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# Electronic Supporting Information (ESI) for How Does Aggregation of Doxorubicin Molecules Affect Its Solvation and Membrane Penetration?

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Fig. S10 DOX-DOX *RDFs* between DOX C atoms in different solvents.



Fig. S11 Representative simulation snapshots of DOX in different solvents after 30 ns.



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**Fig. S15** (A) Mean-square displacement (*MSD*) of the geometrical centre of DOX, (B) Number of hydrogen bonds between DOX. DOX, and (C) Average cluster sizes of neutral DOX (DOX) and protonated DOX (DOXH<sup>+</sup>) in water using Amber force field.



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Fig. S22 DOX-DPPC RDFs DOX H atoms with (A) O9, and (B) O10 of DPPC.



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**Fig. S27** Average deuterium order parameters obtained for the sn-1 and sn-2 chains of DPPC. The chemical formula of DPPC and the numbering of the C atoms in the chain is shown to the right.

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Table S1 DFT-calculated partial atomic charges of DOX using the NBO method.

Atom	q/e B3LYP NBO	Atom	q/e B3LYP NBO	Atom	q/e B3LYP NBO	Atom	q/e B3LYP NBO
C1	-0.258	C14	-0.087	C27	0.339	$H_1$	0.210
C2	-0.218	C15	0.032	O1	-0.642	H <sub>2</sub>	0.215
C <sub>3</sub>	-0.201	C16	0.182	O2	-0.590	H3	0.268
C4	-0.112	C17	0.041	O3	-0.585	$H_4$	0.512
C5	-0.149	C18	0.296	O4	-0.763	H5	0.519
C6	0.363	C19	0.555	O5	-0.766	H <sub>6</sub>	0.380
C7	0.551	C20	0.297	O6	-0.570	H7	0.393
C8	0.547	C <sub>21</sub>	0.607	O7	-0.520	H8	0.109
C9	-0.152	C22	0.017	O8	-0.526	H9	0.505
C10	0.391	C23	0.135	O9	-0.669	H10	0.528
C11	-0.107	C <sub>24</sub>	0.28	O10	-0.689	H11	0.503
C12	-0.137	C25	0.299	O11	-0.779		
C13	0.352	C <sub>26</sub>	0.031	Ν	-0.937		

Atom	q/e B3LYP NBO	Atom	q/e B3LYP NBO
C	-0.125	Н	0.198
C	-0.72	Н	0.241
Oetoh	-0.776	Н	0.243
Неюн	0.487	Н	0.227
Н	0.225		

**Table S2** DFT-calculated partial atomic charges of EtOH.

 Table S3 DFT-calculated partial atomic charges of DMSO.

Atom	q/e B3LYP NBO	Atom	q/e B3LYP NBO
С	-0.896	Н	0.257
С	-0.896	Н	0.251
Odmso	-0.967	Н	0.269
S	1.205	Н	0.251
Н	0.269	Н	0.257

 Table S4 DFT-calculated partial atomic charges of DMF.

Atom	q/e B3LYP NBO	Atom	q/e B3LYP NBO
С	0.518	Н	0.231
С	-0.467	Н	0.239
С	-0.482	Н	0.231
Odmf	-0.635	Н	0.228
N	-0.51	Н	0.271
Н	0.148	Н	0.228

Table S5 DFT-calculated partial atomic charges of octanol.

Atom	q/e B3LYP NBO	Atom	q/e B3LYP NBO	Atom	q/e B3LYP NBO
Coct	-0.684	Hoct	0.489	Н	0.230
С	-0.472	Н	0.238	Н	0.233
С	-0.462	Н	0.231	Н	0.231
С	-0.461	Н	0.231	Н	0.230
С	-0.460	Н	0.231	Н	0.224
С	-0.468	Н	0.231	Н	0.242
С	-0.496	Н	0.230	Н	0.238
C	-0.114	Н	0.230	Н	0.228
Ooct	-0.776	Н	0.230	Н	0.196

Atom	CHELPG	Atom	CHELPG	Atom	CHELPG	Atom	CHELPG
C1	-0.149	C14	0.610	C27	0.006	$H_1$	0.139
C2	-0.095	C15	-0.610	O1	-0.074	H2	0.100
C <sub>3</sub>	-0.005	C16	0.490	O2	-0.068	H3	0.094
C4	-0.108	C17	-0.285	O3	-0.650	$H_4$	0.421
C5	-0.143	C18	0.223	O4	-0.368	H5	0.321
C6	0.275	C19	1.105	O5	-0.657	H <sub>6</sub>	0.299
C7	0.496	C20	-0.355	O6	-0.105	H7	0.278
C8	0.591	C <sub>21</sub>	0.006	<b>O</b> 7	-0.386	H8	0.250
C9	-0.205	C22	-0.174	O8	-0.515	H9	0.244
C10	0.380	C23	-0.200	O9	-0.291	H10	0.319
C11	-0.375	C <sub>24</sub>	0.066	O10	-0.510	H11	0.349
C12	-0.111	C25	0.224	O11	-0.476		
C13	0.014	C <sub>26</sub>	-0.174	Ν	-0.212		

Table S6 DFT-calculated partial atomic charges of DOX using the CHELPG method.

Table S7 DFT-calculated partial atomic charges of DOXH<sup>+</sup> using the RESP method.<sup>1</sup>

Atom	RESP	Atom	RESP	Atom	RESP	Atom	RESP
C1	-0.155	C14	-0.062	C27	0.207	$H_1$	0.135
C2	-0.144	C15	0.157	<b>O</b> 1	-0.347	H2	0.178
<b>C</b> <sub>3</sub>	-0.105	C16	0.251	O2	-0.297	H3	0.154
C4	-0.187	C17	0.042	O3	-0.509	H4	0.429
<b>C</b> 5	-0.163	C18	0.026	O4	-0.679	H <sub>5</sub>	0.485
C6	0.274	C19	0.416	O5	-0.755	H <sub>6</sub>	0.488
C7	0.624	C20	0.352	O6	-0.261	H7	0.488
C8	0.704	C <sub>21</sub>	0.274	O7	-0.573	H8	0.126
C9	-0.178	C22	0.056	O8	-0.480	H9	0.411
C10	0.127	C23	0.143	O9	-0.525	H10	0.388
C11	-0.059	C <sub>24</sub>	0.201	O10	-0.432	H11	0.484
C12	-0.196	C25	0.155	O11	-0.643		
C13	0.236	C <sub>26</sub>	0.085	N	-0.346		

Table S8 DFT-calculated r	partial atomic charges o	of DOX using the RES	P method. <sup>1</sup>
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Atom	RESP	Atom	RESP	Atom	RESP	Atom	RESP
C1	-0.127	C14	-0.035	C27	0.211	$H_1$	0.151
C2	-0.166	C15	0.162	<b>O</b> 1	-0.356	H <sub>2</sub>	0.160
C <sub>3</sub>	-0.076	C16	0.218	O2	-0.286	H3	0.144
C4	-0.243	C17	0.043	O3	-0.514	$H_4$	0.423
C5	-0.039	C18	0.034	O4	-0.679	H <sub>5</sub>	0.415
C6	0.203	C19	0.430	O5	-0.715	H <sub>6</sub>	0.398
C7	0.569	C20	0.330	O6	-0.355	H7	0.398
C <sub>8</sub>	0.724	C <sub>21</sub>	0.195	O7	-0.463	H <sub>8</sub>	0.138
C9	-0.246	C22	0.084	O8	-0.505	H9	0.396
C10	0.246	C23	0.248	O9	-0.522	H10	0.386
C11	-0.069	C <sub>24</sub>	0.179	O10	-0.495	H11	0.419

C12	-0.192	C25	0.177	O11	-0.580	
C13	0.197	C <sub>26</sub>	0.006	Ν	-1.021	

Table S9 DFT-calculated partial atomic charges of DOX in the gas phase and different solvents.

Atom	Gas Phase	water	DMSO	DMF	EtOH
O4	-0.763	-0.787	-0.787	-0.786	-0.786
O9	-0.669	-0.687	-0.687	-0.686	-0.686
O10	-0.689	-0.711	-0.711	-0.711	-0.710
O11	-0.779	-0.797	-0.796	-0.796	-0.796
N	-0.937	-0.947	-0.947	-0.947	-0.947

Table S10 MD-calculated first peak position of *RDFs* between DOX and solvent atoms.

DOX/water	r (Å)	DOX/EtOH	r (Å)	DOX/DMSO	r (Å)	DOX/DMF	r (Å)
H4OW	1.58	H4O(EtOH)	1.48	H4O(DMSO)	1.38	H4O(DMF)	1.48
H11OW	1.64	H11O(EtOH)	1.56	H11O(DMSO)	1.44	H11O(DMF)	1.54
H5OW	1.68	H5O(EtOH)	1.56	H9O(DMSO)	1.44	H5O(DMF)	1.54
H7OW	2.04	H9O(EtOH)	1.56	H10O(DMSO)	1.44	H10O(DMF)	1.64
H6OW	2.14	H10O(EtOH)	1.58	H5O(DMSO)	1.44	H8O(DMF)	1.90

**Table S11** Average of hydrogen bond lifetimes ( $\tau$ (*HB*)) between DOX and solvent atoms.

System	DonorAcceptor	$ au imes 10^{-3}$ (ps)		
Water	OWH5	0.938		
	OWH11	0.975		
	OWH4	0.976		
	OWH5	0.975		
	O11HW	0.970		
	O4HW	0.974		
	O3HW	0.977		
DMSO	O(DMSO)H11	5.495		
	O(DMSO)H9	5.495		
	O(DMSO)H4	5.495		
EtOH	O(EtOH)H₅	5.020		
	O(EtOH)H <sub>11</sub>	5.379		
	O(EtOH)H4	5.422		
	O5H(EtOH)	5.495		
	O9H(EtOH)	1.611		
	O11H(EtOH)	5.495		
	O4H(EtOH)	3.673		
DMF	O(DMF)H5	4.653		
	O(DMF)H11	4.382		
	O(DMF)H4	4.538		

DPPC/DOX/water				octanol/DOX/water			
DOX/DPPC	r (Å)	DOX/water	r (Å)	DOX/octanol	r (Å)	DOX/water	r (Å)
H11O9(DPPC)	1.53	O11HW	1.84	O4H(oct)	1.46	O4HW	1.67
H4O9(DPPC)	1.53	O4HW	1.84	O <sub>11</sub> H(oct)	1.67	O11HW	1.67
H8O9(DPPC)	1.84	O3HW	1.84	O <sub>6</sub> H(oct)	1.67	O3HW	1.67
H9O9(DPPC)	1.84	O5HW	1.84	O5H(oct)	1.67	O5HW	1.67
H6O9(DPPC)	2.46	O1HW	1.84	O1H(oct)	1.87	O1HW	1.67
H11O10(DPPC)	1.53	H4OW	1.53	H4O(oct)	1.46	H4OW	1.67
H9O10(DPPC)	1.53	H11OW	1.53	H11O(oct)	1.67	H11OW	1.67
H8O10(DPPC)	1.53	H9OW	1.84			H5OW	1.67
H6O10(DPPC)	1.84	H7OW	2.15			H7OW	2.08
H3O10(DPPC)	2.46	H6OW	2.15			H9OW	2.50

**Table S12** Calculated first peaks of *RDF*s between different pairs of atoms in DPPC/DOX/water and octanol/DOX/water systems.

#### References

1 A. Jagusiak and T. Pańczyk, Interaction of Congo Red, Evans Blue and Titan Yellow with doxorubicin in aqueous solutions. A molecular dynamics study, *J. Mol. Liq.*, 2019, **279**, 640–648.