2})$	13.3	9.0	15.7	15.1	14.8
Fill Factor	0.67	0.71	0.67	0.67	0.70
	(0.80)	(0.80)	(0.77)	(0.77)	(0.80)
PCE (%)	8.9	6.1	11.5	11.0	10.9
	(11.8)	(6.7)	(13.7)	(13.0)	(12.1)

Table S2. Photovoltaic characterization of DSCs under ambient light: Sensitizer ratio.

**Table S2.** Photovoltaic characterization of XY1:L1 co-sensitized solar cells under 1000 lux fluorescent light. The first column indicates the relative molar ratios of sensitizers XY1 and L1 in the dye solution.

	V <sub>OC</sub> (mV)	$J_{\rm SC}$ ( $\mu { m A~cm}^{-2}$ )	Fill Factor	PCE (%)
XY1	850	114.2	0.78	24.6
5:1	850	120	0.76	25.5
2.5:1	870	138	0.77	30.5
1:1	890	143	0.77	32.3
1:2.5	910	147	0.77	34.0
1:5	910	140	0.76	31.9
L1	760	58	0.78	11.2

Table S3. Photovoltaic characterization of DSCs under ambient light: Sensitizer combinations.

**Table S3:** Photovoltaic parameters for XY1:L1, XY1:D35 and XY1:Y123-sensitized solar cells under 1000 (303.1  $\mu W$  cm<sup>-2</sup>) lux fluorescent light (normalized short-circuit current density and

power output in parentheses).

ower output in purchases).					
	XY1	L1	XY1:L1	XY1:D35	XY1b:Y123
$V_{\rm OC}  ({\rm mV})$	850	750	910	880	840
J <sub>SC</sub> (μA) ((μA cm <sup>-2</sup> ))	30.0 (120)	14.5 (58)	36.7 (147)	33.0 (132)	36.3 (145)
$J_{\rm SC,IPCE} \ (\mu { m A cm}^{-2})$			146		
Fill Factor	0.74	0.78	0.77	0.77	0.75
P <sub>max</sub> (μW) ((μW cm <sup>-2</sup> ))	18.9 (75.4)	8.6 (34.4)	25.7 (103.1)	22.4 (89.4)	22.7 (91.2)
PCE (%)	24.9	11.3	34.0	29.5	30.1

Table S4. Photovoltaic characterization of DSCs under ambient light: Hysteresis data.

Table S4: Hysteresis data for an XY1:L1-sensitized solar cell under 1000 lux fluorescent light

(normalized short-circuit current density and power output in parentheses).

	forward	reverse
V <sub>OC</sub> (mV)	910	910
J <sub>SC</sub> (μA) ((μA cm <sup>-2</sup> ))	36.3 (145)	36.7 (147)
Fill Factor	0.76	0.77
P <sub>max</sub> (μW) ((μW cm <sup>-2</sup> ))	25.7 (103.1)	25.1 (100.3)
PCE (%)	34.0	33.1

 Table S5. Characterization of large DSCs under ambient light.

**Table S5.** Photovoltaic parameters for XY1:L1-sensitized solar cells under 1000 lux, fluorescent

light (normalized short-circuit current density and power output in parentheses).

	0.25 cm <sup>2</sup>	3.2 cm <sup>2</sup>	8 cm <sup>2</sup>
V <sub>OC</sub> (mV)	910	910	900
J <sub>SC</sub> (μA) ((μA cm <sup>-2</sup> ))	36.7 (147)	454 (142)	1140 (142)
Fill Factor	0.77	0.78	0.73
$P_{\text{max}}(\mu W)$ ((\(\mu W\) cm <sup>-2</sup> ))	25.7 (103.1)	332 (100.3)	740 (92.5)
PCE (%)	34.0	33.2	30.6

**Table S6.** Statisctics of photovoltaic parameters.

**Table S6.** Photovoltaic parameters of liquid-electrolyte DSCs and solid-state 'Zombie' DSCs with XY1:L1 as sensitizers and  $Cu^{II/I}(tmby)_2$  as electrolyte / hole transport material under AM 1.5G as well as 10% sunlight and under 1000 lux fluorescent light.

<sup>†</sup>Average of those cells that were dried to characterize 'Zombie' ssDSCs (8 cells).

		V <sub>OC</sub> (mV)	J <sub>SC</sub> (mA cm <sup>-2</sup> ))	Fill Factor	PCE [%]
AM 1.5G simulated sunlight	DSC* DSC‡ DSC†	1080 1060 1050	15.9 15.2 13.9	0.67 0.68 0.70	11.5 11.0 10.2
	ssDSC* ssDSC†	1020 1020	14.5 14.3	0.72 0.71	10.7 10.4
10% sunlight	DSC*	980	1.80	0.78	13.7
	ssDSC*	940	1.47	0.80	11.2
1000 lux fluorescent	DSC*	910	0.147	0.77	34.0
	ssDSC*	860	0.137	0.77	30.0

<sup>\*</sup>Champion device.

<sup>‡</sup>Average of three batches of liquid-electrolyte DSCs (total of 40 cells).