

Supplementary Information

Data-driven approach to elucidate the correlation between photocatalytic activity and rate constants from excited states

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Materials and Methods

All the chemicals for synthesis of the substrates and the catalysts were commercially available and purchased from Tokyo Chemical Industry Co., Ltd., Fujifilm Wako Pure Chemical Corporation, Kanto Chemical Co., Inc., Combi-Blocks, Inc., BLD Pharmatech Ltd., or Sigma-Aldrich Co. LLC. Thin-layer chromatography was performed on TLC plates with silica gel 60 GF254 0.25 nm (Merck). Purification was performed by flash column chromatography on silica gel (Kanto Chemical Co., Inc., spherical, neutral, diameter: 40–100 nm).

Experiments and measurements were carried out with the following apparatuses.

Visible light irradiation: HepatoChem PhotoRedOx Box ($\lambda = 450$ nm or 425 nm). NMR: JEOL ECA-600 (600 MHz for ^1H NMR) (Reference of ^1H NMR spectra: Tetramethylsilane (CDCl_3 , acetone- d_6 : 0.00 ppm), or residual protio impurities in the deuterated solvents ($\text{DMSO}-d_6$ and C_6D_6). Reference of ^{19}F NMR spectra: Trifluoroacetic acid (-76.55 ppm)). HRMS (ESI-QTOF): Bruker compact. GC-MS: Agilent 6850 series network GC system and Agilent 5975C series Mass Selective Detector (EI) [column: HP-5MS capillary column ($l = 30$ m, $d = 0.25$ mm, film thickness = 0.25 mm)].

Reaction Apparatus



Figure S1. Reaction apparatuses.

List of Organic Photosensitizers (OPSs)^[S1]

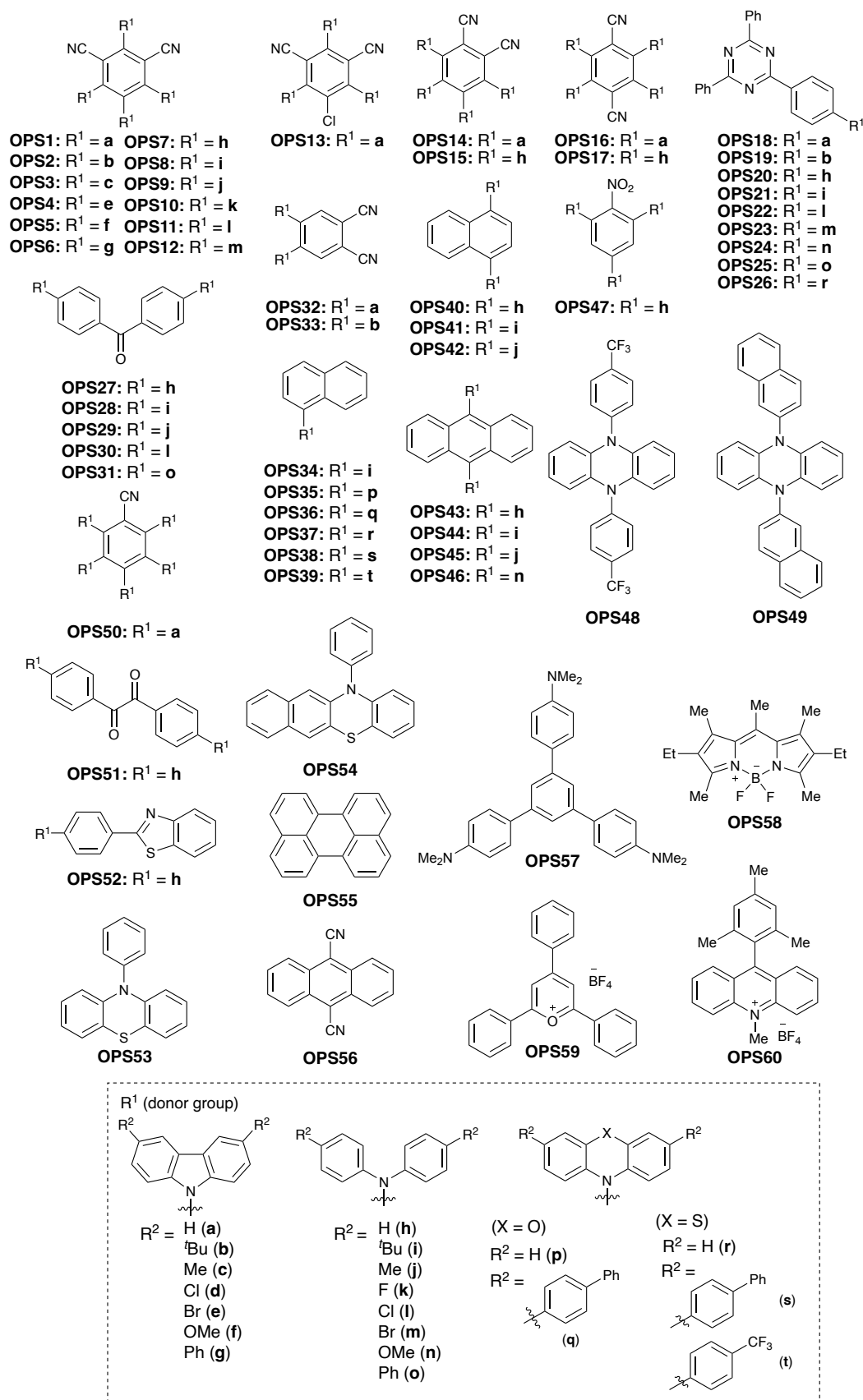
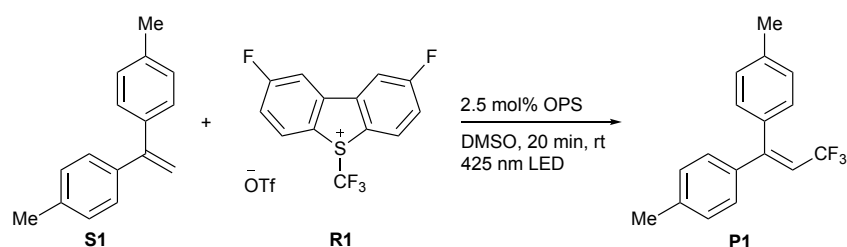


Figure S2. List of organic photosensitizers.

Investigation into the Catalytic Activity of OPSs

The dataset for C–O bond forming reactions (energy transfer-type reactions; **CO-a**, **CO-b**, **CO-c**, **CO-d**, **CO-e**) was prepared in our previous report.^[S1] In this research, we have newly constructed the following dataset involved in radical addition reactions (photoredox reactions). The reaction dataset is available in our Github repository at <https://github.com/Naoki-Noto/P6-20240509-RK/tree/main/data>.

Trifluoromethylation of 1,1-di(*p*-tolyl)ethylene (denoted as **CF₃**)



1,1-Di(*p*-tolyl)ethylene (**S1**, 20.8 mg, 0.100 mmol), Umemoto reagent II (**R1**, 52.6 mg, 0.120 mmol), a photosensitizer (0.0025 mmol), and DMSO (1.5 mL) were added to a test tube under air at room temperature. After the mixture was degassed by three freeze-pump-thaw cycles, the test tube was put in PhotoRedOx Box and the reaction was carried out under visible light irradiation ($\lambda = 425$ nm) for 20 min at room temperature. Water (15 mL) was added, and the mixture was extracted with Et₂O (15 mL x 3). The organic phase was dried over Na₂SO₄, filtered, and evaporated. The yield was determined by ¹H NMR spectroscopy with dibromomethane as an internal standard.

(Commercially available reagents used)

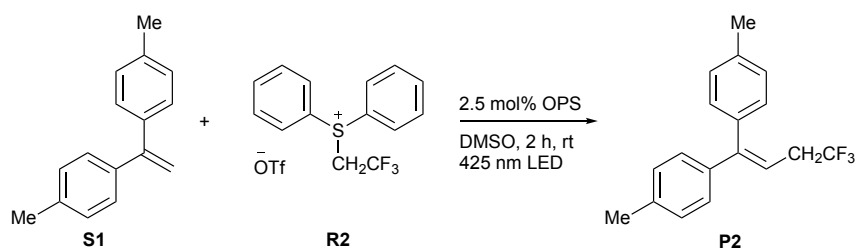
Umemoto reagent II: Combi-Blocks (Cat. No.: QW-8873, Lot. No.: B50765)

DMSO: Wako (Cat. No.: 048-32811, Lot. No.: AC2333)

Table S1. Investigation into the catalytic activity of OPSs in **CF₃**

Name	Yield	Name	Yield	Name	Yield	Name	Yield	Name	Yield
OPS1	57	OPS13	36	OPS25	36	OPS37	97	OPS49	68
OPS2	68	OPS14	20	OPS26	33	OPS38	85	OPS50	59
OPS3	39	OPS15	91	OPS27	87	OPS39	90	OPS51	8
OPS4	52	OPS16	2	OPS28	29	OPS40	87	OPS52	29
OPS5	4	OPS17	90	OPS29	30	OPS41	80	OPS53	51
OPS6	34	OPS18	13	OPS30	91	OPS42	70	OPS54	77
OPS7	93	OPS19	37	OPS31	45	OPS43	20	OPS55	32
OPS8	85	OPS20	45	OPS32	46	OPS44	3	OPS56	4
OPS9	85	OPS21	33	OPS33	67	OPS45	11	OPS57	27
OPS10	92	OPS22	43	OPS34	37	OPS46	40	OPS58	9
OPS11	88	OPS23	50	OPS35	48	OPS47	10	OPS59	6
OPS12	90	OPS24	36	OPS36	89	OPS48	61	OPS60	9

2,2,2-trifluoroethylation of 1,1-di(*p*-tolyl)ethylene (denoted as **CH₂CF₃**)



1,1-Di(*p*-tolyl)ethylene (**S1**, 20.8 mg, 0.100 mmol), diphenyl(2,2,2-trifluoroethyl)sulfonium triflate (**R2**, 62.8 mg, 0.150 mmol), a photosensitizer (0.0025 mmol), and DMSO (1.5 mL) were added to a test tube under air at room temperature. After the mixture was degassed by three freeze-pump-thaw cycles, the test tube was put in PhotoRedOx Box and the reaction was carried out under visible light irradiation ($\lambda = 425$ nm) for 2 h at room temperature. Water (15 mL) was added, and the mixture was extracted with Et₂O (15 mL x 3). The organic phase was dried over Na₂SO₄, filtered, and evaporated. The yield was determined by ¹H NMR spectroscopy with dibromomethane as an internal standard.

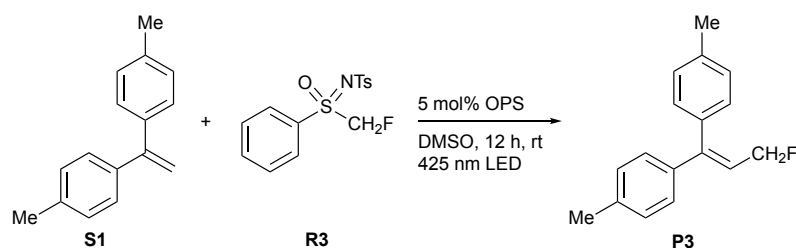
(Commercially available reagents used)

DMSO: Wako (Cat. No.: 048-32811, Lot. No.: AC2333)

Table S2. Investigation into the catalytic activity of OPSs in **CH₂CF₃**

Name	Yield	Name	Yield	Name	Yield	Name	Yield	Name	Yield
OPS1	20	OPS13	20	OPS25	35	OPS37	39	OPS49	74
OPS2	0	OPS14	0	OPS26	8	OPS38	63	OPS50	6
OPS3	0	OPS15	13	OPS27	63	OPS39	77	OPS51	0
OPS4	51	OPS16	0	OPS28	37	OPS40	62	OPS52	34
OPS5	0	OPS17	7	OPS29	30	OPS41	50	OPS53	28
OPS6	0	OPS18	14	OPS30	71	OPS42	54	OPS54	71
OPS7	55	OPS19	39	OPS31	53	OPS43	58	OPS55	60
OPS8	48	OPS20	41	OPS32	0	OPS44	26	OPS56	0
OPS9	68	OPS21	53	OPS33	0	OPS45	32	OPS57	24
OPS10	48	OPS22	41	OPS34	38	OPS46	29	OPS58	2
OPS11	37	OPS23	32	OPS35	54	OPS47	0	OPS59	1
OPS12	35	OPS24	42	OPS36	83	OPS48	51	OPS60	2

Monofluoromethylation of 1,1-di(*p*-tolyl)ethylene (denoted as **CH₂F**)



1,1-Di(*p*-tolyl)ethylene (**S1**, 20.8 mg, 0.100 mmol), *N*-((fluoromethyl)(oxo)(phenyl)-λ⁶-sulfaneylidene)-4-methylbenzenesulfonamide (**R3**, 49.1 mg, 0.150 mmol), a photosensitizer (0.0050 mmol), and DMSO (1.5 mL) were added to a test tube under air at room temperature. After the mixture was degassed by three freeze-pump-thaw cycles, the test tube was put in PhotoRedOx Box and the reaction was carried out under visible light irradiation ($\lambda = 425$ nm) for 12 h at room temperature. After the completion of the reaction, the DMSO solution was extracted with Et₂O (15 mL x 3). Na₂SO₄ was added to the organic phase, and it was filtered and evaporated. The yield was determined by ¹H NMR spectroscopy with 1,3,5-trimethoxybenzene as an internal standard.

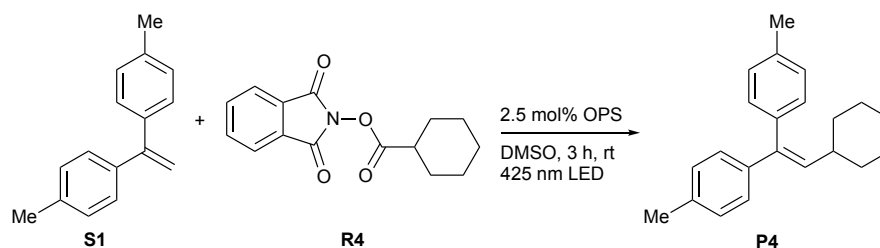
(Commercially available reagents used)

DMSO: Wako (Cat. No.: 048-32811, Lot. No.: AC2333)

Table S3. Investigation into the catalytic activity of OPSs in **CH₂F**

Name	Yield	Name	Yield	Name	Yield	Name	Yield	Name	Yield
OPS1	1	OPS13	0	OPS25	0	OPS37	57	OPS49	26
OPS2	0	OPS14	0	OPS26	0	OPS38	52	OPS50	1
OPS3	0	OPS15	0	OPS27	4	OPS39	57	OPS51	0
OPS4	0	OPS16	0	OPS28	1	OPS40	56	OPS52	1
OPS5	0	OPS17	0	OPS29	4	OPS41	59	OPS53	30
OPS6	0	OPS18	0	OPS30	0	OPS42	48	OPS54	28
OPS7	28	OPS19	0	OPS31	10	OPS43	0	OPS55	14
OPS8	11	OPS20	2	OPS32	0	OPS44	4	OPS56	0
OPS9	14	OPS21	0	OPS33	0	OPS45	9	OPS57	11
OPS10	2	OPS22	0	OPS34	27	OPS46	2	OPS58	0
OPS11	6	OPS23	0	OPS35	38	OPS47	0	OPS59	0
OPS12	2	OPS24	0	OPS36	42	OPS48	25	OPS60	0

Alkylation of 1,1-di(*p*-tolyl)ethylene (denoted as **Cy**)



1,1-Di(*p*-tolyl)ethylene (**S1**, 20.8 mg, 0.100 mmol), 1,3-dihydro-1,3-dioxo-2H-isoindol-2-yl cyclohexanecarboxylate (**R4**, 41.0 mg, 0.150 mmol), a photosensitizer (0.0025 mmol), and DMSO (1.5 mL) were added to a test tube under air at room temperature. After the mixture was degassed by three freeze-pump-thaw cycles, the test tube was put in PhotoRedOx Box and the reaction was carried out under visible light irradiation ($\lambda = 425$ nm) for 3 h at room temperature. Water (15 mL) was added, and the mixture was extracted with Et₂O (15 mL x 3). The organic phase was dried over Na₂SO₄, filtered, and evaporated. The yield was determined by ¹H NMR spectroscopy with 1,3,5-trimethoxybenzene as an internal standard.

(Commercially available reagents used)

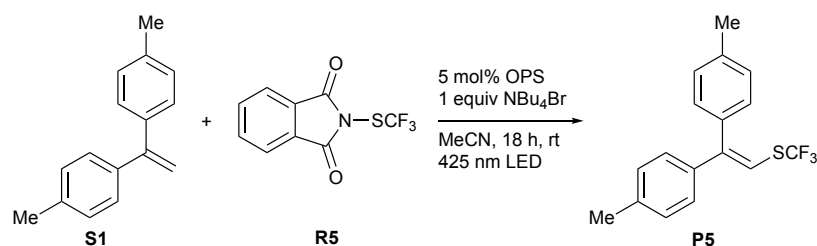
1,3-Dihydro-1,3-dioxo-2H-isoindol-2-yl cyclohexanecarboxylate: BLDpharm (Cat. No.: BD01145079, Lot. No.: CRU828)

DMSO: Wako (Cat. No.: 048-32811, Lot. No.: AC2333)

Table S4. Investigation into the catalytic activity of OPSs in **Cy**

Name	Yield	Name	Yield	Name	Yield	Name	Yield	Name	Yield
OPS1	45	OPS13	40	OPS25	88	OPS37	85	OPS49	73
OPS2	12	OPS14	9	OPS26	55	OPS38	91	OPS50	44
OPS3	8	OPS15	91	OPS27	82	OPS39	88	OPS51	7
OPS4	22	OPS16	6	OPS28	84	OPS40	88	OPS52	85
OPS5	0	OPS17	91	OPS29	86	OPS41	87	OPS53	44
OPS6	5	OPS18	36	OPS30	79	OPS42	91	OPS54	68
OPS7	90	OPS19	34	OPS31	77	OPS43	20	OPS55	58
OPS8	91	OPS20	88	OPS32	22	OPS44	5	OPS56	0
OPS9	98	OPS21	89	OPS33	60	OPS45	32	OPS57	20
OPS10	90	OPS22	82	OPS34	73	OPS46	26	OPS58	4
OPS11	81	OPS23	72	OPS35	91	OPS47	28	OPS59	0
OPS12	80	OPS24	66	OPS36	94	OPS48	65	OPS60	0

Thiotrifluoromethylation of 1,1-di(*p*-tolyl)ethylene (denoted as **SCF₃**)



1,1-Di(*p*-tolyl)ethylene (**S1**, 20.8 mg, 0.100 mmol), *N*-(trifluoromethylthio)phthalimide (**R5**, 32.1 mg, 0.130 mmol), a photosensitizer (0.0050 mmol), tetrabutylammonium bromide (32.2 mg, 0.100 mmol) and MeCN (1.5 mL) were added to a test tube under air at room temperature. After the mixture was degassed by three freeze-pump-thaw cycles, the test tube was put in PhotoRedOx Box and the reaction was carried out under visible light irradiation ($\lambda = 425$ nm) for 18 h at room temperature. Water (15 mL) was added, and the mixture was extracted with Et₂O (15 mL x 3). The organic phase was dried over Na₂SO₄, filtered, and evaporated. The yield was determined by ¹H NMR spectroscopy with 1,3,5-trimethoxybenzene as an internal standard.

(Commercially available reagents used)

N-(Trifluoromethylthio)phthalimide: TCI (Cat. No.: T3143, Lot. No.: MG6QC-OQ)

NBu₄Br: TCI (Cat. No.: T0054, Lot. No.: NL63L-RR)

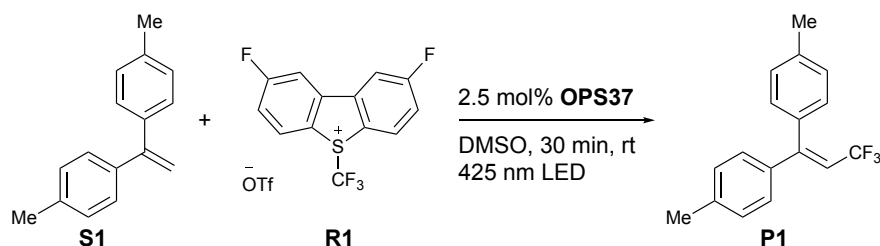
MeCN: Wako (Cat. No.: 010-22905, Lot. No.: ACJ1191)

Table S5. Investigation into the catalytic activity of OPSs in **SCF₃**

Name	Yield	Name	Yield	Name	Yield	Name	Yield	Name	Yield
OPS1	86	OPS13	77	OPS25	89	OPS37	50	OPS49	1
OPS2	70	OPS14	76	OPS26	85	OPS38	94	OPS50	87
OPS3	27	OPS15	90	OPS27	88	OPS39	95	OPS51	21
OPS4	80	OPS16	37	OPS28	91	OPS40	68	OPS52	88
OPS5	12	OPS17	32	OPS29	91	OPS41	43	OPS53	31
OPS6	74	OPS18	83	OPS30	87	OPS42	52	OPS54	94
OPS7	84	OPS19	87	OPS31	75	OPS43	44	OPS55	76
OPS8	90	OPS20	86	OPS32	82	OPS44	54	OPS56	31
OPS9	94	OPS21	92	OPS33	92	OPS45	21	OPS57	26
OPS10	91	OPS22	88	OPS34	94	OPS46	14	OPS58	2
OPS11	79	OPS23	90	OPS35	68	OPS47	4	OPS59	37
OPS12	82	OPS24	62	OPS36	90	OPS48	5	OPS60	0

Synthesis of Authentic Samples

Synthesis of 4,4'-(3,3,3-Trifluoroprop-1-ene-1,1-diyl)bis(methylbenzene) (**P1**)

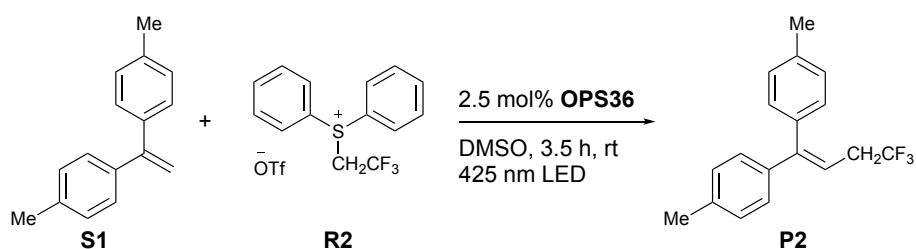


1,1-Di(*p*-tolyl)ethylene (**S1**, 41.7 mg, 0.200 mmol), Umemoto reagent II (**R1**, 105 mg, 0.240 mmol), **OPS37** (1.6 mg, 4.92 mmol), and DMSO (3 mL) were added to a test tube under air at room temperature. After the mixture was degassed by three freeze-pump-thaw cycles, the test tube was put in PhotoRedOx Box and the reaction was carried out under visible light irradiation ($\lambda = 425$ nm) for 30 min at room temperature. Water (15 mL) was added, and the mixture was extracted with Et₂O (15 mL x 3). The organic phase was dried over Na₂SO₄, filtered, and evaporated. The desired product (**P1**) was obtained as a colorless oil (42.6 mg, 0.154 mmol, 77%) after the purification through column chromatography on silica-gel (hexane/ethyl acetate = 20:1) and recycling preparative HPLC.

Spectral data agree with the reported literature.^[S2]

¹H NMR (600 MHz, CDCl₃, rt): δ 7.19–7.17 (m, 2H), 7.14–7.11 (6H), 6.05 (q, $J = 8.4$ Hz, 1H), 2.39 (s, 3H), 2.35 (s, 3H). **¹³C NMR** (151 MHz, CDCl₃, rt): δ 152.6 (q, $J = 5.9$ Hz), 139.6, 138.5, 137.7, 134.7, 129.3, 129.2, 128.8, 128.1, 123.4 (q, $J = 270.6$ Hz), 114.4 (q, $J = 33.2$ Hz), 21.5, 21.3. **¹⁹F NMR** (564 MHz, CDCl₃, rt): δ –56.5 (d, $J = 6.8$ Hz).

Synthesis of 4,4'-(4,4,4-Trifluorobut-1-ene-1,1-diyl)bis(methylbenzene) (**P2**)

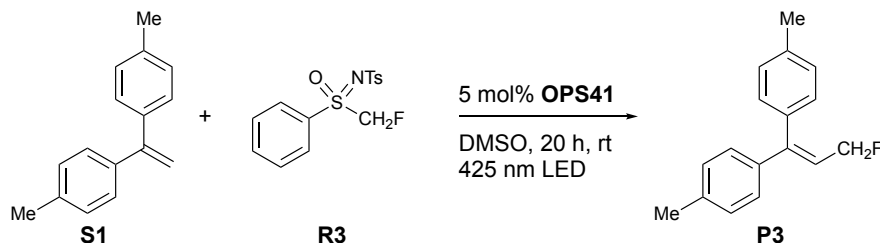


1,1-Di(*p*-tolyl)ethylene (**S1**, 41.7 mg, 0.200 mmol), diphenyl(2,2,2-trifluoroethyl)sulfonium triflate (**R2**, 100 mg, 0.240 mmol), **OPS36** (3.1 mg, 5.05 mmol), and DMSO (3 mL) were added to a test tube under air at room temperature. After the mixture was degassed by three freeze-pump-thaw cycles, the test tube was put in PhotoRedOx Box and the reaction was carried out under visible light irradiation ($\lambda = 425$ nm) for 3.5 h at room temperature. Water (15 mL) was added, and the mixture was extracted with Et₂O (15 mL x 3). The organic phase was dried over Na₂SO₄, filtered, and evaporated. The desired product (**P2**) was obtained as a colorless oil (39.5 mg, 0.136 mmol, 68%) after the purification through column chromatography on silica-gel (hexane) and recycling preparative HPLC.

¹H NMR (600 MHz, CDCl₃, rt): δ 7.20 (d, $J = 7.8$ Hz, 2H), 7.13 (d, $J = 8.4$ Hz, 2H), 7.08 (d, $J = 8.4$ Hz, 2H),

7.05 (d, J = 7.8 Hz, 2H), 6.00 (t, J = 7.2 Hz, 1H), 2.93–2.87 (m, 2H), 2.39 (s, 3H), 2.33 (s, 3H). ^{13}C NMR (151 MHz, CDCl_3 , rt): δ 147.6, 139.0, 137.8, 137.5, 136.0, 129.6, 129.3, 129.1, 127.4, 126.4 (q, J = 277.8 Hz), 115.1, 34.9 (q, J = 29.0 Hz), 21.4, 21.2. ^{19}F NMR (564 MHz, CDCl_3 , rt): δ –66.8 (t, J = 11.3 Hz). HRMS (ESI-QTOF) calcd m/z for $[\text{C}_{18}\text{H}_{17}\text{F}+\text{Na}]^+$ 313.1175 found 313.1177.

Synthesis of 4,4'-(3-Fluoroprop-1-ene-1,1-diyl)bis(methylbenzene) (**P3**)

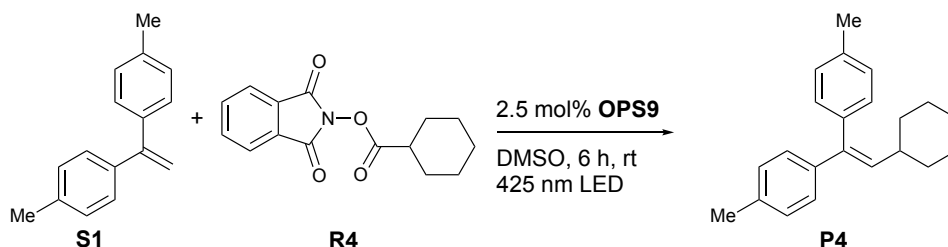


1,1-Di(*p*-tolyl)ethylene (**S1**, 41.7 mg, 0.200 mmol), *N*-((fluoromethyl)(oxo)(phenyl)- λ^6 -sulfaneylidene)-4-methylbenzenesulfonamide (**R3**, 98.2 mg, 0.300 mmol), **OPS41** (6.9 mg, 10.0 mmol), and DMSO (3 mL) were added to a test tube under air at room temperature. After the mixture was degassed by three freeze-pump-thaw cycles, the test tube was put in PhotoRedOx Box and the reaction was carried out under visible light irradiation (λ = 425 nm) for 20 h at room temperature. After the completion of the reaction, the DMSO solution was extracted with hexane (15 mL x 3). Na_2SO_4 was added to the organic phase, and it was filtered and evaporated. The desired product (**P3**) was obtained as a colorless oil (28.1 mg, 0.117 mmol, 58%) after the purification through recycling preparative HPLC.

^1H NMR (600 MHz, CDCl_3 , rt): δ 7.19–7.05 (8H), 6.23 (dt, J = 10.8 Hz, 7.8 Hz, 1H), 4.92 (dd, J = 47.4 Hz, 7.2 Hz, 2H), 2.39 (s, 3H), 2.35 (s, 3H). ^{13}C NMR (151 MHz, CDCl_3 , rt): δ 147.7 (d, J = 11.6 Hz), 138.9 (d, J = 3.0 Hz), 138.1, 137.8, 135.7, 129.8, 129.1, 129.0, 127.9, 121.5 (d, J = 17.4 Hz), 80.9 (d, J = 157.6 Hz), 21.4, 21.3. ^{19}F NMR (564 MHz, CDCl_3 , rt): δ –206.3 (dt, J = 47.4 Hz, 10.7 Hz).

HRMS (ESI-QTOF) calcd m/z for $[\text{C}_{17}\text{H}_{17}\text{F}+\text{Na}]^+$ 263.1206 found 263.1206.

Synthesis of 4,4'-(2-Cyclohexylethene-1,1-diyl)bis(methylbenzene) (**P4**)



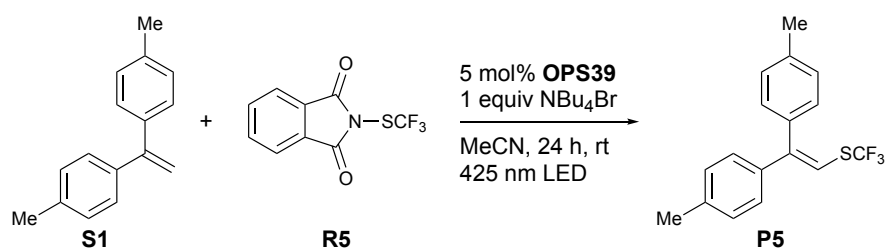
1,1-Di(*p*-tolyl)ethylene (**S1**, 41.7 mg, 0.200 mmol), 1,3-dihydro-1,3-dioxo-2H-isoinol-2-yl cyclohexanecarboxylate (**R4**, 82.0 mg, 0.300 mmol), **OPS9** (4.5 mg, 4.95 mmol), and DMSO (3 mL) were added to a test tube under air at room temperature. After the mixture was degassed by three freeze-pump-thaw cycles, the test tube was put in PhotoRedOx Box and the reaction was carried out under visible light irradiation (λ = 425 nm) for 6 h at room temperature. Water (15 mL) was added, and the mixture was

extracted with Et₂O (15 mL x 3). The organic phase was dried over Na₂SO₄, filtered, and evaporated. The desired product (**P5**) was obtained as a white solid (44.3 mg, 0.153 mmol, 76%) after the purification through column chromatography on silica-gel (hexane) and recycling preparative HPLC.

Spectral data agree with the reported literature.^[S3]

¹H NMR (600 MHz, CDCl₃, rt): δ 7.17-7.04 (m, 8H), 5.82 (d, *J* = 10.0 Hz, 1H), 2.38 (s, 3H), 2.31 (s, 3H), 2.14-2.13 (m, 1H), 1.67-1.59 (m, 5H), 1.25-1.15 (m, 5H). **¹³C NMR** (151 MHz, CDCl₃, rt): δ 140.6, 139.4, 137.9, 136.5, 136.4, 135.2, 129.8, 128.9, 128.8, 127.3, 38.4, 33.6, 26.2, 25.8, 21.4, 21.2

Synthesis of (2,2-Di-*p*-tolylvinyl)(trifluoromethyl)sulfane (**P5**)



1,1-Di(*p*-tolyl)ethylene (**S1**, 41.7 mg, 0.200 mmol), *N*-(trifluoromethylthio)phthalimide (**R5**, 64.3 mg, 0.260 mmol), **OPS39** (6.3 mg, 10.0 mmol), tetrabutylammonium bromide (64.5 mg, 0.200 mmol) and MeCN (3 mL) were added to a test tube under air at room temperature. After the mixture was degassed by three freeze-pump-thaw cycles, the test tube was put in PhotoRedOx Box and the reaction was carried out under visible light irradiation (λ = 425 nm) for 24 h at room temperature. Water (15 mL) was added, and the mixture was extracted with Et₂O (15 mL x 3). The organic phase was dried over Na₂SO₄, filtered, and evaporated. The desired product (**P5**) was obtained as a colorless oil (55.0 mg, 0.178 mmol, 89%) after the purification through column chromatography on silica-gel (hexane/ethyl acetate = 20:1) and recycling preparative HPLC.

Spectral data agree with the reported literature.^[S4]

¹H NMR (600 MHz, CDCl₃, rt): δ 7.22 (d, *J* = 8.4 Hz, 2H), 7.14–7.09 (6H), 6.60 (s, 1H), 2.40 (s, 3H), 2.35 (s, 3H). **¹³C NMR** (151 MHz, CDCl₃, rt): δ 146.8, 138.6, 138.5, 137.9, 135.4, 130.0 (q, *J* = 308.2 Hz), 129.43, 129.40, 127.5, 110.8 (q, *J* = 2.9 Hz), 21.5, 21.3. **¹⁹F NMR** (564 MHz, CDCl₃, rt): δ –43.9.

Spectroscopic Measurements for OPSs

(1) General information

Photoluminescence spectra were recorded on FP-8500 spectrophotometers. Absolute fluorescence (FL) quantum yields were determined by utilizing the integrating sphere method with a Hamamatsu Photonics C9920-02 absolute photoluminescence quantum yields measurement system. FL decay profiles were measured by using a HORIBA Jobin Yvon FluoroCube lifetime spectrofluorometer equipped with HORIBA NanoLED-370 and analyzed using DAS6 FL decay analysis software. Transient absorption spectra were recorded using a picoTAS system (Unisoku Co., Ltd.) based on a Randomly-Interleaved-Pulse-Train method. The pump laser used was a wavelength-tunable picosecond laser (PL-2210A and PG403, EKSPLA) with a pulse width of 25 ps.

(2) Measurement of fluorescence quantum yield and lifetime

Measurements of fluorescence quantum yield and fluorescence decay profiles were performed under Ar in toluene. The sample solutions were degassed with Ar for 10 minutes of bubbling before measurements. To obtain the experimentally determined rate constants, measurements were also conducted under air for TADF (**OPS5**, **OPS7**).

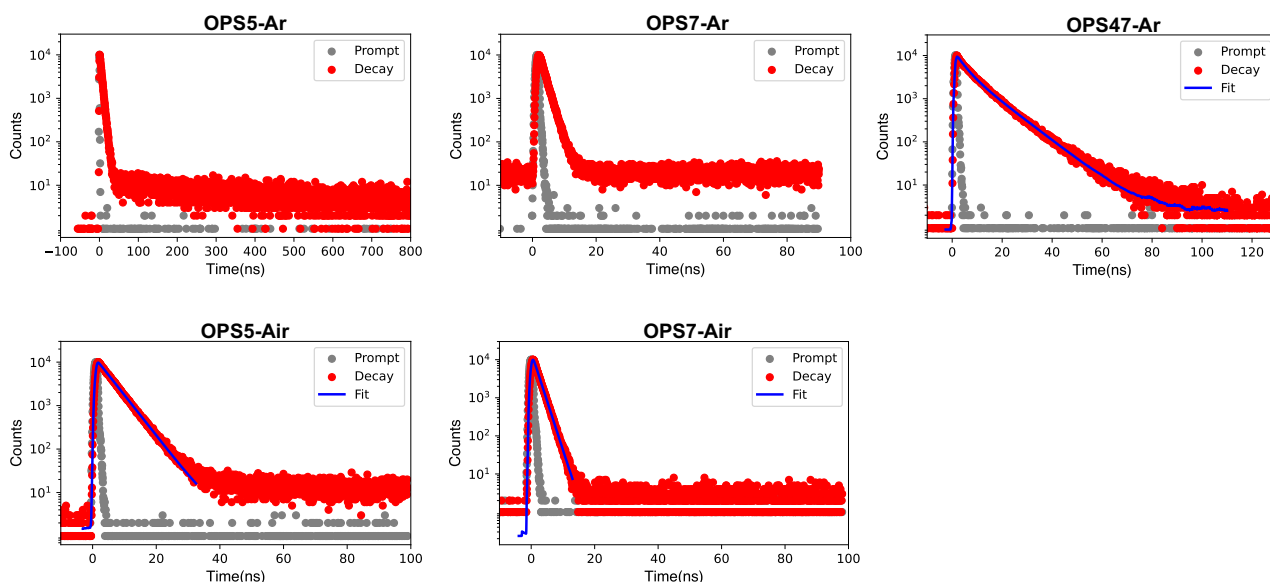


Figure S3. Result of FL lifetime measurement under Ar and Air

Table S6. Results of FL quantum yields and lifetimes

OPS	$\Phi_{FL,(air)}$	$\Phi_{FL,(Ar)}$	$\tau_{prompt,(air)}$ (ns)	$\tau_{prompt,(Ar)}$ (ns)	$\tau_{delay,(Ar)}$ (ns)
OPS5	0.05	0.06	4.66	4.78	616
OPS7	0.08	0.20	1.68	1.68	34400
OPS47	—	0.02	—	3.51	9.86

Φ : Photoluminescence quantum yield, τ_{prompt} : Prompt emission, τ_{delay} : Delayed emission

Note: The fluorescence decay profile of **OPS47** was also fitted with a double exponential function. However, since the lifetime of the delayed component was less than 10 ns, **OPS47** was determined not to be a TADF compound. Therefore, the shorter component (3.51 ns) was assigned to the prompt excited-state lifetime.

(3) Measurement of ΔE_{ST}

The sample solutions (solvent: 2-methyltetrahydrofuran) were degassed by three freeze (77 K)–pump (0.1 mmHg)–thaw (RT) cycles before measurements. Fluorescence and phosphorescence spectra were measured at room temperature and at 77 K using liquid nitrogen, respectively. The ΔE_{ST} values were determined from the difference in peak energies of the fluorescence and phosphorescence spectra.

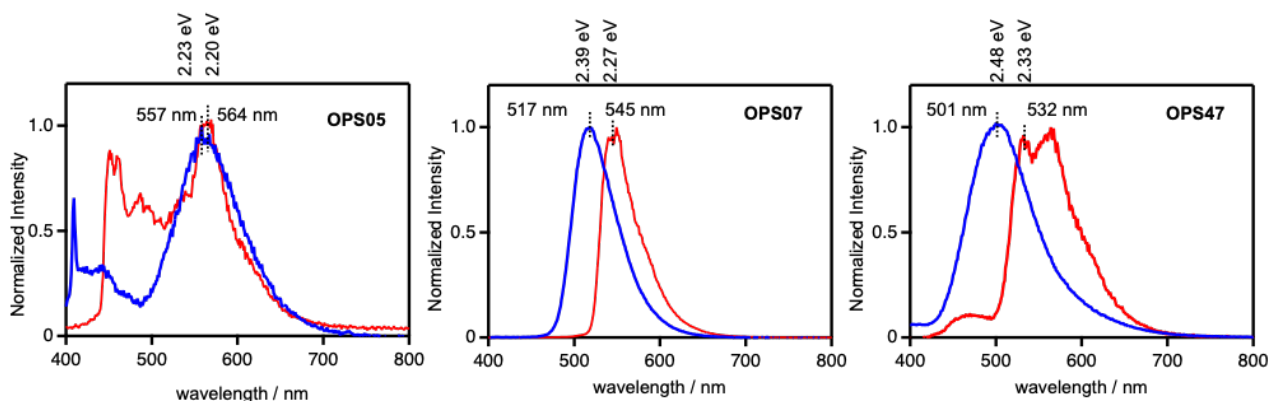


Figure S4. Fluorescence and phosphorescence spectra of **OPS5**, **OPS7**, and **OPS47**

Table S7. Experimentally determined ΔE_{ST} values

OPS1 (eV)	OPS5 (eV)	OPS7 (eV)	OPS47 (eV)
0.08 ^[a]	0.03	0.12	0.15

[a] Literature data measured in toluene, which is taken from ref. [S5].

Note 1: In contrast, the computed values (**OPS1**: 0.37 eV, **OPS5**: 0.39 eV, **OPS7**: 0.70 eV, **OPS47**: 0.42 eV) were obtained by calculations at the PCM(toluene)-CAM-B3LYP-D3/6-31G(d) level.

Note 2: For **OPS1**, **OPS5**, and **OPS7**, these values were not employed in the determination of the experimental rate constants. However, they were used in the quantum chemical calculations where the experimentally determined ΔE_{ST} values were applied.

(4) Multi-wavelength global analysis^[S6]

To determine the rate constants $k_{isc}(S_1 \rightarrow T_1)$ and $k_{risc}(T_1 \rightarrow S_0)$ for **OPS47**, transient absorption measurements were conducted using picoTAS (excited at 355 nm). Multi-wavelength global analysis was carried out using Glotaran 1.5 software to obtain rate constants involved in the intersystem crossing and to resolve the dynamics of the S_1 and T_1 species.

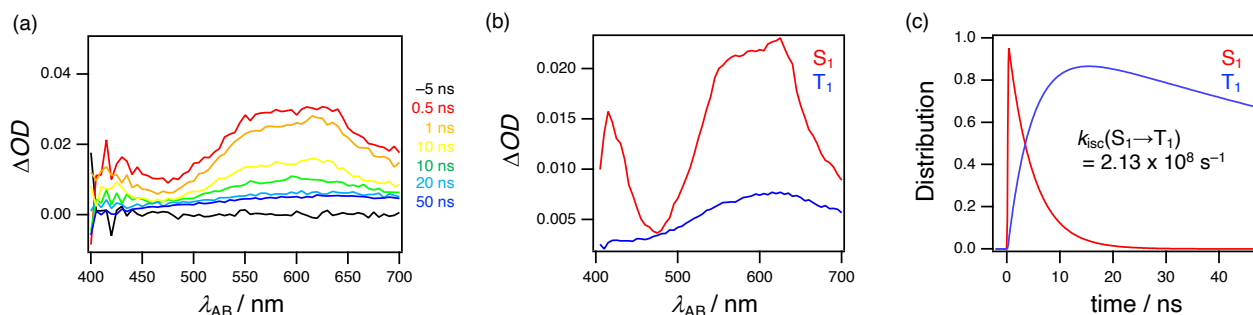


Figure S5. Result of global analysis for **OPS47**. (a) Transient absorption spectrum observed upon excitation of **OPS47** in Ar-saturated toluene. (b) Absorption spectra of the S_1 (red) and T_1 (blue) species obtained by multi-wavelength global analysis. (c) Time-dependent changes of distribution of the S_1 (red) and T_1 (blue) species.

Table S8. Result of global analysis

OPS	$\tau_{S_1 \rightarrow T_1 (Ar)}$ (ns)	$\tau_{T_1 \rightarrow S_0 (Ar)}$ (ns)
OPS47	4.68	106

Experimentally Determined Rate Constants

The experimentally determined rate constants were calculated using two distinct methods, depending on whether OPSs exhibited TADF or not.

[Method-A]

For OPSs exhibiting TADF (**OPS5**, **OPS7**), it is possible to calculate the rate constants for several excited-state processes by measuring the fluorescence quantum yield and fluorescence lifetimes under an Ar atmosphere and air. In this case, three rate constants $k_r(S_1 \rightarrow S_0)$, $k_{isc}(S_1 \rightarrow T_1)$, and $k_{isc}(T_1 \rightarrow S_1)$ were obtained, similar to previous studies (for instance, ref. [S7]).

$$\begin{aligned}
 k_p &= 1 / \tau_{p,(Ar)} \\
 k_d &= 1 / \tau_{d,(Ar)} \\
 \Phi_p &= \Phi_{FL,(air)} \times \tau_{p,(Ar)} / \tau_{p,(air)} \\
 \Phi_d &= \Phi_{FL,(Ar)} - \Phi_p \\
 k_r(S_1 \rightarrow S_0) &= \Phi_p \times k_p + \Phi_d \times k_d \approx \Phi_p \times k_p \\
 k_{isc}(S_1 \rightarrow S_0) &= (1 - \Phi_p) \times k_p \\
 k_{isc}(T_1 \rightarrow S_1) &= \frac{k_p \times k_d \times \Phi_d}{k_{isc}(S_1 \rightarrow T_1) \times \Phi_p}
 \end{aligned}$$

The $\tau_{p,(Ar)}$, $\tau_{d,(Ar)}$, and $\tau_{p,(air)}$ values were experimentally obtained by the analysis of fluorescence decay profiles under an Ar atmosphere or air. The $\Phi_{FL,(Ar)}$ and $\Phi_{FL,(air)}$ values were also experimentally measured under an Ar atmosphere or air. The physical properties used in this method are listed in **Table S9**. The experiments required for their determination are provided in the “Measurement of fluorescence quantum yield and lifetime” section.

Table S9. Physical properties used in method-A

OPS	$\Phi_{FL,(air)}$	$\Phi_{FL,(Ar)}$	$\tau_{prompt,(Air)}$ (ns)	$\tau_{prompt,(Ar)}$ (ns)	$\tau_{delay,(Ar)}$ (ns)
OPS5	0.05	0.06	4.66	4.78	616
OPS7	0.08	0.20	1.68	1.68	34400

[Method-B]

For an OPS that does not exhibit TADF (**OPS47**), the fluorescence quantum yield and fluorescence lifetime were measured under an Ar atmosphere to calculate the $k_r(S_1 \rightarrow S_0)$ value. The $k_{isc}(S_1 \rightarrow T_1)$ and $k_{isc}(T_1 \rightarrow S_0)$ values were determined by performing transient absorption measurements, followed by multi-wavelength global analysis to deconvolute the singlet and triplet species. The $k_{ic}(S_1 \rightarrow S_0)$ value was calculated by subtracting the rate constant of the radiative decay process (from S_1 to S_0) and that of the intersystem crossing process (from S_1 to T_1) from the inverse of the fluorescence lifetime. Meanwhile, the $k_{risc}(T_1 \rightarrow S_1)$ value was determined through the measurement of the ΔE_{ST} value from the difference between fluorescence and phosphorescence spectra and applying it to the following Boltzmann distribution equation to back-calculate from $k_{isc}(S_1 \rightarrow T_1)$.

$$\begin{aligned}
 k_p &= 1 / \tau_{p,(Ar)} \\
 k_{ems}(S_1 \rightarrow S_0) &= \Phi_{FL,(Ar)} \times k_p \\
 k_{isc}(S_1 \rightarrow T_1) &= 1 / \tau_{S_1 \rightarrow T_1(Ar)} \\
 k_{ic}(S_1 \rightarrow S_0) &= k_p - k_{ems}(S_1 \rightarrow S_0) - k_{isc}(S_1 \rightarrow T_1) \\
 k_{isc}(T_1 \rightarrow S_0) &= 1 / \tau_{T_1 \rightarrow S_0(Ar)} \\
 k_{risc}(T_1 \rightarrow S_1) &= k_{isc}(S_1 \rightarrow T_1) \times e^{\frac{-\Delta E_{ST}}{RT}}
 \end{aligned}$$

The $\tau_{p,(Ar)}$ value was experimentally obtained by analysis of the fluorescence decay profile. The $\tau_{S_1 \rightarrow T_1(Ar)}$ and $\tau_{T_1 \rightarrow S_0(Ar)}$ values were obtained by transient absorption spectroscopic analysis with picoTAS,^[S8] followed by the multi-wavelength global analysis. The ΔE_{ST} value was measured value (**Table S10**). The experiments required for their determination are provided in the “Measurement of fluorescence quantum yield and lifetime”, “Measurement of ΔE_{ST} ”, and “Multi-wavelength global analysis” sections.

Table S10. Physical properties used in Method-B

	$\Phi_{FL,(Ar)}$	$\tau_{prompt,(Ar)}$ (ns)	$\tau_{S_1 \rightarrow T_1(Ar)}$ (ns)	$\tau_{T_1 \rightarrow S_0(Ar)}$ (ns)	ΔE_{ST} (eV)
OPS47	0.02	3.51	4.68	106	0.15

Table S11. Experimentally determined rate constants

OPS	$k_r(S_1 \rightarrow S_0)$ (s ⁻¹)	$k_{ic}(S_1 \rightarrow S_0)$ (s ⁻¹)	$k_{isc}(S_1 \rightarrow T_1)$ (s ⁻¹)	$k_{risc}(T_1 \rightarrow S_1)$ (s ⁻¹)	$k_{isc}(T_1 \rightarrow S_0)$ (s ⁻¹)
OPS1	1.7×10^7 ^[a]	1.5×10^6 ^[a]	5.1×10^7 ^[a]	2.7×10^6 ^[a]	—
OPS5	1.1×10^7	—	2.0×10^8	2.9×10^5	—
OPS7	4.8×10^7	—	5.5×10^8	4.7×10^4	—
OPS47	5.7×10^6	6.6×10^7	2.1×10^8	6.2×10^5	9.4×10^6

Method-A was used for **OPS5** and **OPS7**, while Method-B was used for **OPS47**. [a] Rate constants of **OPS1** are taken from ref. [S9].

Measurement of Excited-State Lifetimes Used for ML by Transient Absorption Spectroscopy

(1) Methods for measurement

The measurement of excited-state lifetimes by transient absorption spectroscopy was performed under an Ar atmosphere in toluene or DMSO using picoTAS.^[S8] In cases where solubility issues made measurements difficult, MeCN was used as an alternative solvent to toluene, and DMF was used as an alternative solvent to DMSO. The sample concentration was adjusted to ensure that the absorbance at 355 nm (the excitation wavelength for the transient absorption measurements) was between 0.6 and 0.9, unless there were any issues. The sample solutions were degassed by bubbling Ar for 10 minutes before the measurements.

(2) Methods for fitting

In this study, the OPSs were classified into three types. The first type consists of compounds whose decay curves contain a single component that can be fitted with a single exponential function. In this case, the measured lifetime itself was used as the descriptor. The second type includes compounds with decay curves that can be fitted with a double exponential function but were determined not to exhibit delayed fluorescence. For these compounds, the shorter excited-state lifetime of the two components was used as the descriptor. The third type corresponds to TADF compounds, for which the longer excited-state lifetime was used as the descriptor.

Table S12. Excited-state lifetimes of each photosensitizer in transient absorption measurements

OPS	LT_t (ns)	LT_d (ns)	OPS	LT_t (ns)	LT_d (ns)	OPS	LT_t (ns)	LT_d (ns)
OPS1	1.2×10^3	1.6×10^3	OPS21	1.5×10^4	3.1×10^4	OPS41	7.2	1.6×10^1
OPS2	9.5×10^2	9.0×10^2	OPS22	7.8×10^2	3.1×10^4	OPS42	7.3	1.2×10^1
OPS3	1.2×10^3	1.1×10^3	OPS23	1.7×10^3	2.0×10^4	OPS43	1.5×10^1	3.5×10^1
OPS4	1.4×10^3	4.1×10^2	OPS24	6.9	1.0×10^4	OPS44	1.9×10^1	$2.0 \times 10^{1[b]}$
OPS5	3.8	2.9×10^{-1}	OPS25	9.1×10^3	1.8×10^4	OPS45	1.9×10^1	2.5×10^1
OPS6	1.1×10^3	1.3×10^3	OPS26	1.5×10^1	3.8×10^{-1}	OPS46	2.7×10^1	2.3
OPS7	3.9×10^3	1.6×10^4	OPS27	5.4×10^3	2.9×10^4	OPS47	7.7×10^{-1}	2.4×10^{-1}
OPS8	1.0×10^4	1.6×10^4	OPS28	7.0×10^3	3.4×10^4	OPS48	2.0×10^3	1.7×10^3
OPS9	6.7×10^3	6.8×10^3	OPS29	5.2×10^3	3.1×10^4	OPS49	4.3×10^2	1.8
OPS10	7.0×10^3	1.8×10^4	OPS30	4.9×10^3	2.9×10^4	OPS50	2.5×10^4	5.1×10^3
OPS11	7.6×10^3	1.6×10^4	OPS31	2.3×10^3	1.7×10^4	OPS51	3.0×10^3	8.2×10^2
OPS12	8.2×10^3	1.3×10^4	OPS32	3.0×10^3	9.3×10^3	OPS52	7.0×10^1	5.5×10^4
OPS13	8.1×10^2	3.2×10^2	OPS33	7.8×10^2	4.6×10^3	OPS53	1.2×10^3	4.7×10^3
OPS14	2.6×10^3	3.4×10^2	OPS34	6.0	1.9×10^4	OPS54	4.0×10^3	5.1×10^3
OPS15	2.7×10^3	2.0×10^4	OPS35	2.9	1.1×10^4	OPS55	1.4×10^1	2.0×10^4
OPS16	1.8×10^3	1.8×10^3	OPS36	7.6×10^2	1.1×10^4	OPS56	1.4×10^1	$5.3^{[b]}$
OPS17	2.2×10^3	6.3×10^3	OPS37	1.0×10^3	6.5×10^3	OPS57	1.9×10^3	8.6×10^3
OPS18	1.6×10^3	1.5×10^4	OPS38	2.4×10^3	1.6×10^4	OPS58	7.9	6.7
OPS19	1.0×10^3	1.6×10^4	OPS39	4.3×10^2	3.3×10^4	OPS59	$6.1 \times 10^{3[a]}$	$2.3^{[b]}$
OPS20	1.9×10^3	2.1×10^4	OPS40	6.5	9.4	OPS60	$1.1 \times 10^{4[a]}$	$2.2 \times 10^{-1[b]}$

LT_t represents the excited-state lifetime measured in toluene, while LT_d represents that measured in DMSO. [a] MeCN or [b] DMF was used as solvents for the measurement.

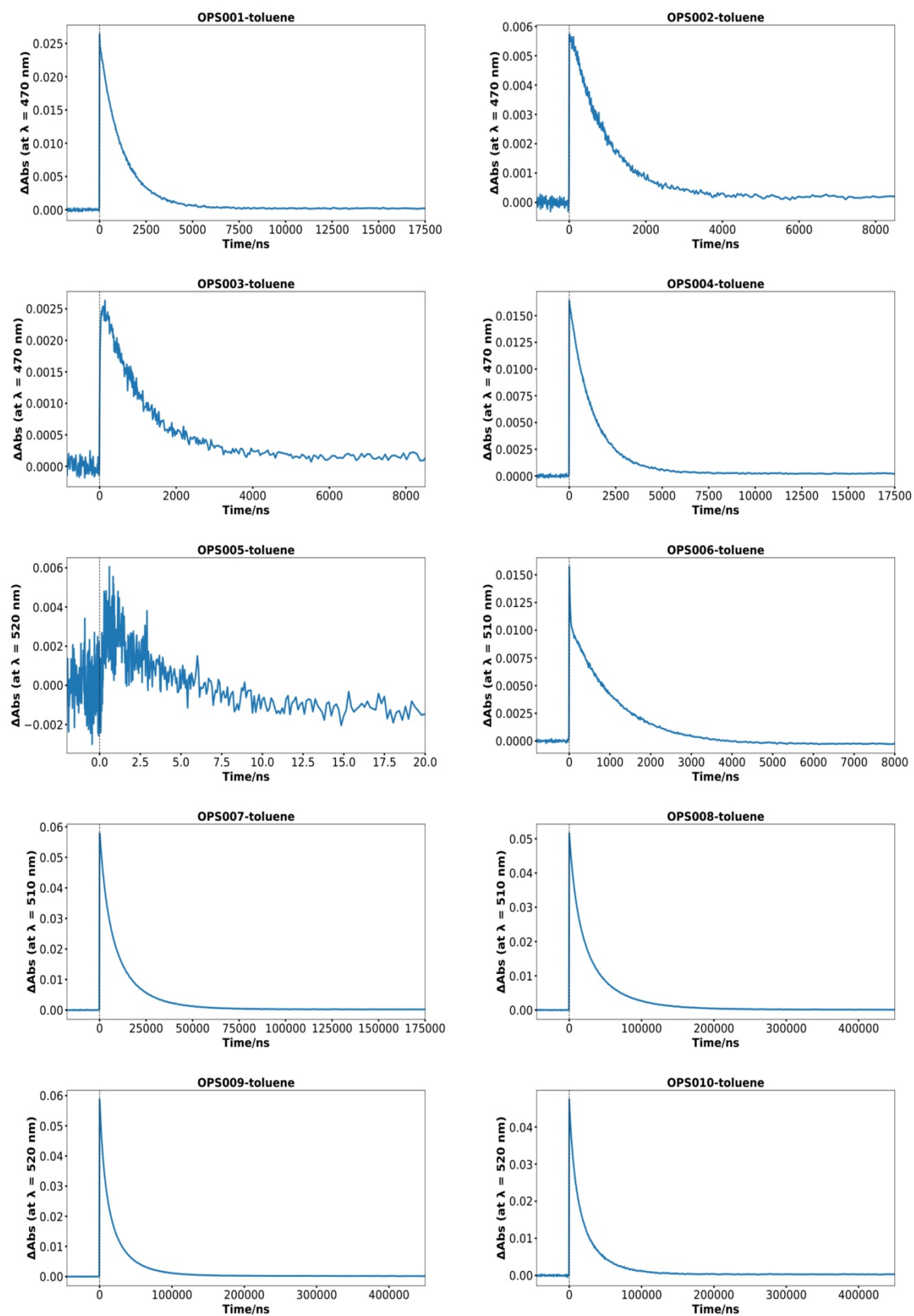


Figure S6-1. Decay time profiles of the transient absorption

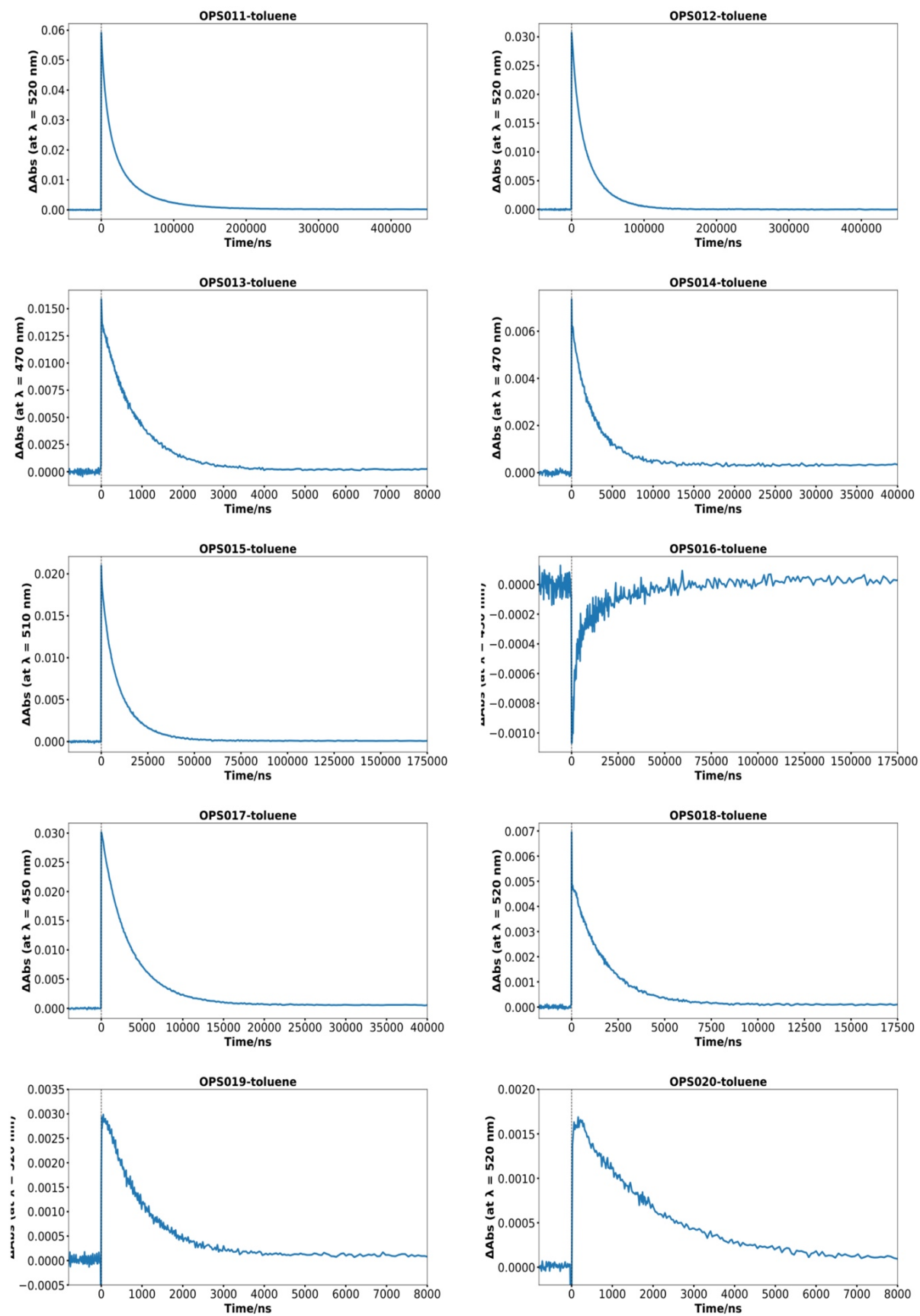


Figure S6-2. Decay time profiles of the transient absorption

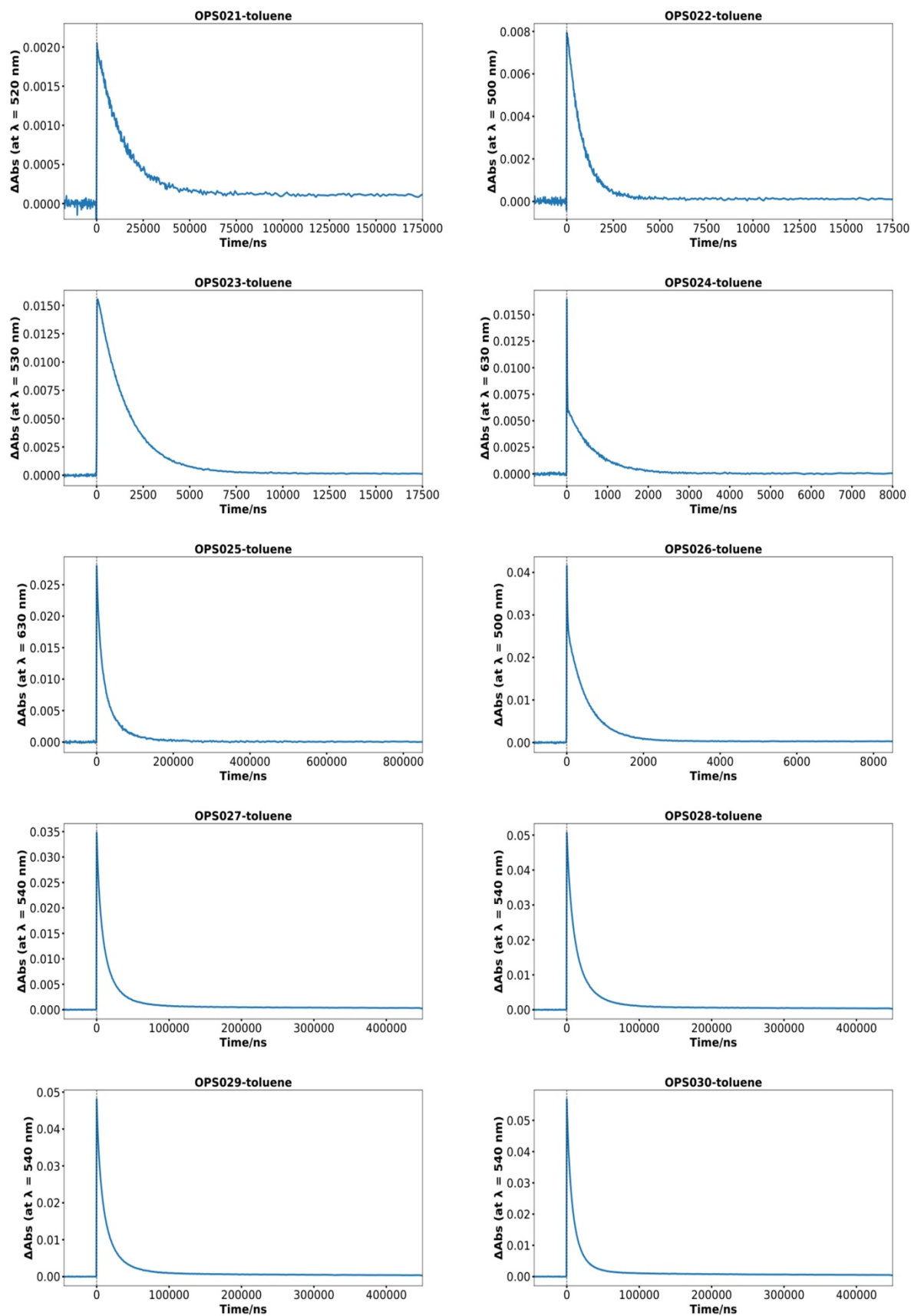


Figure S6-3. Decay time profiles of the transient absorption

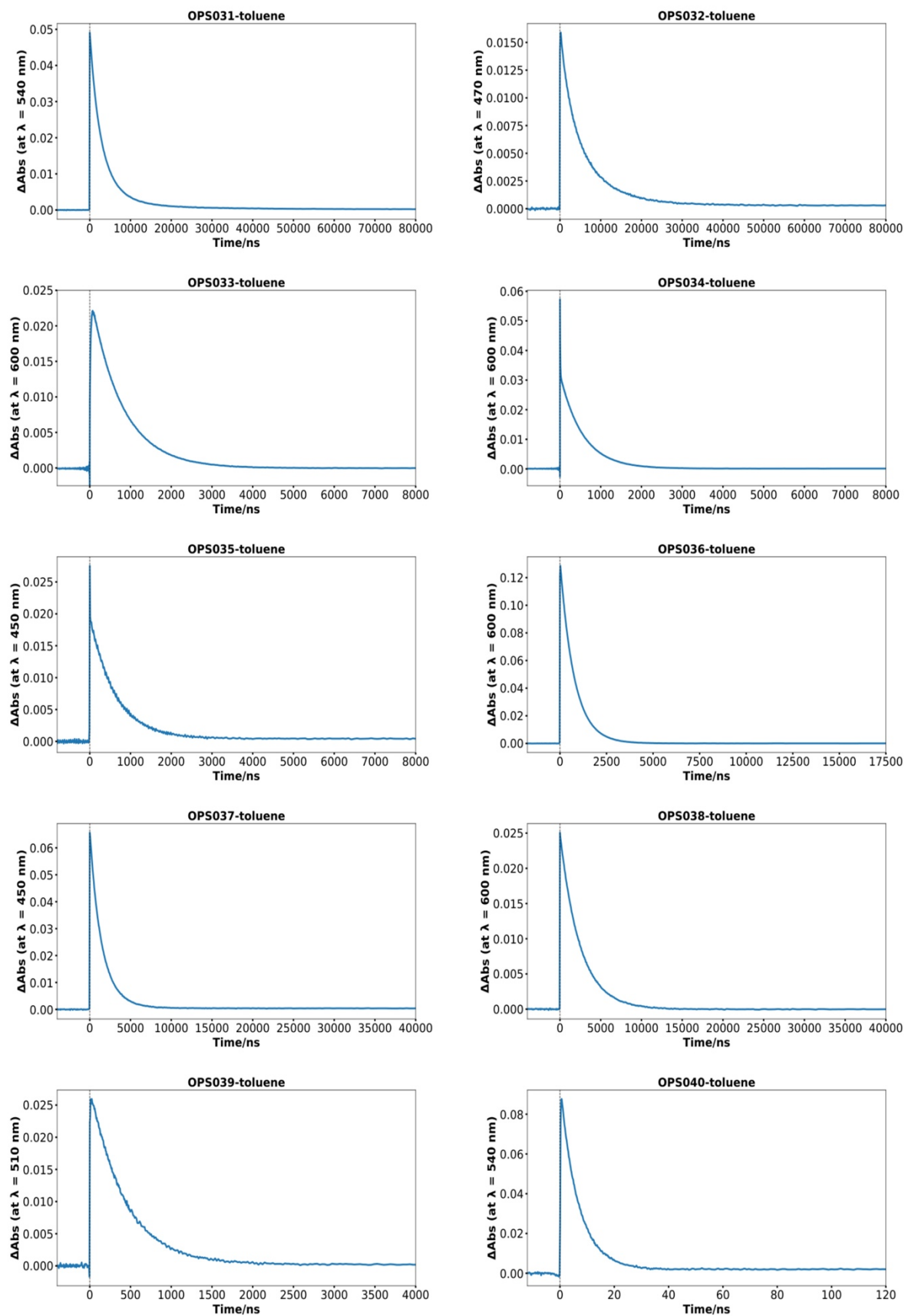


Figure S6-4. Decay time profiles of the transient absorption

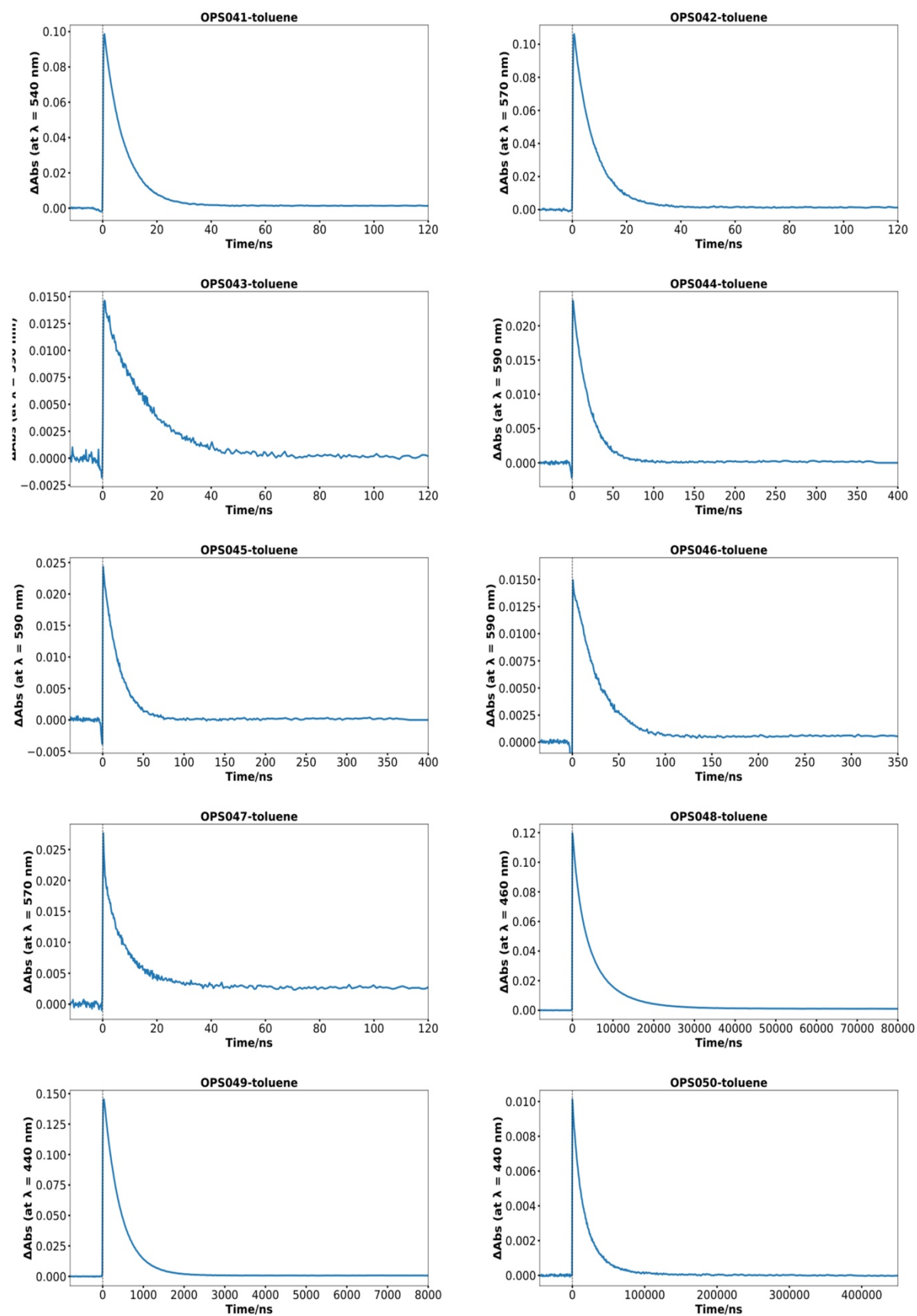


Figure S6-5. Decay time profiles of the transient absorption

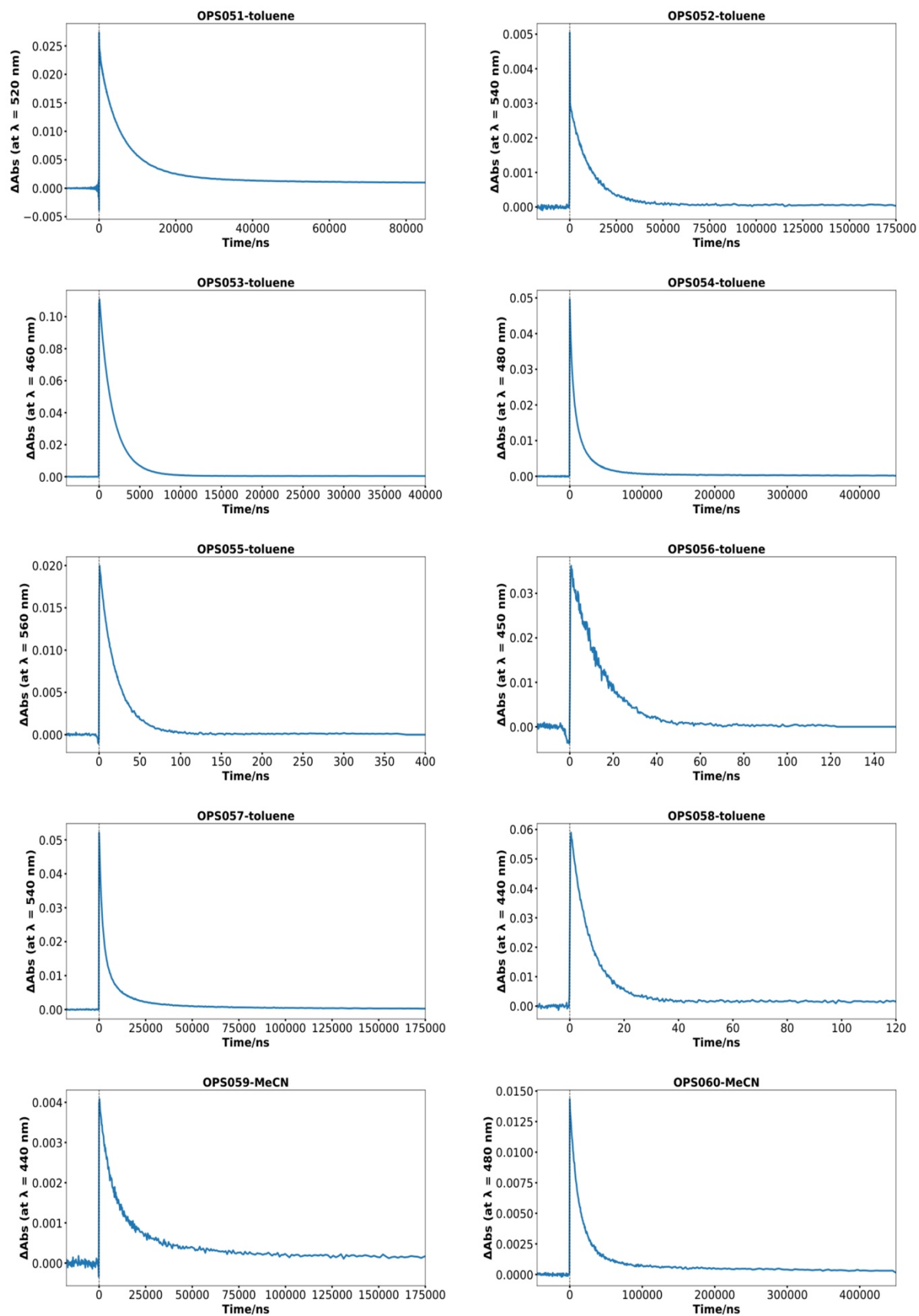


Figure S6-6. Decay time profiles of the transient absorption

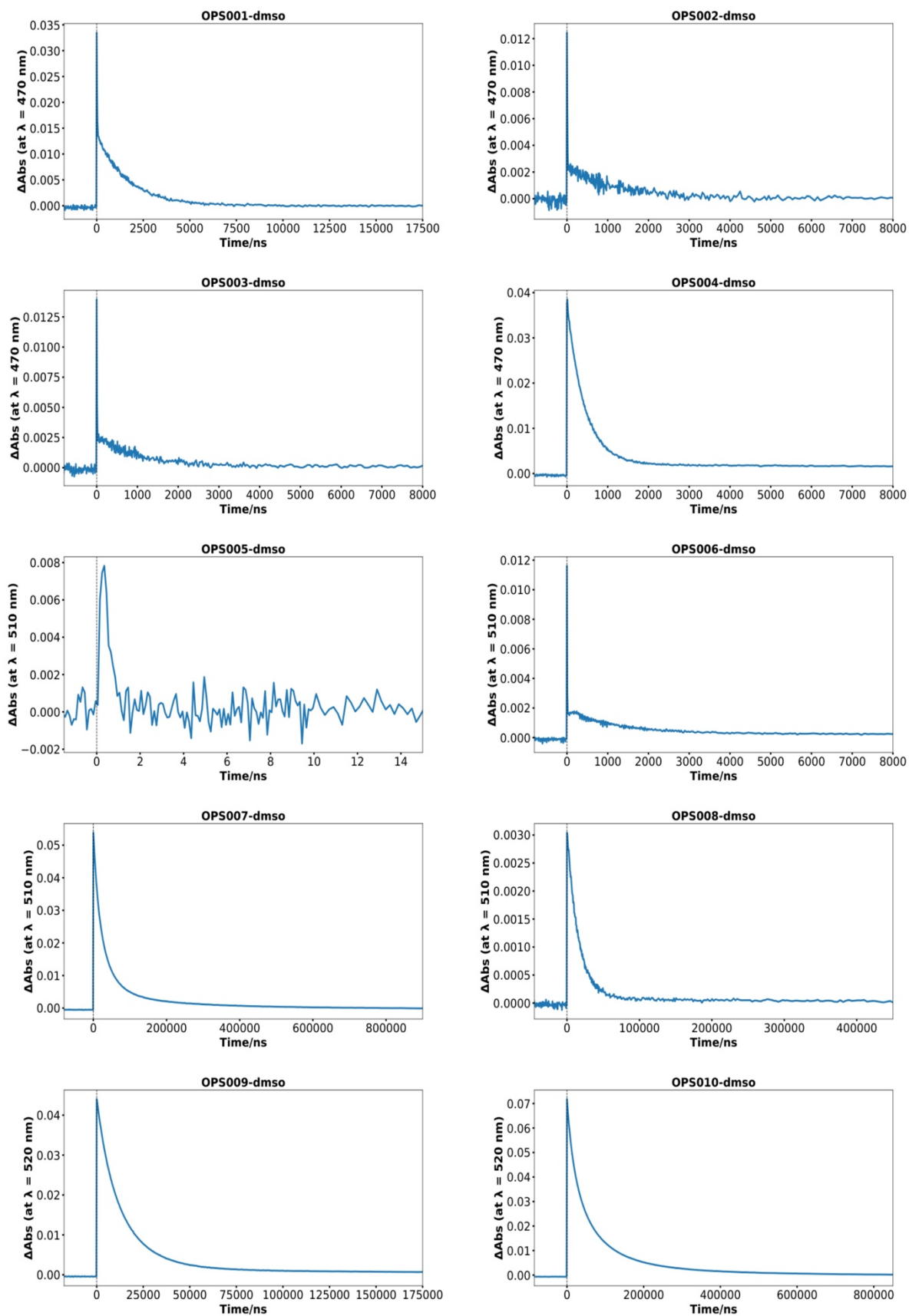


Figure S6-7. Decay time profiles of the transient absorption.

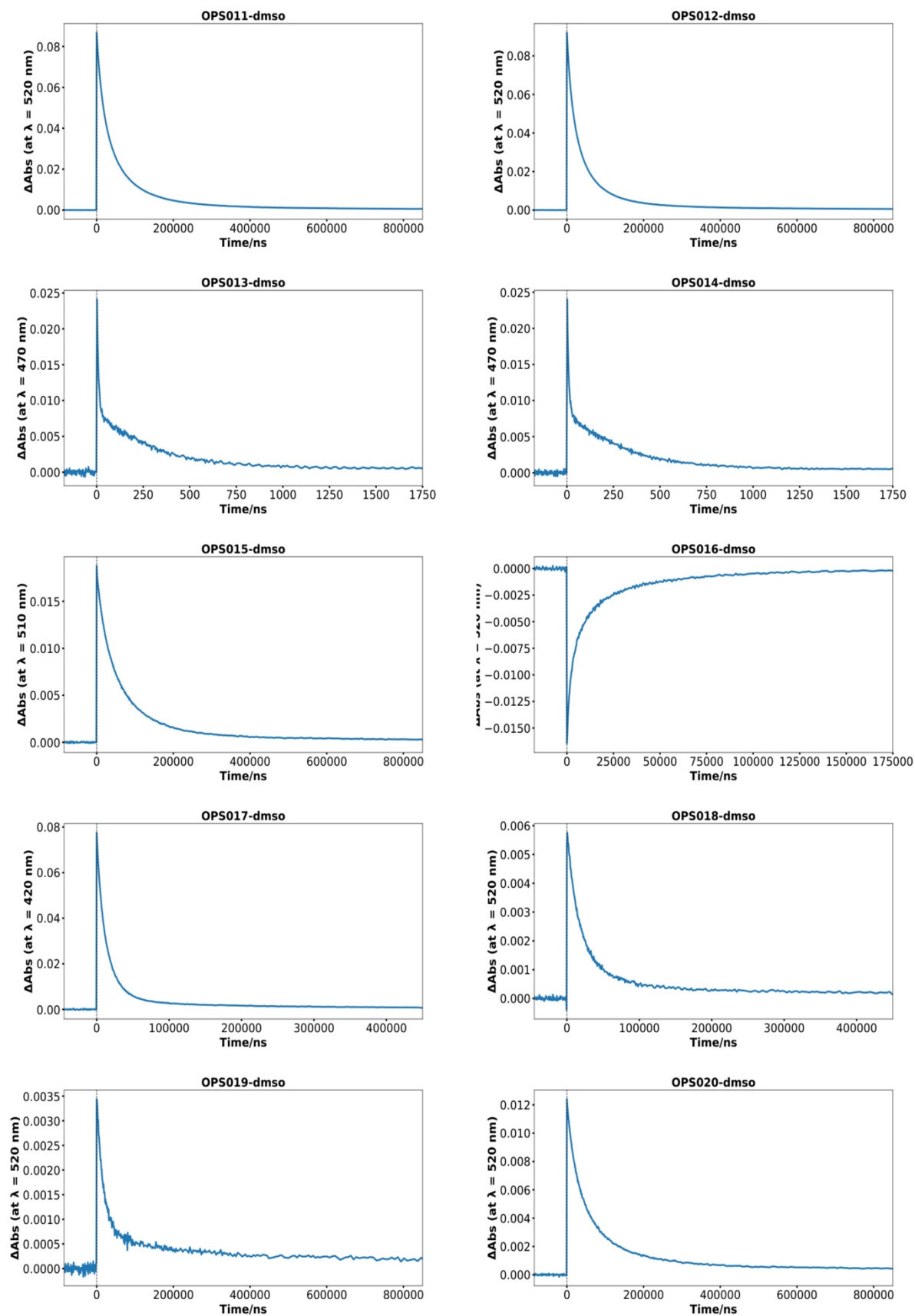


Figure S6-8. Decay time profiles of the transient absorption

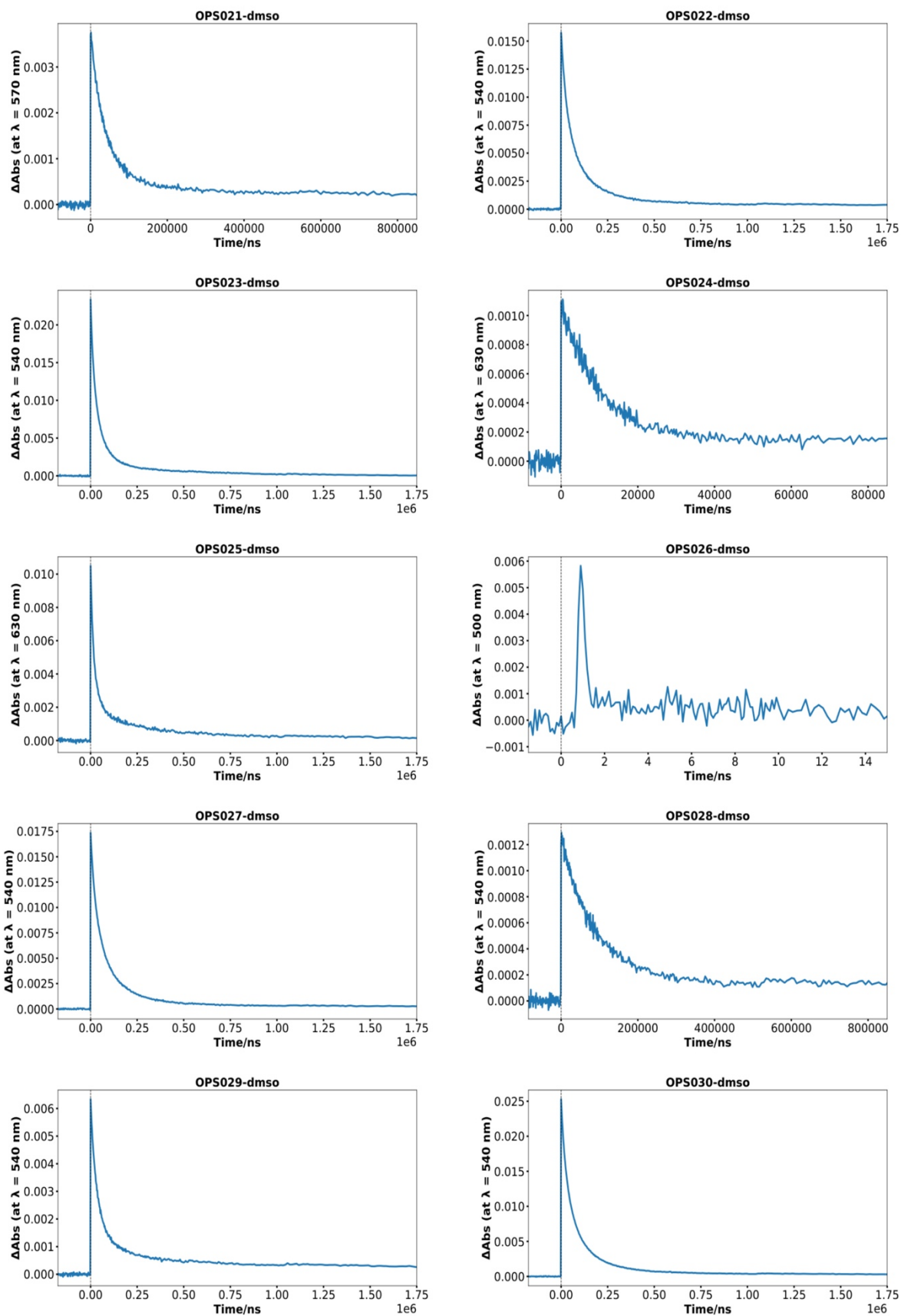


Figure S6-9. Decay time profiles of the transient absorption

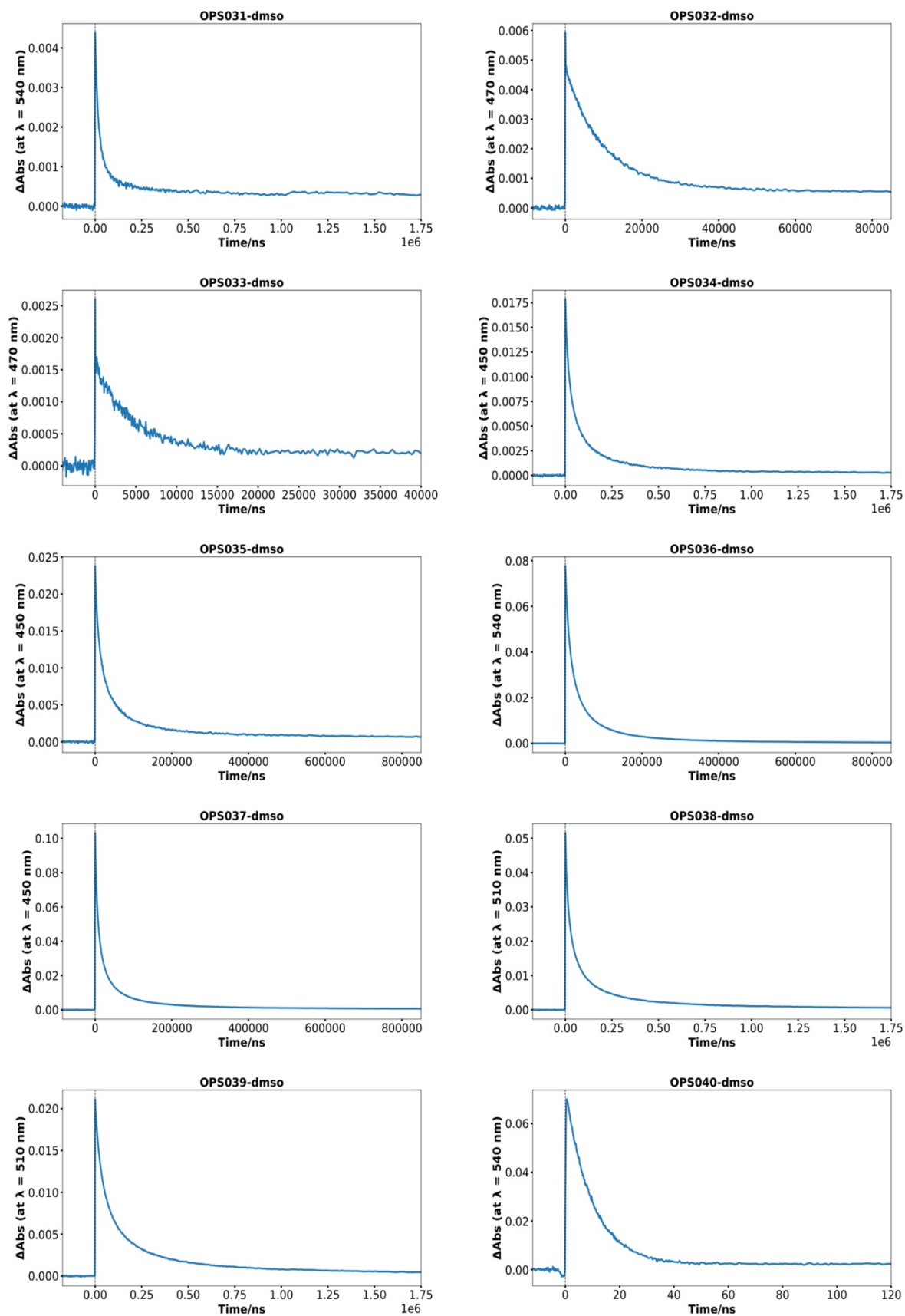


Figure S6-10. Decay time profiles of the transient absorption

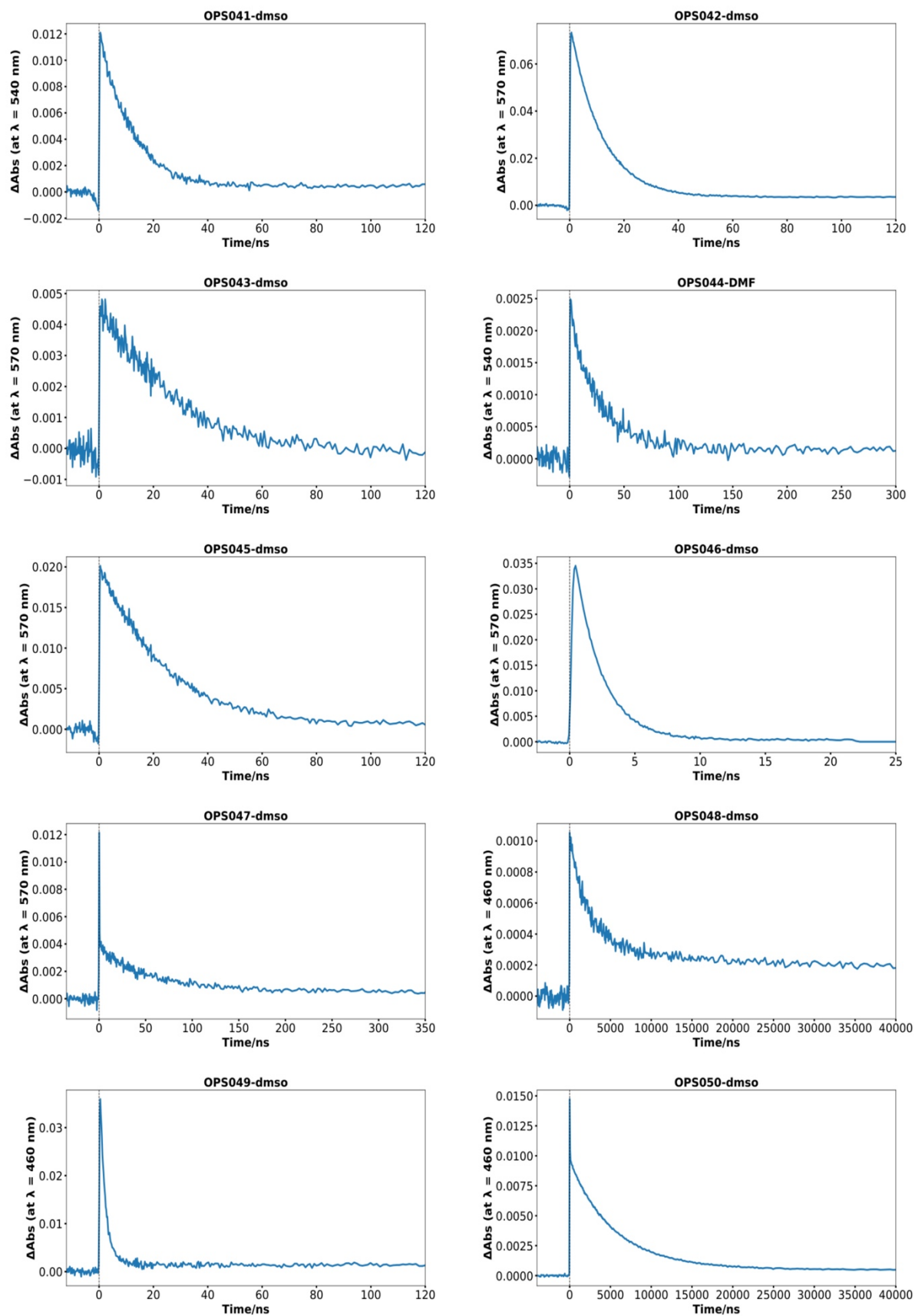


Figure S6-11. Decay time profiles of the transient absorption

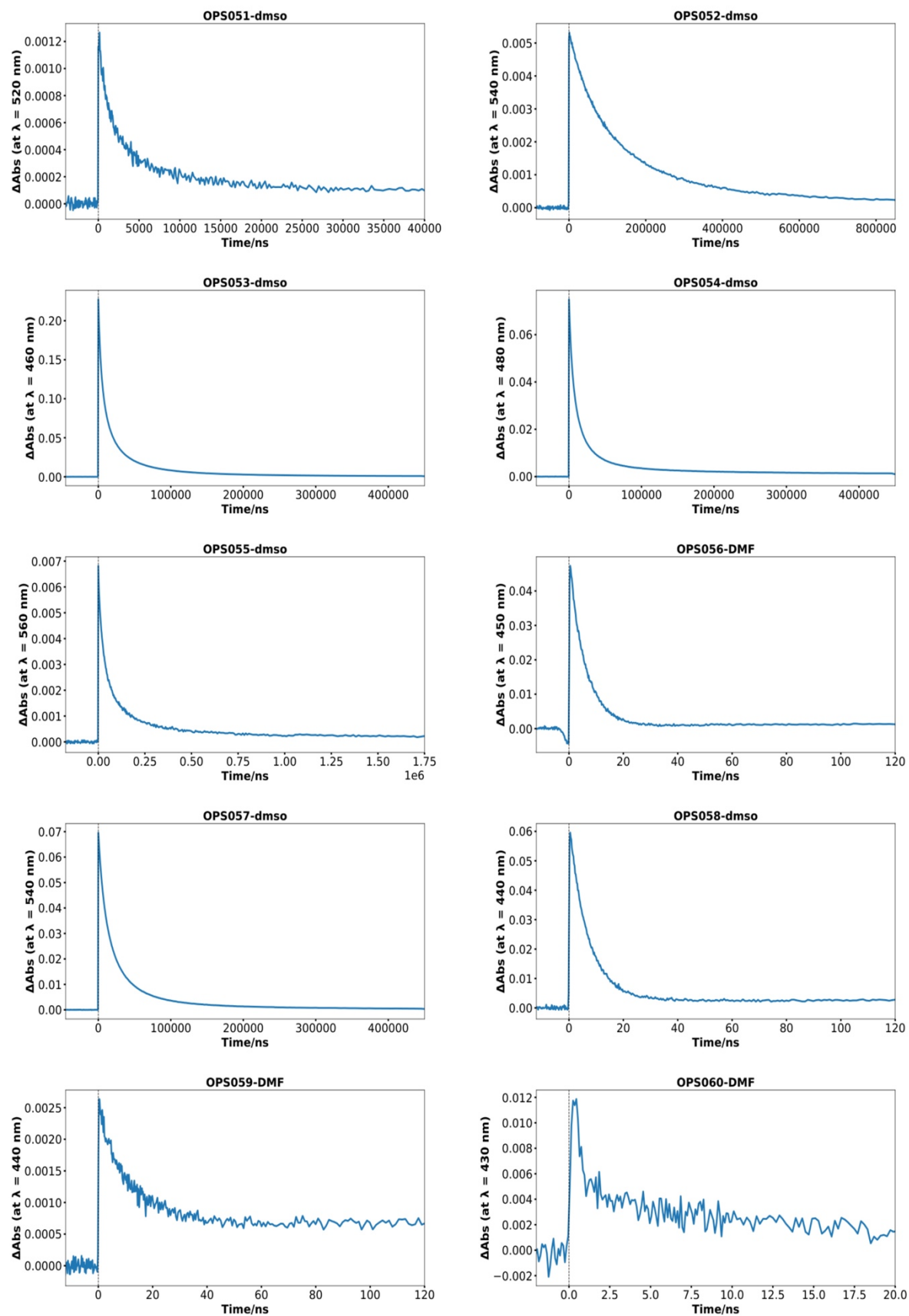


Figure S6-12. Decay time profiles of the transient absorption

Computational Details for the Design of Descriptors

(1) Quantum chemical calculations of physical properties: E_{HOMO} , E_{LUMO} , E_{S1} , f_{S1} , E_{T1} , ΔE_{ST} , and ΔDM

To generate a dataset based on physical properties of OPSs, we performed DFT and TD-DFT calculations at the CAM-B3LYP-D3BJ/6-31G(d) level of theory. To this end, we thoroughly used molecular geometries optimized in the singlet ground state (S_0). The solvation effect in toluene was treated using the Polarized Continuum Model (PCM), where the excited-state energies were computed based on the linear response scheme with equilibrium solvation. All quantum chemical calculations were carried out using the Gaussian 16 program package.^[S10]

- E_{HOMO} , E_{LUMO} : HOMO and LUMO energy levels obtained through DFT calculation.
- E_{S1} : Total energy of the lowest-lying singlet excited state (S_1), which was determined by the single-point TD-DFT calculation (TD-CAM-B3LYP/6-31G(d) level).
- f_{S1} : Oscillator strength of vertical excitation between S_0 and S_1 states offered by the TD-DFT calculation.
- E_{T1} : Total energy of the lowest-lying triplet excited state (T_1), which was determined by the single-point DFT calculation with the unrestricted open-shell treatment.
- ΔE_{ST} : Vertical S_1 - T_1 energy splitting, given as $\Delta E_{\text{ST}} = E_{\text{S1}} - E_{\text{T1}}$.
- ΔDM : Difference in the predicted dipole moment (DM) between the S_0 and S_1 states, which is gauged using the following formula as also employed in our previous work:^[S1]

$$\Delta \text{DM} = \sqrt{(\text{DM}_{x,e} - \text{DM}_{x,g})^2 + (\text{DM}_{y,e} - \text{DM}_{y,g})^2 + (\text{DM}_{z,e} - \text{DM}_{z,g})^2}$$

$\text{DM}_{x,g}$, $\text{DM}_{y,g}$, $\text{DM}_{z,g}$: Dipole moment (x-, y-, or z-coordinate) of OPSs in the S_0 state

$\text{DM}_{x,e}$, $\text{DM}_{y,e}$, $\text{DM}_{z,e}$: Dipole moment (x-, y-, or z-coordinate) of OPSs in the S_1 state at the TD-CAM-B3LYP/6-31G(d) level

(2) Decay rate constant simulation

Numerical simulation of the decay rate constants of electronic transitions was performed using the thermal vibration correlation function (TVCF) formalism^[S11,S12] based on Fermi's golden rule for excited-state dynamics. The rate constant formulas of the TVCF theory were evaluated using molecular data obtained by the preceding quantum chemical (QC) calculations at the DFT level of theory.

In the QC calculations, we determined three optimized structures for each OPS compound for the S_0 , S_1 , and T_1 states, respectively. We employed the CAM-B3LYP-D3BJ/6-31G(d) level of theory, along with the PCM to account for the solvation effect in toluene. The T_1 -optimized geometries were obtained using the unrestricted open-shell Kohn-Sham treatment, while the S_1 -optimized geometries were determined through the TD-DFT approach. We calculated harmonic vibrational frequencies and their normal modes for these three states at the corresponding geometries. Nonadiabatic coupling (NAC) and transition dipole moments between the S_0 and S_1 states were computed in the process of the TD-DFT calculations at the S_1 geometry. We used the Gaussian 16 (C.01) program package for these QC calculations.

Given the QC data for the S_0 , S_1 , and T_1 states, we performed decay rate constant calculations using our in-house computer implementation of the TVCF theory.^[S13,S14,S15] The following transition processes

were considered in the TVCF calculations to predict the decay rate constants:

- $k_r(S_1 \rightarrow S_0)$: Radiative decay rate constant from S_1 to S_0 .
- $k_{ic}(S_1 \rightarrow S_0)$: Nonradiative decay rate constant via internal conversion (IC) from S_1 to S_0 .
- $k_{isc}(S_1 \rightarrow T_1)$: Nonradiative decay rate constant via intersystem crossing (ISC) from S_1 to T_1 .
- $k_{risc}(T_1 \rightarrow S_1)$: Rate constant of reverse intersystem crossing (RISC) from T_1 to S_1 .
- $k_{isc}(T_1 \rightarrow S_0)$: Nonradiative decay rate constant via ISC from T_1 to S_0 .

The formulas of radiative decay transition rate (k_r) and nonradiative ISC/RISC rate (k_{isc} or k_{risc}) were evaluated using transition dipole moments and spin-orbit coupling matrix elements (SOCMEs), respectively, as underlying coupling factors with the Franck–Condon (FC) treatment. The IC rate (k_{ic}) was simulated with the direct nonadiabatic transition term at the first-order perturbation. The redundant internal coordinate space was used for the normal coordinate construction. Our prior work can be referred for details on the theoretical aspects of our TVCF calculation.^[S14,S15]

In the TVCF approach, the FC-level rate constant formula for the S_1 - T_1 ISC process with the spin-sublevel M ($= -1, 0, 1$) is written as

$$k_{isc}^M = \frac{1}{\hbar^2 Z_i} |H_{fi}^{SO,M}|^2 \int dt e^{-i\frac{\Delta E_{ST}}{\hbar}t} \rho^{FC}(t, T) \quad (\text{eq. S1})$$

with the correlation function $\rho^{FC}(t, T)$

$$\rho^{FC}(t, T) = \text{Tr}[\exp(-i\tau_i \hat{H}_i) \exp(-i\tau_f \hat{H}_f)] \quad (\text{eq. S2})$$

where Z_i and T are the partition function of the vibrational state in the initial state and temperature, respectively, $\tau_{i/f}$ is the converted time t for the initial/final vibrational Hamiltonian $\hat{H}_{i/f}$, and $H_{fi}^{SO,M}$ represents the SOCME. The definitions of these entities are detailed in Ref. [S12] and Ref. [S14]. The $\rho^{FC}(t, T)$ is readily evaluated at given t and T using the prepared QC data. As seen in eq. S1, k_{isc}^M forms as a function of ΔE_{ST} , for which the QC prediction should be used. We may take advantage of this direct dependence of k_{isc}^M on ΔE_{ST} ; hence, in some cases, the experimental ΔE_{ST} can be used in place of the QC prediction in evaluating k_{isc}^M . This scheme is beneficial when it is challenging to obtain a reliable prediction of ΔE_{ST} using the DFT-based approach.^[S15,S16] Indeed, we exploited this strategy to achieve a more reliable prediction of $k_{isc}(S_1 \rightarrow T_1)$ and $k_{risc}(T_1 \rightarrow S_1)$ by employing experimental ΔE_{ST} .

The SOCMEs required for the k_{isc} and k_{risc} simulations as inputs were obtained using the ORCA (version 5.0.3)^[S17,S18] program package. The CPCM(toluene)-ZORA-TD-CAM-B3LYP/ZORA-def2-SV(P) level^[S19–S21] was employed for DFT-based SOCME calculations. As acceleration techniques, we used the density fitting to the Coulomb term with the SARC/J basis^[S22] and the chain-of-spheres exchange method for the exchange term, referred as RIJCOSX method.^[S23,S24] For the SOC operator, a Breit-Pauli type Hamiltonian with a mean-field approximation for the 2-electron term^[S25] was used. Solvation effect on the excited states were computed based on the linear response in the nonequilibrium regime.

(3) Design of scaled descriptors

RC consists of five descriptors, i.e., ($k_r(S_1 \rightarrow S_0)$, $k_{ic}(S_1 \rightarrow S_0)$, $k_{isc}(S_1 \rightarrow T_1)$, $k_{risc}(T_1 \rightarrow S_1)$, and $k_{isc}(T_1 \rightarrow S_0)$).

s_RC is defined as the ratio of each rate constant to the sum of all five rate constants, as given by the following equation:

$$s_k(S_1 \rightarrow S_0) = \frac{k_r(S_1 \rightarrow S_0)}{k_r(S_1 \rightarrow S_0) + k_{ic}(S_1 \rightarrow S_0) + k_{isc}(S_1 \rightarrow T_1) + k_{risc}(T_1 \rightarrow S_1) + k_{isc}(T_1 \rightarrow S_0)}$$

For example, in the case of **OPS1**, the values of each rate constant are 2.0×10^7 , 4.4×10^2 , 2.6×10^7 , 5.3×10^1 , and 3.8×10^0 , respectively, so $s_k(S_1 \rightarrow S_0)$ can be calculated as follows:

$$s_k(S_1 \rightarrow S_0) = \frac{2.0 \times 10^7}{2.0 \times 10^7 + 4.4 \times 10^2 + 2.6 \times 10^7 + 5.3 \times 10^1 + 3.8 \times 10^0} = 4.3 \times 10^{-1}$$

Results of Machine Learning

(1) General information for ML

Python (3.10.14) was used as a language for this research, and used packages were matplotlib (3.9.0), numpy (1.26.4), pandas (2.2.2), shap (0.46.0), and scikit-learn (1.4.2).

For the code and used datasets, see: <https://github.com/Naoki-Noto/P6-20240509-RK>

(2) Comparison of ML models

Table S13. Comparison of ML models

Algorithm	HGB	RF	SVM	LASSO
R^2_{test}	0.83	0.78	0.69	0.49
(sd)	(0.04)	(0.07)	(0.07)	(0.06)
RMSE _{test}	11.8	13.5	16.1	20.8
(sd)	(1.3)	(2.1)	(2.1)	(1.9)

The descriptors used were **s_{RC}** + ' E_{HOMO} , f_{S1} , ΔE_{ST} , and ΔDM '.

The R^2 and RMSE scores are averaged over 10 runs, with standard deviations in parentheses.

Table S14. Explored hyperparameters

Algorithm	Hyperparameters
Lasso	'alphas': [0.001, 0.01, 0.1, 1.0, 10.0], 'max_iter': [1000, 5000, 10000], 'tol': [1e-4, 1e-3, 1e-2].
SVM	'C': [1e+02, 1e+03, 1e+04], 'gamma': [1e-03, 1e-02, 1e-01, 1], 'gamma': [0.1, 0.5, 1]
RF	'max_depth': [4, 6, 8], 'n_estimators': [100, 1000, 5000]
HGB	'max_depth': [6, 7, 8], 'l2_regularization': [100, 1000, 5000], 'min_sample_leaf': [3, 5, 10]

(3) Comparison of descriptor performance derived from the difference in methods of DFT calculation
The impact of three different calculation methods on the predictive performance was investigated. The PCM(toluene)-PBE1PBE-D3/6-31G(d) (denoted as PBE0_tol), PCM(toluene)-CAM-B3LYP-D3/6-31G(d) (denoted as CAM_tol), and PCM(DMSO)-TD-CAM-B3LYP-D3/6-31G(d) (denoted as CAM_dmso) levels were tested.

Table S15. Comparison of rate constant-based descriptor sets in the C–O bond formation

Method	PBE0_tol		CAM_tol		CAM_dmso	
Descriptor	RC	s_RC	RC	s_RC	RC	s_RC
R ² _test	0.78	0.77	0.79	0.78	0.78	0.75
(sd)	(0.05)	(0.05)	(0.05)	(0.04)	(0.04)	(0.04)
RMSE_test	13.5	13.8	13.1	13.5	13.4	14.3
(sd)	(1.3)	(0.9)	(1.3)	(1.1)	(1.2)	(0.7)

R² and RMSE scores are averaged over 10 runs, with standard deviations in parentheses.

Table S16. Performance of rate constant-based descriptors calculated at the PCM(DMSO)-CAM-B3LYP/6-31G(d) level in the radical addition

Descriptor	RC	s_RC	RC+ E_{HOMO} , E_{LUMO} , f_{S1} , ΔE_{ST} , $\Delta \text{DM}'$
R ² _test	0.71	0.65	0.78
(sd)	(0.06)	(0.04)	(0.03)
RMSE_test	18.1	19.8	15.6
(sd)	(2.1)	(1.7)	(1.4)

R² and RMSE scores are averaged over 10 runs, with standard deviations in parentheses.

(4) Relationship between physical properties and catalytic activities of OPSs

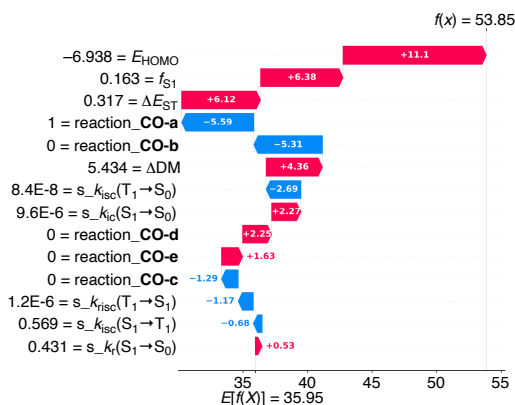
Table S17. Summary of catalytic properties.

OPS	E_{HOMO} (eV)	E_{LUMO} (eV)	ΔE_{ST} (eV)	Yield (%) CO-a	Yield (%) CO-b	Yield (%) CO-c	Yield (%) CO-d	Yield (%) CO-e
OPS1	-6.9384	-1.3187	0.3173	62	92	69	50	41
OPS7	-6.6426	-0.9578	0.4691	88	88	67	47	63
OPS38	-6.2067	-0.1317	0.1962	10	69	42	13	14
OPS40	-6.1648	-0.0509	0.7597	0	38	18	6	24
OPS49	-5.5680	0.0457	0.3045	0	3	2	8	0
OPS56	-7.3273	-1.9323	1.2445	0	5	23	11	2
OPS58	-6.4208	-1.2398	1.1812	0	0	2	0	0
OPS59	-9.3820	-3.4945	0.6213	0	0	2	0	0
OPS60	-9.0977	-3.4450	0.8680	0	0	0	0	0

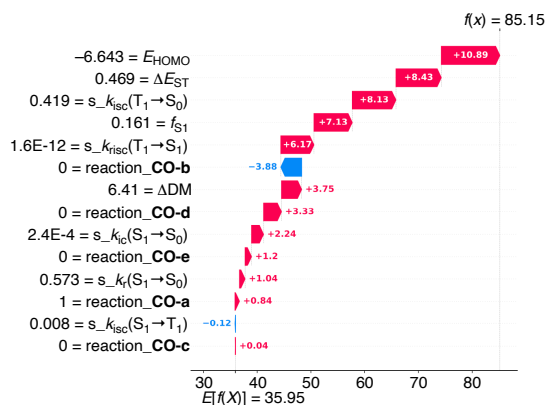
E_{HOMO} , E_{LUMO} , and ΔE_{ST} values for the selected photosensitizers were obtained using calculations at the PCM(toluene)-CAM-B3LYP-D3/6-31G(d) level.

(5) SHAP waterfall plots including more detailed information

OPS1



OPS7



OPS47

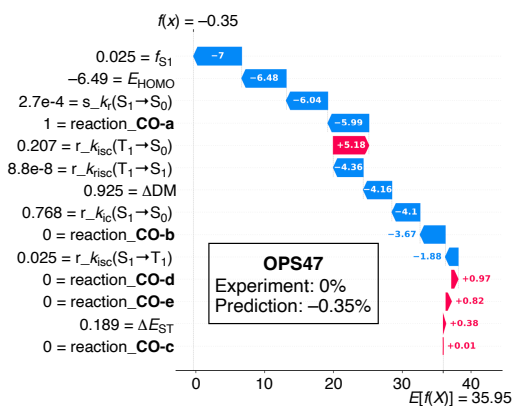
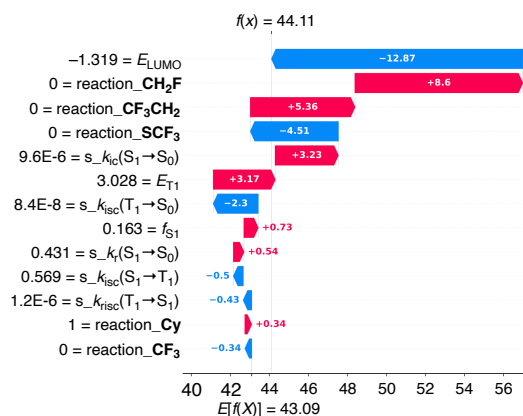


Figure S7. SHAP waterfall plots in the C–O bond formation

OPS1



OPS5

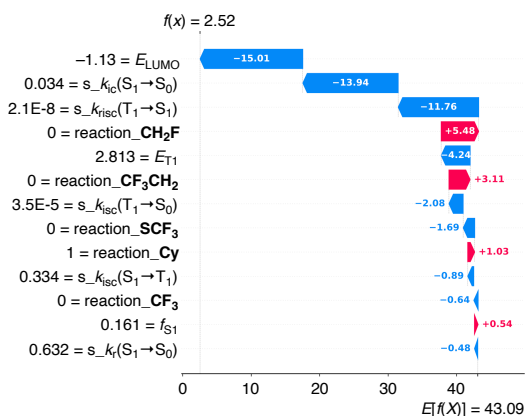


Figure S8. SHAP waterfall plots in the radical addition

Description of SHAP Plots

(1) SHAP summary plot / bar plot

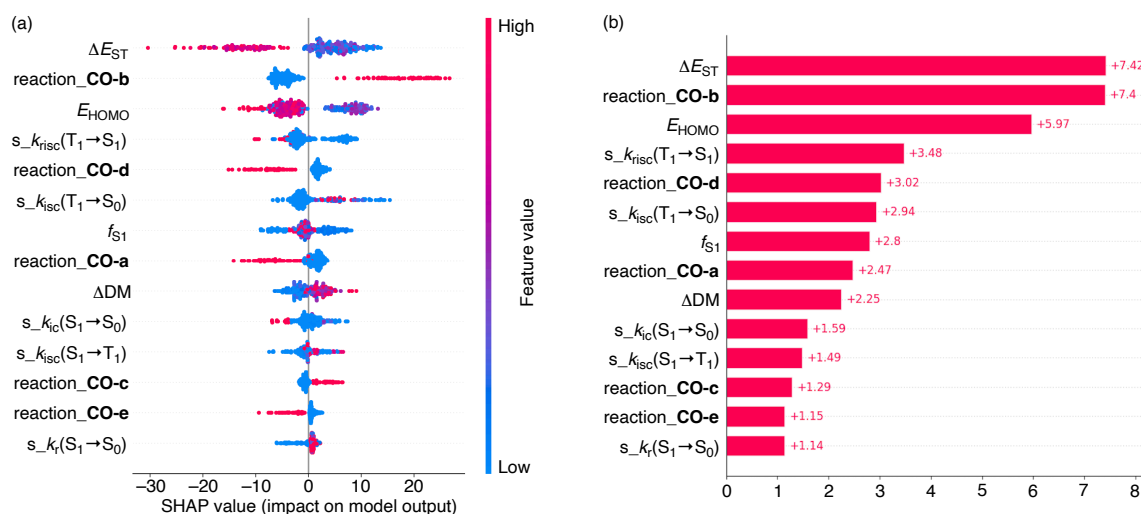


Figure S9. Examples of (a) SHAP summary and (b) bar plots

The SHAP summary plot (Figure S9a) provides a comprehensive overview of the overall trends in feature contributions. The display conventions for this plot are as follows:

- Each descriptor is listed along the vertical axis. Descriptors with higher mean absolute SHAP values are positioned toward the top of the plot, reflecting their greater overall influence on the model's predictions.
- The horizontal axis represents the SHAP values, which quantify both the magnitude and direction of each descriptor's influence on the output. In this plot, data points located on the right-hand side correspond to positive SHAP values, indicating that the respective descriptors contribute positively to the prediction. In contrast, data points positioned on the left-hand side correspond to negative SHAP values, indicating a negative contribution to the predicted outcome.
- Data points with high descriptor values are shown in red, those with low values appear in blue, and those with intermediate values are depicted in purple.

The SHAP bar plot (Figure S9b) focuses specifically on the quantitative magnitude of feature contributions. Each bar represents the mean absolute SHAP value of a descriptor, which is also shown numerically beside the bar. Similar to the summary plot, descriptors with higher mean absolute SHAP values are positioned toward the top. While this plot effectively highlights the relative importance of descriptors in determining the model output, it does not convey whether their influence is positive or negative.

For instance (Figure S9), ΔE_{ST} is the descriptor with the largest contribution, showing a mean absolute SHAP value of +7.42. Samples with high ΔE_{ST} values tend to exhibit negative SHAP values, whereas those with low ΔE_{ST} values tend to show large positive SHAP values. In contrast, $s_{_k_r}(S_1 \rightarrow S_0)$ provides the smallest contribution, with a mean absolute SHAP value of +1.14.

(2) SHAP scatter plot

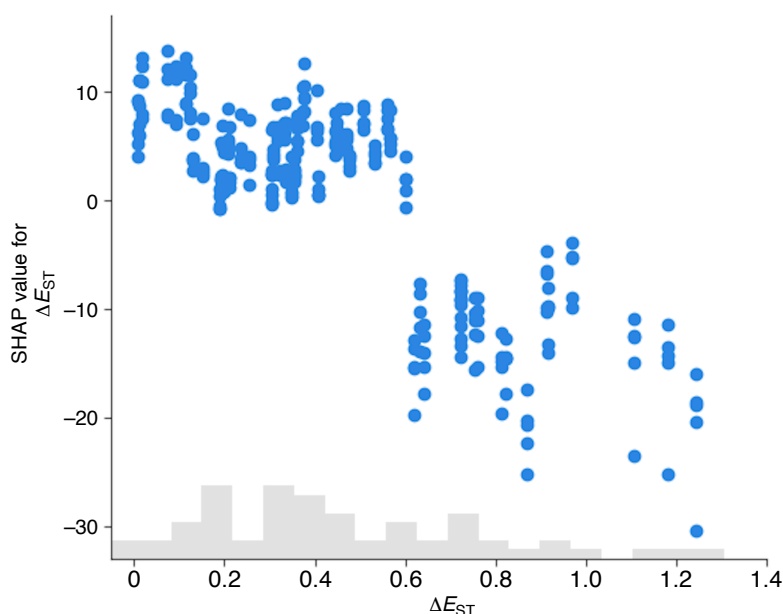


Figure S10. Example of a SHAP scatter plot

The SHAP scatter plot (Figure S10) provides the SHAP values of a specific descriptor. The display conventions for this plot are as follows:

- The horizontal axis represents the actual values of each descriptor.
- The vertical axis shows the corresponding SHAP values for each sample.
- A histogram is overlaid in the background, allowing the data distribution of each descriptor to be visualized.

In Figure S10, when ΔE_{ST} is smaller than c.a. 0.6, it tends to exhibit positive SHAP values, whereas when it is larger than c.a. 0.6, it shows a tendency to result in high, negative SHAP values. Compared with the summary plot, the scatter plot provides more detailed information on the specific ranges in which each descriptor influences the prediction and the manner of that influence.

(3) SHAP waterfall plot

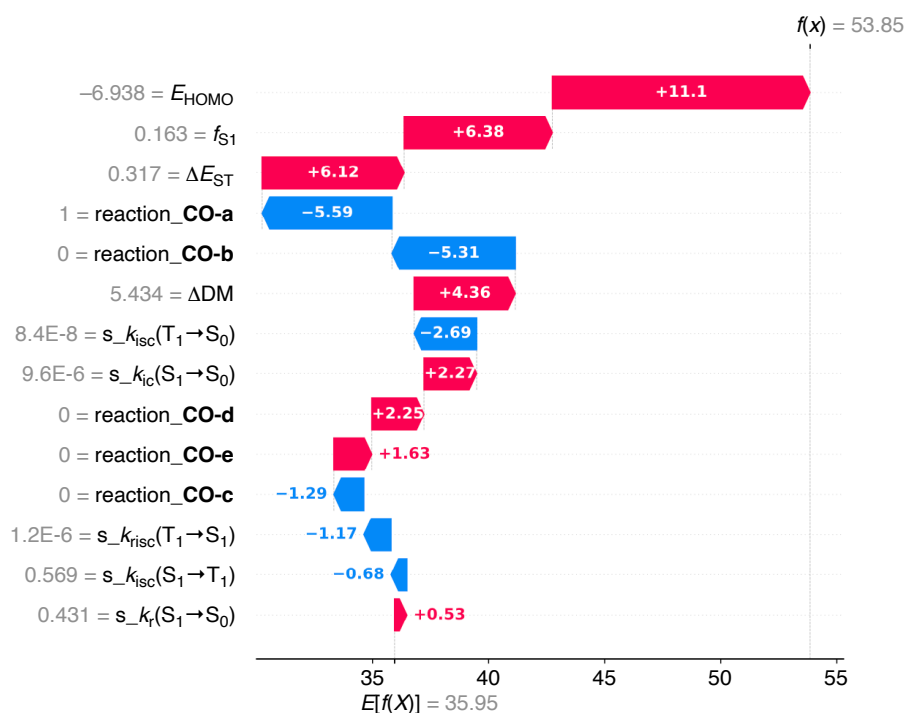


Figure S11. Example of a SHAP waterfall plot

The SHAP waterfall plot (Figure S11) provides detailed information on the feature contributions to an individual prediction. The display conventions for this plot are as follows:

- The lower baseline labeled $E[f(X)]$ represents the model's average prediction value, whereas $f(x)$ at the top indicates the predicted value for the specific sample under analysis, thus illustrating how the final prediction is derived from the global mean through the additive contributions of individual descriptors.
- Descriptors with larger absolute SHAP values are placed higher in the plot, where positive contributions are shown in red and negative contributions in blue, along with their corresponding SHAP values.
- Each descriptor is accompanied by its corresponding value. (In the main text, these values are omitted due to space limitations.)

In the displayed example (Figure S11), the five descriptors with the largest contributions are E_{HOMO} , f_{S1} , ΔE_{ST} , reaction_CO-a , and reaction_CO-b . In this sample, the actual values of E_{HOMO} , f_{S1} , ΔE_{ST} , reaction_CO-a , and reaction_CO-b are -6.938 , 0.163 , 0.317 , 1 , and 0 , respectively. Among them, E_{HOMO} , f_{S1} , and ΔE_{ST} show positive contributions, with SHAP values of $+11.1$, $+6.38$, and $+6.12$, respectively. In contrast, reaction_CO-a and reaction_CO-b exhibit negative contributions, with SHAP values of -5.59 and -5.31 , respectively. Consequently, the resulting predicted value (53.85) exceeds the model's average prediction (35.95) due to the cumulative effect of several descriptors with high, positive SHAP values.

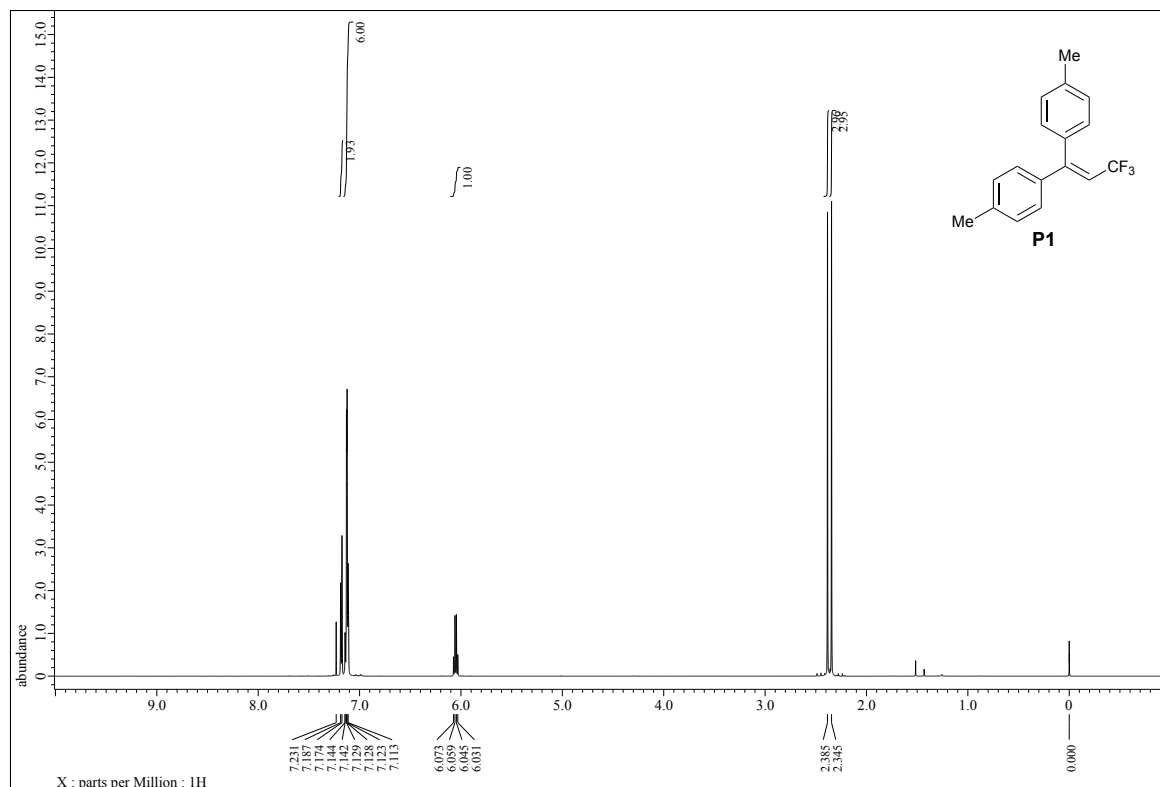
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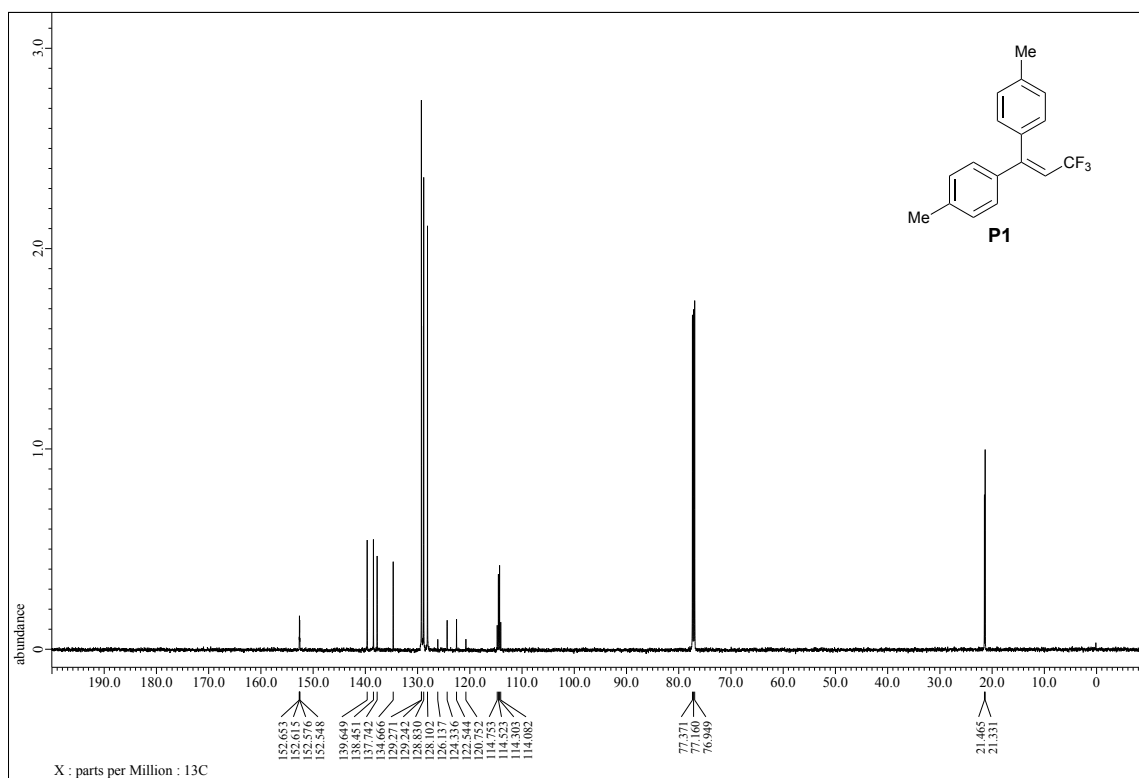
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NMR Spectra

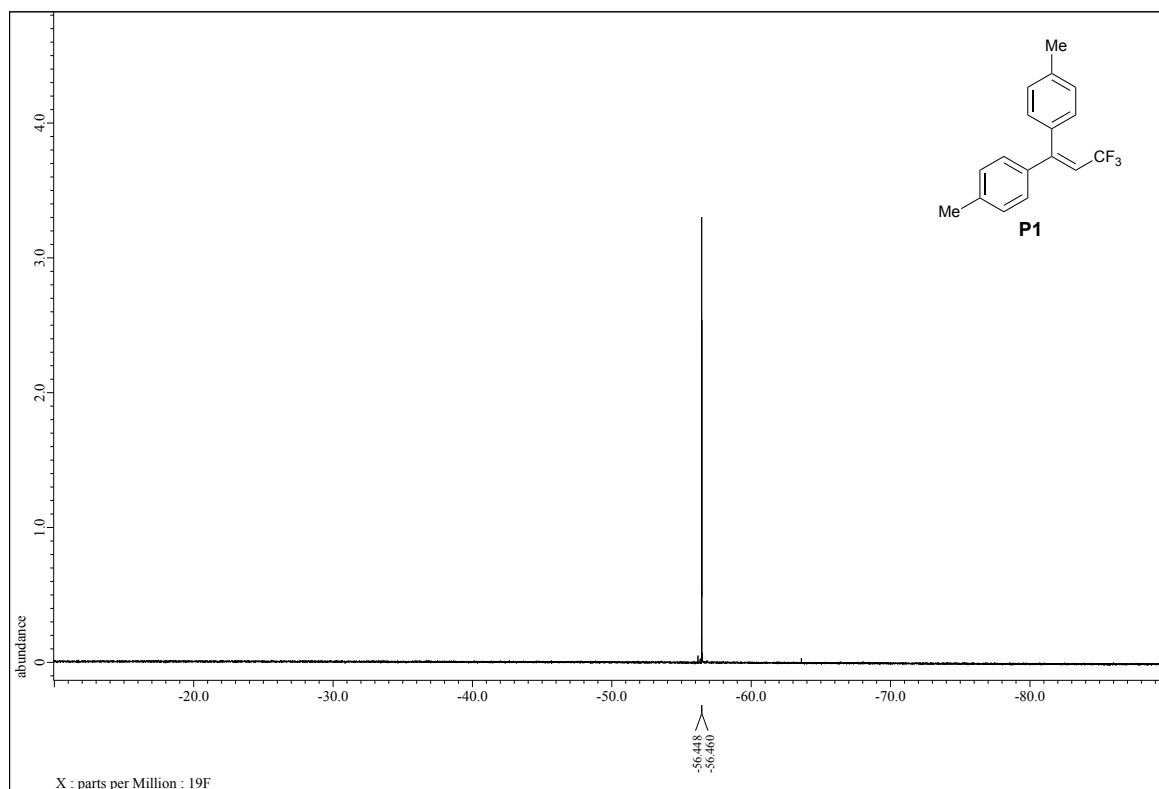
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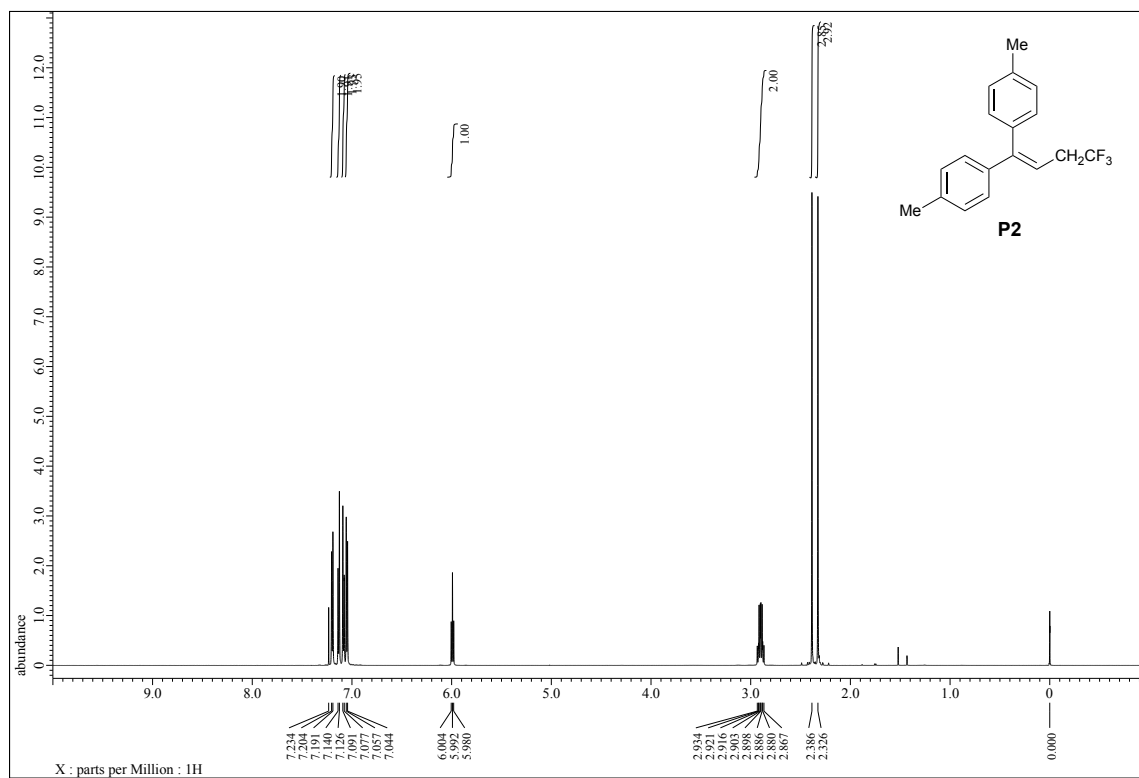
^{13}C NMR (151 MHz, CDCl_3 , rt)



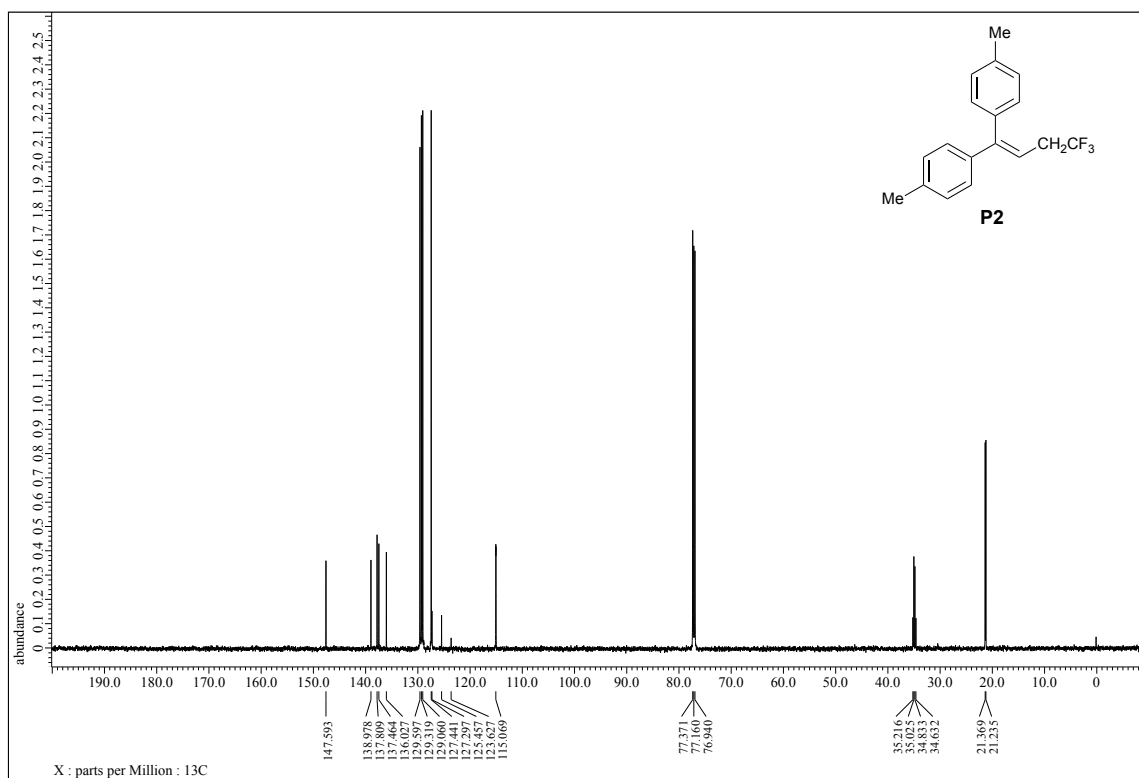
^{19}F NMR (564 MHz, CDCl_3 , rt)



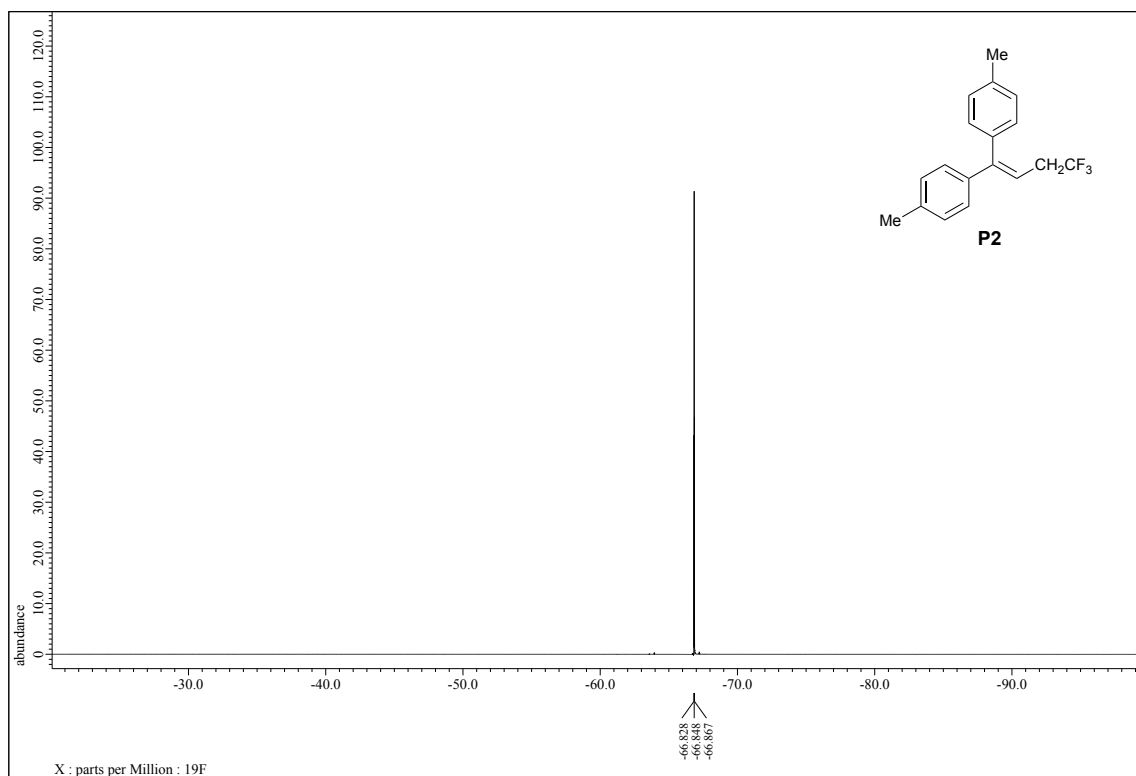
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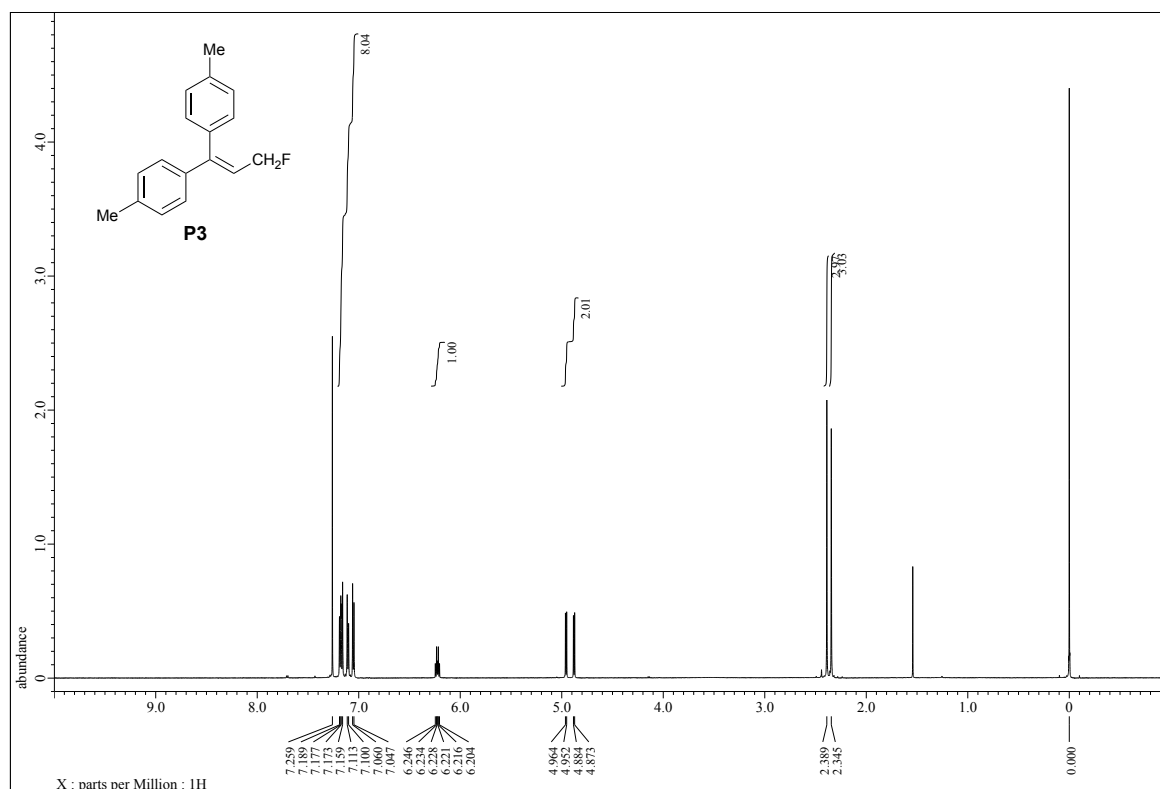
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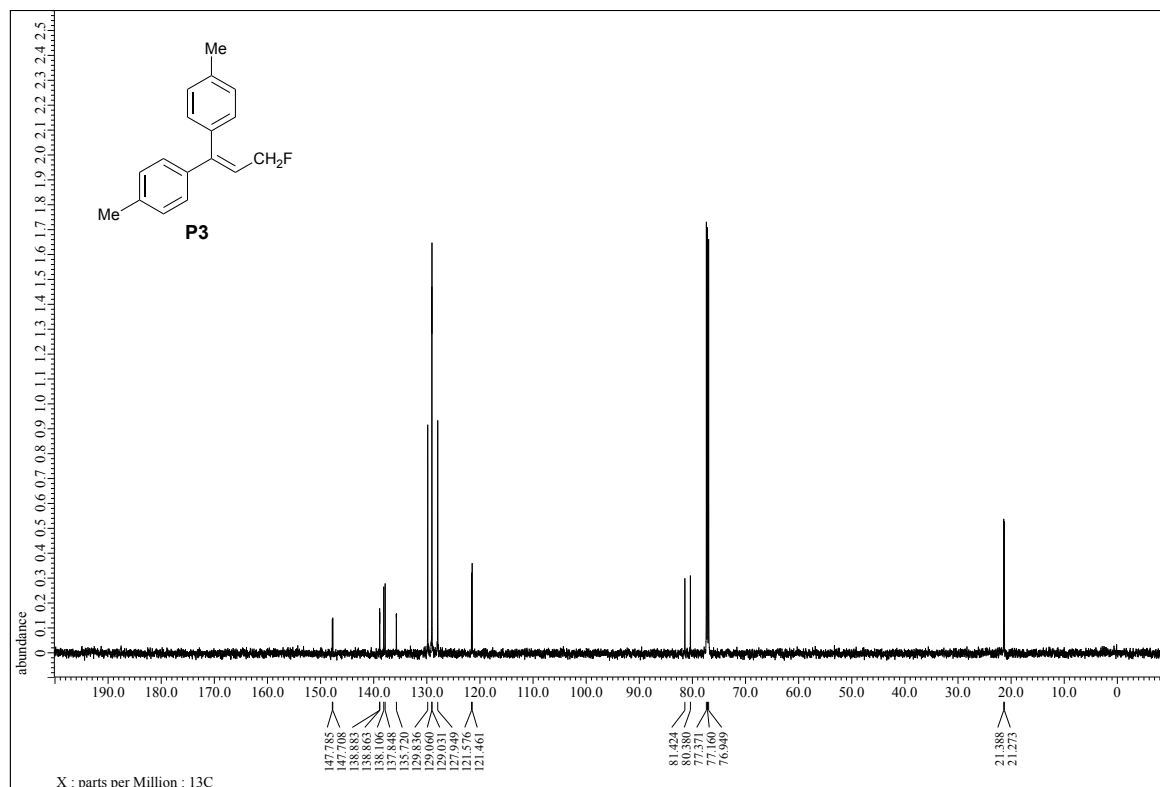
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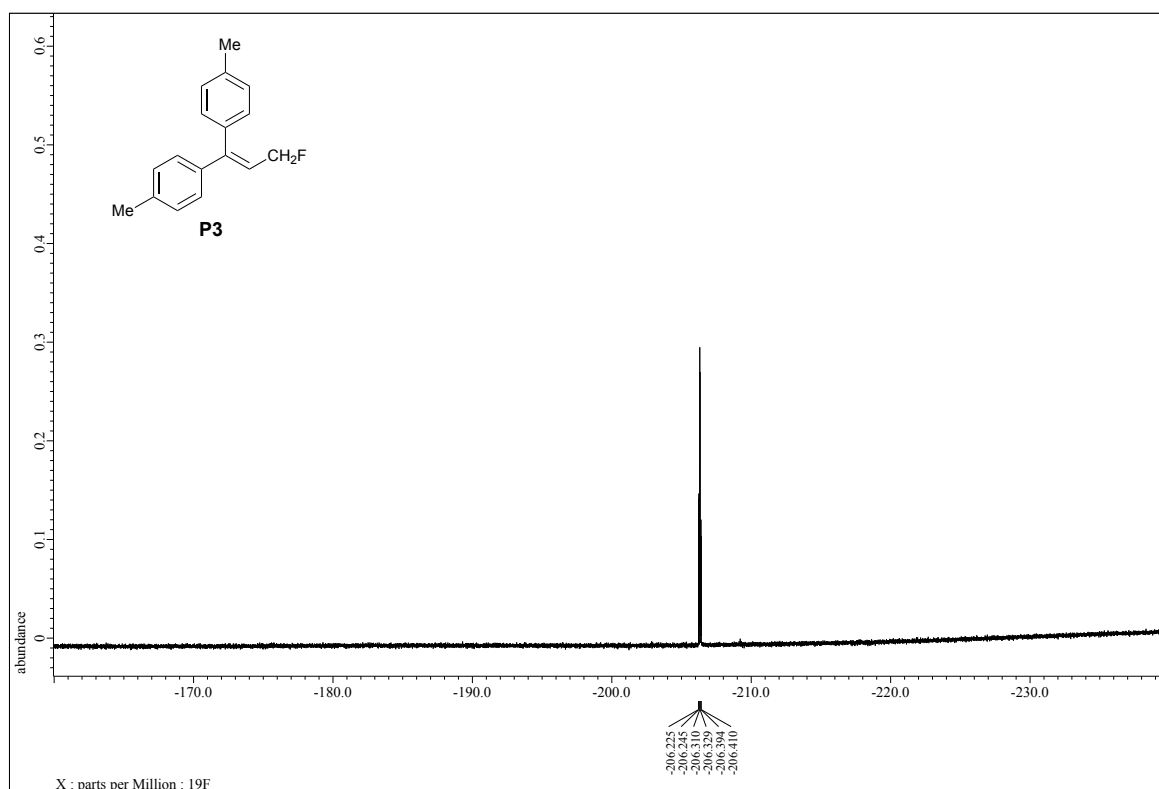
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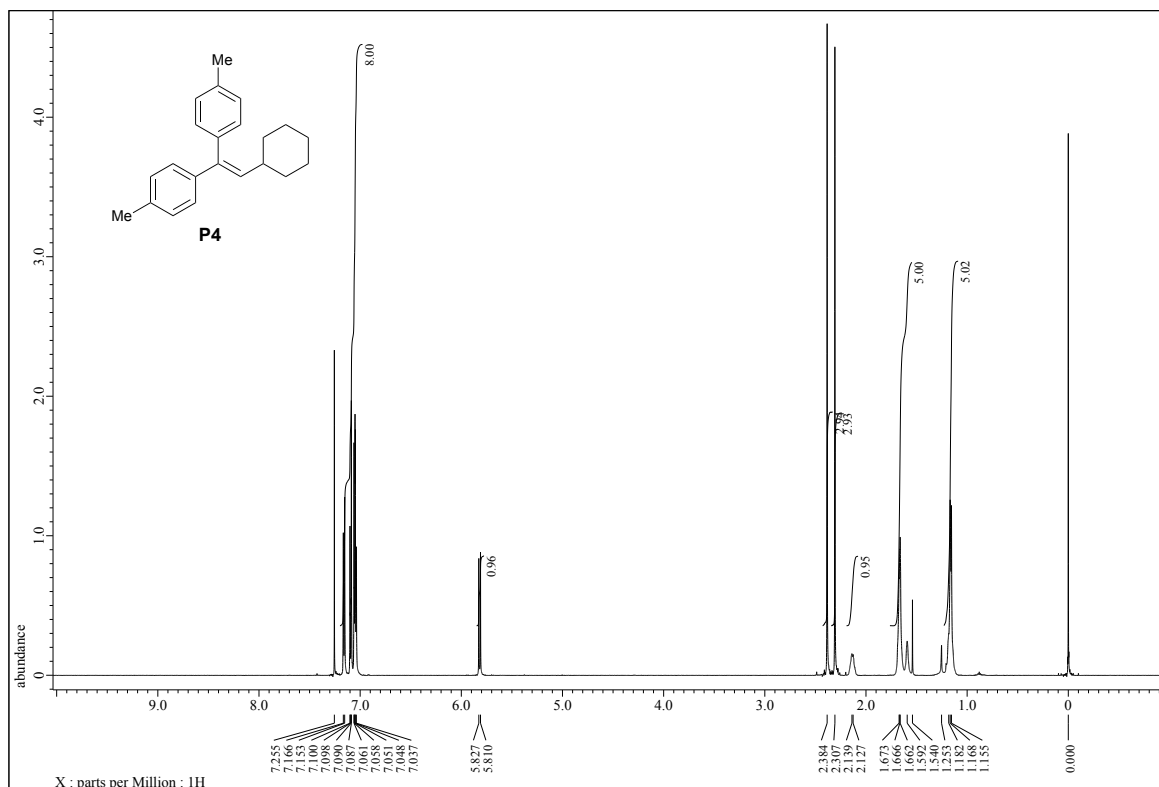
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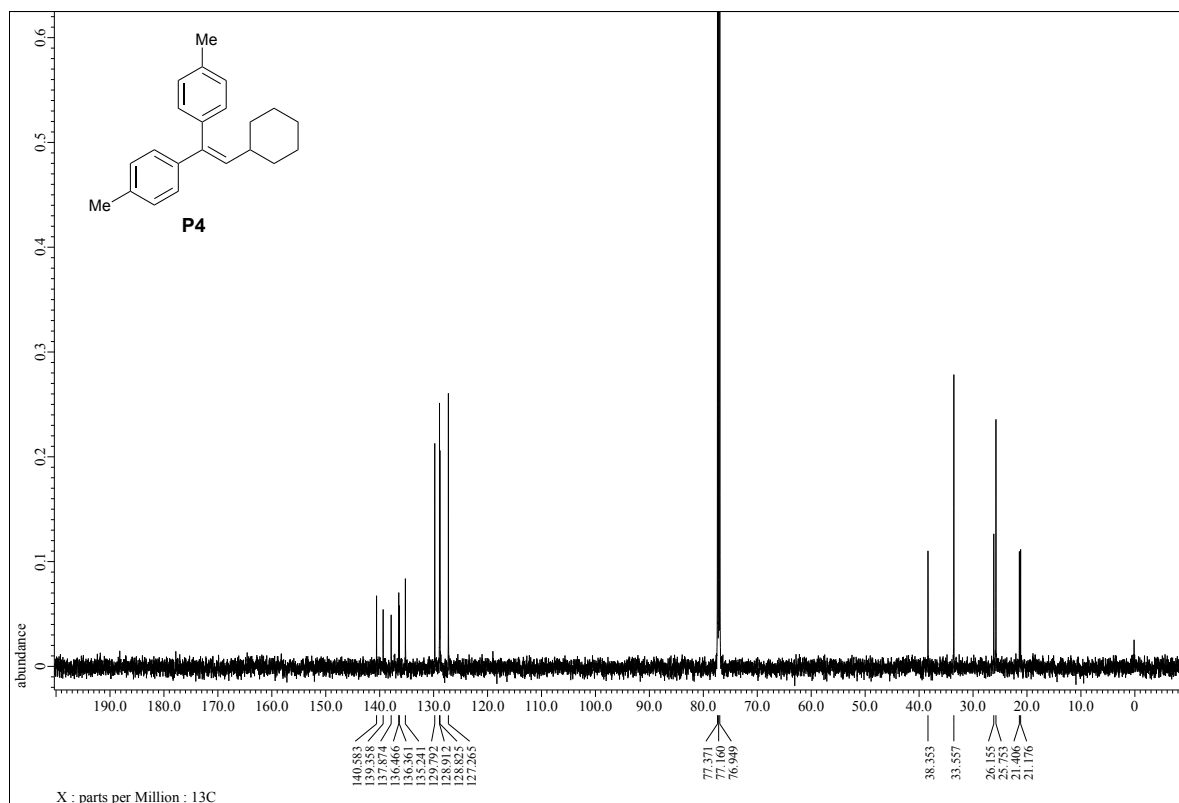
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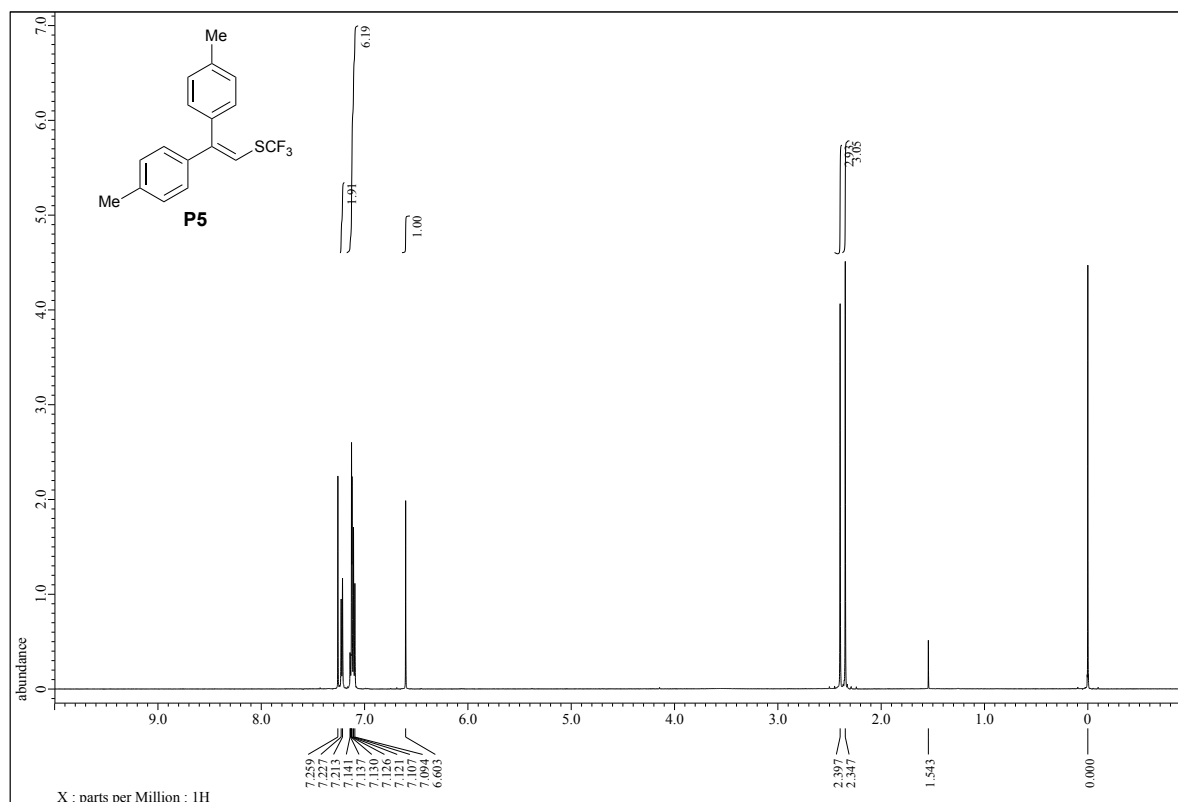
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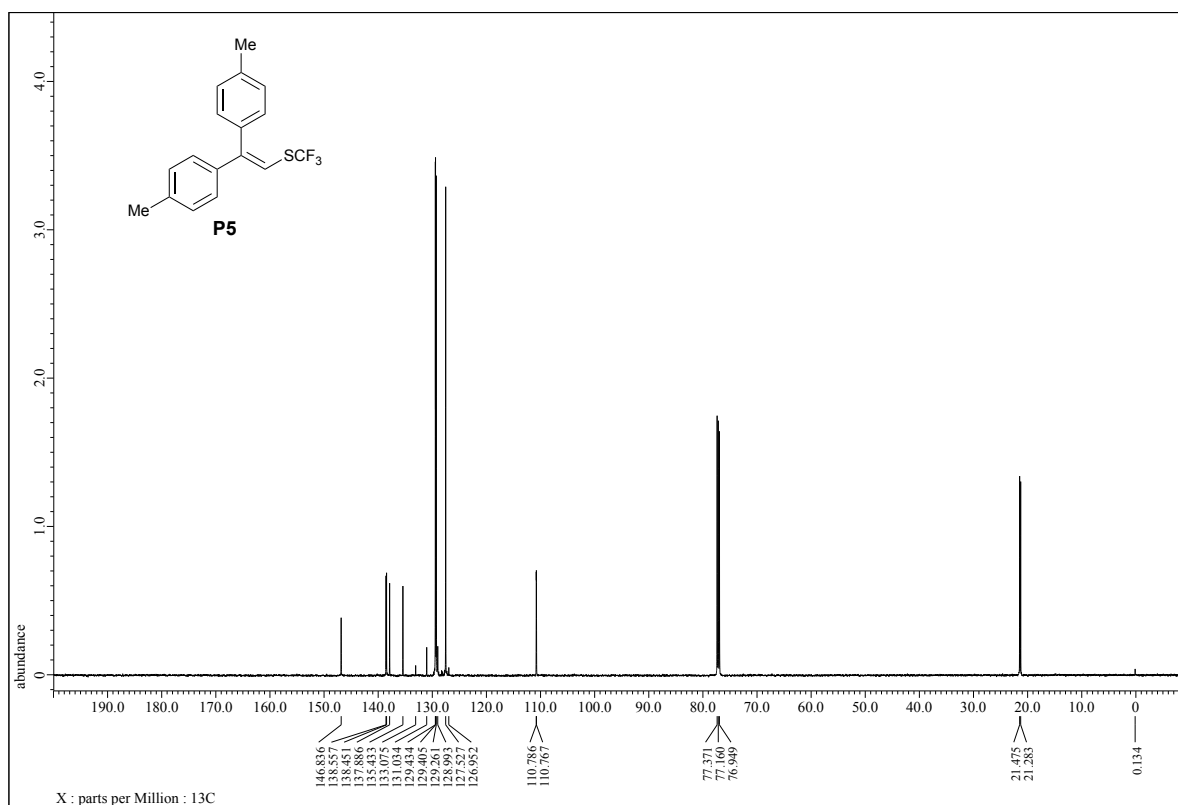
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^1H NMR (600 MHz, CDCl_3 , rt)



^{13}C NMR (151 MHz, CDCl_3 , rt)



^{19}F NMR (564 MHz, CDCl_3 , rt)

