## Supporting Information: In silico design of fluorescent biomarkers

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A Supporting Information: In silico design of ESIPT based fluorescent probes for the biomarkers detection



Figure SI 1: All possible keto<sub>2</sub> forms in the sets studied in this article. In this case, the hydrogen is on the nitrogen atom in pyridine  $(1a \text{ and } 1c)$ , (iso)quinoline  $(2a, 2d \text{ and } 2f)$  or benzoquinoline (3a, 3e, 3g and 3h).

		$S_1$		
Molecule		$E$ (keto-enol) $E$ (keto <sub>2</sub> -enol)	%enol	E (keto-enol)
$\mathbf{1}$	0.43	N/A	100	$-0.25$
1a	0.36	$-0.04$	18	$-0.26$
1 <sub>b</sub>	0.42	N/A	100	$-0.30$
1c	$0.32\,$	0.08	$94\,$	$-0.18$
1 <sub>d</sub>	0.42	N/A	100	$-0.26$
$\sqrt{2}$	0.32	N/A	100	$-0.03$
2a	$0.26\,$	$-0.17$	$\rm 0.2$	$-0.13$
2b	0.30	N/A	100	$-0.11$
$2\mathrm{c}$	0.31	N/A	100	$-0.06$
2d	0.27	$-0.04$	18	$-0.02$
$2\mathrm{e}$	0.30	N/A	100	$-0.07$
2f	0.25	0.07	91	$-0.01$
$\sqrt{3}$	0.20	N/A	100	0.03
$3\mathrm{a}$	$0.26\,$	$-0.10$	$\sqrt{2}$	0.13
3 <sub>b</sub>	0.24	N/A	100	0.26
$3\mathrm{c}$	0.25	N/A	100	$-0.07$
3d	$0.25\,$	N/A	100	$0.02\,$
$3\mathrm{e}$	$0.24\,$	$0.12\,$	$98\,$	0.06
3f	0.24	N/A	100	$0.01\,$
$3\mathrm{g}$	0.25	$0.16\,$	99.8	0.06
3h	$0.45\,$	$-0.09$	$94\,$	$-0.02$

Table SI 1: Relative energies in eV to enol form corrected by zero point in  $S_0$  for all molecules studied in this article. Keto is referred to the isomer that results after TPI take place; and  $\text{keto}_2$ the hydrogen is bond to the nitrogen that belongs to the pyridine ring or conjugated rings. We use  $\rm N/A$  in molecules where  $\rm keto_2$  geometry doesn't exist.

Molecule	Coefficient				
	HONTO, LUNTO	$HONTO-1, LUNTO+1$	others		
1	0.9201	0.0684	< 0.0097		
$1\mathbf{b}_e$ nol	09440	0.0477	< 0.0082		
$1\mathbf{b}_k$ eto	0.9866	0.0100	< 0.0030		
$1c_{e}$ nol	0.8975	0.0632	< 0.0295		
$1c_keto$	0.9764	0.0145	< 0.0053		
$3c_{e}$ nol	0.9705	0.0247	< 0.0073		

Table SI 2: Natural transition orbital[43] coefficients for the following molecules have been determined: 1 and 3c in their enol forms, and 1b and 1c for both isomers, enol and keto. These calculations were done using the  $\omega$ -b97xd functional and a 6-311++g(d,p) basis set, with the PCM approximation applied to simulate the solvent effects

In all instances, it is noteworthy that the contributions of "HONTO" and "LUNTO" consistently exceed 0.9. This observation confirms that it suffices to focus our analysis primarily on HONTO and LUNTO because they have the largest contribution.

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Figure SI 2: Molecules used for validating the computational methodology. These types of molecules have a design of charge transfer processes. The pyridine group serves as the donor fragment, the triazole group functions as the bridge fragment, and there are different acceptor groups.

Molecule		$\lambda_{emission}$ (EtOH)		$\lambda_{emission}$ (DCM)	$\lambda_{emission}$	(MeCN)
	Exp.	Calc.	Exp.	Calc.	Exp.	Calc.
$1a \text{ keto}_2$	392	346	392	343	392	342
Acceptor F	393	343	393	346	393	342
Acceptor CN	390	342	390	345	390	342
Acceptor $CF3$	388	342	388	345	388	341
Acceptor Cl	390	343	390	346	390	342
Acceptor OMe	394	345	395	349	395	344

Table SI 3: Experimental emission wavelengths (measured by the Institut Parisien de Chimie Moléculaire, Sorbonne University, Paris) and the corresponding calculated values (in nm) for the molecules depicted in Figure [SI 2](#page-4-0) are provided. The calculations were done using the  $\omega$ -b97xd functional along with a  $6-311++g(d,p)$  basis set and applying the PCM approximation to simulate the effects of ethanol (ETOH), dichloromethane (DCM), and acetonitrile (MeCN) solvents.

## A.1 Set 1

All solution spectroscopic measurements were performed in spectroscopic grade solvents (Carlo Erba Reagents) at R.T in a 1 cm path length quartz cuvette. A double-beam UV-Vis CARY 50 (Agilent Technologies) spectrophotometer was used to collect the absorption spectra and measurements were compared to a blank solution (solvent only). Steady-state emission spectra in solution were recorded on a Varian Cary Eclipse fluorescence spectrometer (Agilent) The signal was collected at 90° with respect to the excitation beam (right angle mode) for solution studies.



Figure SI 3: Experimental UV-Vis absorption (left) and fluorescence emission (right) spectra in an aqueous solvent with 1% dimethylsulfoxide (DMSO) for molecule 1b at a concentration of 5∗10<sup>−</sup><sup>6</sup>M. The vertical dashed lines indicate the position of the absorption peak (left) for the enol isomer and the fluorescence emission peak (right) from the keto isomer, with a 300 nm excitation wavelength.

Molecule	$\lambda_{absorption}$	$\lambda_{emission}^{enol}$	$\lambda_{emission}^{keto}$	$Stokes^{enol}$	Stokes <sup>keto</sup>	$f_{emission}^{keto}$	$f_{absorption}$
	267	305	363	39	97	0.28	0.25
$1\mathrm{a}$	264	306	351	43	87	0.38	0.40
1 <sub>b</sub>	273	315	381	42	108	0.26	0.21
1c	248	303	328	55	80	0.31	0.33
$1\mathrm{d}$	273	316	374	43	101	0.37	0.40

Table SI 4: Calculated wavelengths,  $\lambda$ , for absorption and emission (keto and enol form) in nm, Stokes shifts from enol and keto isomer emission (nm), and oscillator strength for the process absorption (enol) and emission (keto) for the molecules of set 1.



Figure SI 4: NTO for 1b (left) and 1c (right) in the enol isomer. To model the aqueous solvent, we employed the PCM approximation. The system's computations were performed using  $\omega$ -b97xd/6- $311++g(d,p)$  method.



Figure SI 5: NTO for 1b (left) and 1c (right) in the keto isomer. To model the aqueous solvent, we employed the PCM approximation. The system's computations were performed using  $\omega$ -b97xd/6- $311++g(d,p)$  method.

## A.2 Set 2



Table SI 5: Calculated wavelengths,  $\lambda$ , for absorption and emission (keto and enol form) in nm, Stokes shifts from enol and keto isomer emission (nm), and oscillator strength for emission from keto tautomer and process absorption for the molecules of set 2.



Figure SI 6: Resonant structures in the (iso)quinoline ring, in enol isomer, for molecules 2b and 2f in Set 2. The resonant structures for molecules 2c and 2e have the same positive partial charges that 2b molecule. The inset shows the R group of the molecule not involved in the resonant structures.

## A.3 Set 3



Table SI 6: Calculated wavelengths,  $\lambda$ , for absorption and emission (enol and keto forms) in nm, Stokes shift from enol and keto isomer emission (nm), and oscillator strength for the process absorption (enol) and emission (keto) for the molecules of set 3.



Figure SI 7: Resonant structures in the benzoquinoline ring, in enol isomer, for molecules 3b and 3e in Set 3. The resonant structures for molecules 3c, 3d, and 3f have the same positive partial charges that 3b molecule and the resonant structures for molecule 3g are similar to 3e. The inset shows the R group of the molecule not involved in the resonant structures.



Figure SI 8: NTO for 3c in the enol isomer. To model the aqueous solvent, we employed the PCM approximation. The system's computations were performed using  $\omega$ -b97xd/6-311++g(d,p) method.

A.4 Set 4



Figure SI 9: Design of optimized 2-hydroxy acridine substituted 1,2,4-triazoles to shift emission near infra-red.



Figure SI 10: Born-Oppenheimer ab initio molecular dynamics were conducted with a total simulation time of 700 fs and a time step of 0.5 fs. Upper is a plot of energy (a.u) for both Ground and Excited states as a function of time (fs) during the dynamic simulation. Down illustrates the difference in energy (kcal/mol) between the excited and ground states over time (fs). BOMD was performed using the PCM model to simulate an aqueous solvent.

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Figure SI 11: Findings related to the physicochemical properties of the 3c molecule within the context of the biocompatibility analysis (conducted using the freely available online resource for ADME[36] properties http://www.swissadme.ch/.)

The bioavailability assessment, as illustrated in Figure [SI 11,](#page-14-0) and the properties listed in Table [SI 7](#page-15-0) collectively suggest that the proposed molecule falls within the range of biocompatibility. Nevertheless, a notable concern arises regarding its solubility. It's worth emphasizing that the molecule exhibits characteristics that indicate it can serve as a substrate for permeable glycoprotein (P-gp), which facilitates its transport across biological membranes. Additionally, the molecule demonstrates inhibitory effects on substrates CYP2C19, CYP3A4, and CYP2C9. It is essential to approach these estimates with caution, considering that the original article reporting these interactions was based on data from imbalanced training and testing sets[36].

Shifting our focus to the Druglikeness models proposed by Lipinski, Ghose, Veber, Egan, and Muegge, these sets of rules and criteria are widely employed in pharmaceutical research and drug design to assess a chemical compound's potential for drug development. These rules rely on physicochemical and structural properties to identify compounds with a higher likelihood of success in terms of absorption, distribution, metabolism, excretion, and toxicity (ADMET). Remarkably, four out of the five models indicate that the compound is likely to exhibit biocompatibility.

Additionally, the acridine core is found in the most studied DNA-intercalating agents[37].

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Physicochemical Properties		Water Solubility		
Formula	C27H22N8O	Log S (ESOL)	$-6.06$	
Molecular weight	$474.52$ g/mol	Solubility	$4.17e-04$ mg/ml; $8.79e-07$ mol/l	
Num. heavy atoms	36	Class	Poorly soluble	
Num. arom. heavy atoms	25	Log S (Ali)	$-7.24$	
Fraction Csp3	0.15	Solubility	$2.76e-05$ mg/ml; $5.81e-08$ mol/l	
Num. rotatable bonds	$\overline{4}$	Class	Poorly soluble	
Num. H-bond acceptors	6	$Log S (SILICOS-IT)$	$-8.54$	
Num. H-bond donors	$\sqrt{2}$	Solubility	1.35e-06 mg/ml; 2.85e-09 mol/l	
Molar Refractivity	139.93	Class	Poorly soluble	
<b>TPSA</b>	$128.75 \text{ Å}^2$			
Lipophilicity			Druglikeness	
Log Po/w (iLOGP)	2.04	Lipinski	Yes	
Log Po/w (XLOGP3)	4.80	Ghose	$No$ ; ; 1 violation: $MR>130$	
Log Po/w (WLOGP)	4.42	Veber	Yes	
Log Po/w (MLOGP)	1.08	Egan	Yes	
$Log Po/w$ (SILICOS-IT)	3.87	Muegge	Yes	
Consensus Log Po/w	3.24	Bioavailability Score	0.55	
Pharmacokinetics			Medicinal Chemistry	
GI absorption	Low	<b>PAINS</b>	$0$ alert	
<b>BBB</b> permeant	No	<b>Brenk</b>	1 alert: polycyclic aromatic hydrocarbon 2	
P-gp substrate	Yes	Leadlikeness	No; 2 violations: MW>350, XLOGP3>3.5	
CYP1A2 inhibitor	No	Synthetic accessibility	$3.55\,$	
CYP2C19 inhibitor	Yes			
CYP2C9 inhibitor	Yes			
CYP2D6 inhibitor	N <sub>o</sub>			
CYP3A4 inhibitor	Yes			
$Log Kp$ (skin permeation)	$-5.79$ cm/s			

Table SI 7: The ADME (Adsorption, Distribution, Metabolism, Excretion) values for molecule 3c were determined through calculations conducted on the website http://www.swissadme.ch/. The table furnishes us with key ADME characteristics essential for assessing the potential biocompatibility of a molecule. In this context, GI (gastrointestinal), BBB (blood-brain barrier), P-gp (permeable glycoprotein), CYP (cytochromes P450), PAINS (pan assay interference compounds), and Brenk refer to specific factors and properties relevant to our evaluation.

Consequently, many acridine derivatives show mutagenic properties[38]. Nevertheless, acridines are widely used for their broad biological activities arising from their interactions with DNA. A number of acridines derivatives have been developed as antibacterial, antiprotozoal, and anticancer drugs[39, 40]. It's worth highlighting that this structural motif is present in currently approved drug molecules (acriflavine as antibacterial drug or amsacrine as antileukemia drug)[41].

In terms of synthetic feasibility, the program assigns it a score of 3.55 on a scale of 1 to 10, with 1 indicating ease and 10 indicating significant difficulty. This score implies that synthesizing the compound should not pose substantial challenges. Indeed, acridine is a versatile scaffold which can undergo many regioselective substitution. Substitution reactions at the acridine ring are also well documented[42]. Looking carefully to the retrosynthetic analysis of the target molecule, substitution at the position 1 and 2 of the acridine core to install respectively the triazole moiety and the hydroxyl group could be done using the synthetic strategy previously set up by the organic chemist co-author[25].