1	Identification of small molecular chaperones binding P23H mutant opsin through an in silico
2	structure-based approach
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## 23 Abstract

The N-terminal P23H opsin mutation accounts for most of *retinitis pigmentosa* (RP) cases. P23H functions and folding can be rescued by small chaperone ligands, which contributes to validate mutant opsin as a suitable target for pharmacological treatment of RP. However, the lack of structural details on P23H mutant opsin strongly impairs drug design, and new chemotypes of effective chaperones of P23H opsin are in high demand.

Here, a computational-boosted workflow combining homology modeling with molecular dynamics (MD) simulations and virtual screening was used to select putative P23H opsin chaperones among different libraries through a structure-based approach. *In vitro* studies corroborated the reliability of the structural model generated in this work, and identified a number of novel chemotypes of safe and effective chaperones able to promote P23H opsin trafficking to the outer cell membrane.

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## 45 Introduction

46 Rhodopsin is a G protein-coupled receptor (GPCR) membrane protein that is activated by light of different wavelengths in organisms ranging from single-cell eubacteria and archaea to humans. In 47 vertebrates, rhodopsin is responsible for vision, a process triggered by light-induced 48 photoisomerization of the retinal chromophore from its 11-cis to the all-trans form (Figure 1). 49 When bound to opsin forming rhodopsin, the retinal cofactor is covalently linked to the side chain 50 of K296 through a protonated Schiff base. Retinal photoisomerization induces a number of 51 conformational modifications to rhodopsin that finally activate the vision transduction cascade 52 (Figure 1).<sup>1-3</sup> Proper folding and localization of rhodopsin in the outer segment (OS) of 53 54 photoreceptor cells is essential to vision. In this context, opsin mutations are among the most common cause of inherited ocular diseases, including retinitis pigmentosa (RP).<sup>4-6</sup> 55



Figure 1. Chemical structure of the visual pigment chromophore 11-*cis*-retinal and its
photoisomerization to the all-*trans* form when bound to K296 of opsin.

59 The P23H mutation in the N-terminal tail of opsin causes structural destabilization and impairs the 60 correct protein folding and binding to the natural chromophore 11-cis-retinal, accounting for most of RP cases with prevalence in North America (~10% of RP cases).<sup>7-10</sup>. In addition, incorrect 61 protein folding can also be caused by low cellular levels of 11-cis-retinal, which in these conditions 62 is unable to satisfactorily function as a molecular chaperone for opsin. Several lines of evidence 63 show that misfolded opsin is poorly translocated to the OS and accumulates in the endoplasmic 64 reticulum (ER) where it causes aggregation and cellular degradation.<sup>11-13</sup> Although the precise 65 mechanisms leading to photoreceptor degradation and disease development are not yet elucidated, 66 67 recent *in vitro* studies showed that the correct folding and trafficking of P23H mutant opsin can be 68 partially rescued by small chaperone ligands, i.e., small molecules able to bind misfolded P23H opsin and restore the native conformational state of wild-type (WT) rhodopsin as well as to promote 69 the correct receptor localization in the OS.<sup>14, 15</sup> Encouraged by the beneficial effects of 11-*cis*-retinal 70 administration in an early clinical trial,<sup>16</sup> a number of retinal analogues have been developed.<sup>17-20</sup> 71 However, these molecules bear major limitations associated to the photoinduced isomerization that 72 can occur also during the protein synthesis in the ER, leading to protein instability.<sup>21</sup> While binding 73 74 and opsin chaperone properties of the retinal derivative beta-ionone (Figure 2) have long been known,<sup>22, 23</sup> non-retinoid chaperones are highly needed as they are expected to overcome the 75 76 limitations of retinoids, and to be more suitable candidates for drug development. Nevertheless, the lack of high-resolution structural details on opsin mutants strongly hampers the rational design of 77 effective chaperones.<sup>24</sup> At present, very few non-retinoid chaperones of P23H opsin have been 78 79 disclosed, most still at a development stage that is far from translational or clinical applications. One of the most widely used small molecule chaperones of P23H opsin is the non-retinoid 80 compound named **YC-001** (Figure 2), a 2,5-dihydrofuran-2-one derivative discovered by a cell-81

based high-throughput screen, which proved able to bind non-covalently to P23H opsin and rescue
its trafficking to the membrane with *in vivo* efficacy.<sup>21, 25</sup>

Computational tools proved highly effective in the discovery of novel small molecular chaperones 84 85 of mutant opsin. NSC45012 [1-(3,5-dimethyl-1H-pyrazol-4-yl)ethanone] (Figure 2) is a weak inhibitor of opsin regeneration providing 40% rescue of the mutant opsin, which has been 86 discovered through the docking-based virtual screening of a drug-like library of around 24,000 87 small molecules.<sup>26</sup> Moreover, the reversible orthosteric inhibitor of retinal binding 13-cis-5,8-ERA 88 (Figure 2) has been discovered by virtually screening a library of more than 300,000 anionic 89 compounds followed by *in vitro* validation.<sup>20</sup> Recently, part of our group has carried out structure-90 91 and ligand-based computational studies that have led to the identification of structural and pharmacophoric features that are relevant for a molecule to stabilize the 9-cis- or the 11-cis-92 retinal/opsin complex as well as to chaperone mutant opsin to be further developed as therapeutics 93 for RP (i.e., compounds 7 and 11a, Figure 2).<sup>27, 28</sup> 94

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97 Figure 2. Chemical structure of reference chaperones of mutant opsin.

99 Here, boosted by our interest in the development of effective P23H opsin chaperones, and taking 100 advantage of computer-aided molecular simulations, we overcame the gap of reliable structural 101 information on the P23H opsin mutant to allow structure-guided drug design approaches. Specifically, the structure of P23H mutant in complex with 11-cis-retinal was generated by 102 homology modeling while its conformational behavior was studied throughout molecular dynamics 103 (MD) simulations. Then, a representative MD frame extracted by cluster analysis was used as a 104 rigid receptor in a structure-based virtual screening to identify new small molecules that could bind 105 within the retinal binding site of P23H mutant opsin. To explore a wider portion of the chemical 106 107 space including commercial and natural compounds, and approved drugs, different libraries were screened in silico. Cytotoxicity and the ability of virtual hits to promote mutant opsin relocalization 108 109 were investigated in vitro, corroborating computational predictions.

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#### 111 Results and discussion

## 112 Homology modeling of P23H mutant rhodopsin receptor

The full-length 3D structure of the P23H rhodopsin mutant was generated by homology modeling. 113 114 The high-resolution crystallographic structure of the bovine full-length rhodopsin (Protein Data Bank<sup>29</sup> accession code PDB-ID: 1U19<sup>30</sup>) was selected as a template. Analysis of the all-atom root 115 mean square deviation (RMSD) of the P23H mutant rhodopsin homology model along MD 116 trajectory confirmed that the protein conformation is stable during the last 200 ns (Figure 3A), 117 which suggests that the system achieved geometric convergence in MD simulations. Cluster 118 119 analysis of MD trajectories was then used to identify the centroid frame of the most populated cluster, being represented by 86% of MD frames, which was used for analysis purposes. For the 120 sake of clarity, MD frames were grouped by a hierarchical agglomerative algorithm using distance 121 122 between frames calculated via best-fit coordinate RMSD as the distance metric; the representative

frame described herein corresponds to the centroid of the most populated cluster, i.e., the frame 123 having the lowest RMSD to every other frame in the cluster. Although the P23H mutation is 124 relatively distant from the binding site of 11-cis-retinal (approximately 16 Å) (Figure 3B), by 125 comparing the crystallographic structure of WT rhodopsin used as structural template with the 126 representative MD frame of the P23H rhodopsin extracted by cluster analysis, it is evident that the 127 P23H mutation affects mainly the structure of the transmembrane domain (TMD), whereas the 128 conformation of the 11-cis-retinal binding site is only marginally affected (Figure 3C). The 129 representative MD frame of P23H rhodopsin was finally selected as a receptor for subsequent 130 structure-based simulations because it describes the mutant system of interest in physiological 131 132 conditions compared to X-ray structures of the WT form.





Figure 3. A) All-atom RMSD of the P23H mutant opsin in complex with 11-*cis*-retinal cofactor. B)
Structural superposition of crystallographic structures of WT rhodopsin (PDB-ID 1U19) (pink) and

P23H mutant rhodopsin (cyan) depicted in front view, and C) close-up view of the 11-*cis*-retinal binding site. Protein structures are aligned and showed in cartoon. The 11-*cis*-retinal chromophore and the residues of interest are represented as sticks, while polar interactions are highlighted by black dashed lines.

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#### 142 Docking-based virtual screening

Virtual screening was aimed at identifying small molecular chaperones that might potentially bind 143 the 11-cis-retinal site of the P23H mutant opsin. Specifically, these molecules should ideally 144 145 compete with the natural substrate, which is known to bind pathological opsin mutants with weak affinity, and to restore opsin folding, functions and trafficking to the OS, as underlined by in vitro 146 studies.<sup>20</sup> Different libraries of compounds were selected for virtual screening, including: *i*) a high 147 diversity in house library of around 1,000 natural products, ii) the DrugBank database (around 148 2,509 approved drugs),<sup>31</sup> and *iii*) the commercially available MolPort database (around 8 million 149 compounds).<sup>32</sup> Natural products are a unique and privileged source of hit/lead compounds with a 150 wide chemical diversity as well as tools for understanding the chemical biology of protein targets.<sup>33,</sup> 151 <sup>34</sup> In this context, natural products are largely used in virtual screening and drug design approaches 152 run by our research group, showing remarkable pharmacological activities mostly as antiviral or 153 anti-cancer drug candidates.34-40 The DrugBank database was selected with the purpose of 154 repositioning approved drugs, which is a widely used strategy that allows the therapeutic 155 exploitation of a drug for a therapeutic indication that is different from that of its approval.<sup>41-43</sup> 156 Finally, the MolPort database is a rich source of commercially available diverse structures for 157 screening purposes. While screening libraries i) and ii) was achieved at a relatively low 158 159 computation cost, screening the MolPort database containing around 8 million compounds might require much more time and resources to be completed. Given the presence of an aldehyde group in 160 the natural chromophore 11-cis-retinal, and to restrict the searchable chemical space, the MolPort 161

database was preliminarily filtered to identify compounds bearing up to three aldehyde groups,leading to the generation of a sub-library containing 3,195 commercially available aldehydes.

All compounds (i.e., natural products, approved drugs, and aldehyde derivatives) were docked within the 11-*cis*-retinal binding site of P23H opsin generated by MD simulations. The validity of the docking/scoring function was preliminarily assessed by covalently and non-covalently redocking 11-*cis*-retinal in its binding site, which provided highly similar binding modes (Figure 4A and 4B). In non-covalent docking, the oxygen atom from the aldehyde group is oriented towards K296. In both docking settings, hydrophobic interactions of the ionone moiety with residues M207, F212, F261, and W265 were preserved as in the crystallographic structure of WT rhodopsin.



**Figure 4.** Predicted binding poses of 11-*cis*-retinal (yellow) and the MolPort 019-937-085 compound (pink) within the main chromophore binding site of the P23H opsin mutant, predicted by covalent docking (A and C) and non-covalent docking (B and D). Polar interactions are highlighted by black dashed lines. MolPort 019-937-085 was used as a negative control.

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Docked molecules were sorted according to their scoring value, and the binding mode to P23Hopsin of the 100 top-ranked virtual hits from each library was visually inspected. In the case of

aldehydes, the covalent docking pose bound to K296 was compared with the non-covalent pose, this 179 180 latter mimicking the opsin/ligand recognition process within the retinal binding site. Similar to 11*cis*-retinal (Figure 4A), aldehydes sharing a comparable orientation and binding mode by covalent 181 and non-covalent docking were selected, while all others were discarded and not processed further 182 including *in vitro* tests. As an example of a discarded aldehyde, the compound characterized by 183 MolPort accession code 019-937-085 showed an opposite binding mode in covalent and non-184 185 covalent docking (Figure 4C and 4D). Indeed, in covalent docking, the aldehyde group is bound to K296 through a protonated Schiff base, with the dimethoxybenzene moiety oriented toward helices 186 6 and 5. In non-covalent docking, the aldehyde group points toward helices 5 and 6 (Figure 4C and 187 4D). 188

Finally, 7 aldehydes (A1-A7) and 13 natural products (NP1-NP13) were selected for experimental validation (Figure 5). Unfortunately, no molecules from the DrugBank database exhibited an interesting profile in binding to P23H opsin *in silico*, thus none of the approved drugs included in this database was selected for further investigations.





Figure 5. Chemical structure of putative small molecular chaperones binding the P23H mutant
rhodopsin selected for *in vitro* evaluation. To facilitate further understanding of binding modes
description, ring labels are added to chalcone derivatives.

## 198 Cell viability assay

The cytotoxicity of the screened compounds was tested in two different cell lines, U2OS and ARPE-19. U2OS cell line transfected with human P23H his-tagged opsin is the cellular model used in this study to determine compounds activity.<sup>27, 28</sup> ARPE-19 cells are retinal pigmented epithelial cells, that can be considered as a model to evaluate toxicity at the eye level.<sup>27, 28</sup>

Most of the compounds appeared to be not toxic at 10  $\mu$ M, especially when tested on ARPE-19 cells. Only two compounds, **NP4** and **A7**, diminish cell viability by around 10%. **NP4** seems to be cytotoxic by the same amount also on U2OS cells, along with **NP3**, **NP9** and **NP10** (Figure 6). Overall, cell viability for both cell lines is not lower than 90% with any of the test compounds, suggesting they are all suitable for activity evaluation in U2OS systems as potential therapeutics for eye diseases.



Figure 6. Cytotoxicity evaluation of the screened compounds tested at  $10\mu$ M on A) U2OS hP23H and B) ARPE-19 cells. Cell viability was determined as percentage calculated on the vehicle treated cells (0.1% DMSO). The bars represent the mean  $\pm$  SEM from three independent experimental repeats. Data were analysed using one-way ANOVA, Dunnett test, comparing the mean of each column bar with the vehicle, 0.1 % DMSO (\*\*\*\* p<0.0001, \*\*\* p<0.001, \* p<0.03). Wells containing diluted reagent with media, and without the presence of cells was considered as negative control.

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# 218 Single cell fluorescent microscopy

U2OS cells transfected with hP23H opsin (His-tag) were used to determine the ability of the compounds to promote opsin trafficking to the membrane.<sup>28</sup> The production of hP23H opsin is only induced in these U2OS cells when exposed to tetracycline. However, opsin bearing this mutation is misfolded and accumulates in the cytoplasm if it is not bound to 9-*cis*-retinal forming isorhodopsin. 9-*cis*-Retinal is an analogue of endogenous 11-*cis*-retinal, which stabilizes opsin structure and promotes its trafficking to the outer cell membrane (Figure 7).<sup>1, 44</sup>

To evaluate opsin localization in U2OS cells, two antibodies were used. RET-P1 antibody, bound to the secondary antibody AlexaFluor555 (red signal), binds opsin on its extracellular domain, identifying this protein when localized at the membrane; instead, the His-tag antibody, bound to AlexaFluor488 (green signal), recognizes the his-tag of the transfected opsin, detecting the total opsin expressed by cells after tetracycline induction. In this way, an active compound would present both the red and green signals, as 9-*cis*-retinal does, and an inactive one would present only the green signal, related to total opsin, as the vehicle 0.1% DMSO does (Figure 7).



**Figure 7**. hP23H subcellular localization after U2OS treatment with the negative (0.1% DMSO) and positive controls (9-*cis*-retinal, beta-ionone, and **YC-001**). 9-*cis*-retinal was tested at 5 $\mu$ M (as previously reported)<sup>26</sup>, whereas beta-ionone, and **YC-001** at 10  $\mu$ M. Anti-His/RET-P1 refers to the images merged from RET-P1 (red), and Anti-His tag (green) staining. Instead, RET-P1 refers to the images obtained from the single RET-P1 staining. RET-P1 detects opsin protein expressed at the membrane, binding its extracellular epitope, while Anti-His tag binds opsin in its tag after cell permeabilization with 0.1% Triton. The Nuclei were stained with DAPI.

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The screened compounds were tested at a concentration of 10  $\mu$ M, and their activity was compared to the one observed for the positive (9-*cis*-retinal 5  $\mu$ M, **YC-001** 10  $\mu$ M, and beta-ionone 10  $\mu$ M) and negative controls (0.1% DMSO).

Among the positive controls, **YC-001** appears to be similarly active to 9-*cis*-retinal, while betaionone is associated to a weaker activity (dotted red signals are visible around the membrane), even though they have been both previously reported to promote opsin trafficking (Figure 8).<sup>21, 22, 45</sup>

None of the compounds screened in this assay appeared to be as active as 9-*cis*-retinal and **YC-001**. However, **NP2**, **NP6**, **NP7**, **NP8**, **NP9**, **NP13** and **A3** were positive to the RET-P1 signal, although opsin distribution to the cell membrane is not homogeneous but dotted and localized around the nuclei as observed in beta-ionone treated cells (Figure 8). **NP5** and **A6** could not be tested because insoluble at 5 mM in 100% DMSO.

Overall, these data corroborate the reliability of molecular modeling predictions in highlighting new scaffolds, either of natural or synthetic origin, as potential chaperones of mutant opsin which might be further developed as effective agents for the therapy of RP.



**Figure 8**. Human P23H opsin subcellular localization after U2OS treatment with 10 μM screening compounds (**NP2**, **NP6**, **NP7**, **NP8**, **NP9**, **NP13**, **A3**) that resulted positive to RET-P1 staining. Anti-His/RET-P1 refers to the images merged from RET-P1 (red), and Anti-His tag (green) staining. RET-P1 refers to the images obtained from RET-P1 staining only. RET-P1 detects opsin expressed at the membrane by binding its extracellular epitope, while Anti-His tag binds opsin in its tag (C-terminus, cytosolic) after cell permeabilization with 0.1% Triton. Nuclei were stained with DAPI.

# 266 Predicted biding mode of molecular chaperones

The binding mode of the most promising molecular chaperones emerged from *in vitro* studies was further investigated by in depth molecular docking simulations. Interestingly, the aldehyde derivative **A3** successfully promotes trafficking of P23H mutant opsin to the outer cell membrane and it binds similarly to 11-*cis*-retinal in docking simulations. By comparing the covalent and the

non-covalent docking pose of A3 (Figure 9A and 9B), a very similar binding mode was observed, 271 272 although the geometry of the stacking interaction with W265 is slightly more optimized in the noncovalent pose (also thanks to the sandwich with F212), most likely due to the lack of the covalent 273 bond constraints. The free aldehyde group of A3 interacts with the side chain of Y268 in non-274 covalent docking (Figure 9B). NP2 belongs to the family of chalcones. Its ring B stacks over the 275 indole ring of W265 and the side chain of F212, whereas ring A is oriented toward the sidechain of 276 277 K296 in a geometry that corresponds to a cation-pi interaction (Figure 9C). The catechol moiety of the dihydrochalcone NP6 anchors the side chain of K296 through H-bond interactions, as well as 278 the backbone of C187. The ring A is stacked over the side chain of W265, while the lipophilic 279 280 geranyl chain is projected towards the inner and hydrophobic part of the TMD (Figure 9D). Nicely, NP7 adopts a binding mode that is highly overimposable to that of NP6, although the lack of 281 substituents in its ring B prevents any direct polar contacts to K296. Overall, the binding of NP7 282 283 within the chromophore binding site of P23H opsin seems to be driven mostly by hydrophobic interactions (Figure 9E). Similarly, NP8 fails to H-bond the side chain of K296 but the phenolic -284 OH in ring B is H-bonded to the side chain of Y178 (Figure 9F). The aromatic core of NP9, i.e., 285 curcumin, is stacked to F203 and Y206, while the substituted phenyl ring is projected toward K296 286 (Figure 9G). Although curcumin is a frequent hit in medicinal chemistry, it proved herein useful in 287 288 structural stabilization of the dysfunctional P23H opsin. Finally, the prenyl group of NP13 is docked near K296, whereas the aromatic core binds in proximity to F212 and it stacks over the side 289 chain of W265, this latter being one of the most conserved interactions among effective P23H 290 291 chaperones identified in this work (Figure 9H).

Overall, functional groups able to anchor K296, to stack with W265 and Y268 as well as H-bond to polar residues within the chromophore binding site of P23H opsin emerged as key pharmacophores for promoting opsin trafficking to the outer cell membrane. To quantitatively estimate the binding affinity of non-covalent P23H opsin chaperones compared to 11-*cis*-retinal, MD simulations were carried out on docking complexes. The delta energy of binding ( $\Delta E_b$ ) was then computed by the molecular mechanics/generalized Born surface area (MM-GBSA) approach on MD trajectories. Results clearly suggest that most of the P23H chaperones investigated herein have a  $\Delta E_b$  comparable or slightly lower than 11-*cis*-retinal, with **NP6** being a stronger binder than the natural chromophore (Supporting Information, Table S2).



Figure 9. Binding poses of compounds A3 predicted by a covalent (A) and non-covalent approach (B), NP2 (C), NP6 (D), NP7 (E), NP8 (F), NP9 (G), and NP13 (H). Small molecules are represented as green sticks, P23H mutant opsin is represented as cyan cartoon and the residues involved in polar or hydrophobic interactions with the small molecules are represented as cyan sticks and labelled. Polar interactions are highlighted as black dashed lines.

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## 308 Conclusions

In this work, a reliable computational model was developed with the aim of identifying small 309 molecules that can possibly bind the P23H opsin mutant and restore the correct protein folding and 310 311 localization. Computational techniques such as homology modeling and MD simulations provided a fast and reliable access to structural details that are yet unavailable by structural biology and 312 prevent the identification of effective chaperones. The docking-based virtual screening of aldehydes 313 and natural products led to the identification of 20 molecules belonging to different chemical 314 315 classes that were selected for experimental investigations against the P23H mutant opsin. Noteworthy, no approved drugs to be repurposed as P23H chaperones were identified in silico. 316 Single cell fluorescent microscopy and cytotoxicity assays were used to evaluate the ability of 317 selected compound to promote P23H opsin translocation to the outer cell membrane as well as to 318 preliminarily assess safety, respectively. Different natural chemotypes (NP2, NP6-9, and NP13) 319 and the aldehyde derivative A3 emerged as promising molecular chaperones and structural 320 stabilizer of mutant opsin, thus validating the robustness of the computational procedure. Moreover, 321 322 these molecules are promising starting points for further optimization.

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#### 324 Materials and methods

#### 325 Homology modeling and MD simulation

Since the 3D structure of the hP23H mutant rhodopsin is not solved yet, homology modelling was 326 carried out. The X-ray structure of WT bovine rhodopsin (PDB-ID: 1U19)<sup>30</sup> was selected as a 327 structural template based on its high resolution (2.20 Å), and the model was built using the Prime 328 software in the Schrödinger Release 2019-1.<sup>46</sup> FASTA sequences of human (Uniprot-ID: P08100) 329 and bovine (Uniprot-ID: P02699) opsin were aligned providing the 93.4% of identity of the primary 330 sequence, which provisionally allow to generate a reliable homology model.<sup>47</sup> The rough homology 331 332 model of hP23H mutant opsin in complex with the 11-cis-retinal covalently bound to K296 through a protonated Schiff base was relaxed by MD simulation using the procedure described previously.<sup>48</sup> 333 The ff14SB force field<sup>49</sup> was used to parameterized the apoprotein opsin, while the covalent bond 334 parameters of the retinal cofactor were retrieved from Ferrè et al.<sup>50</sup> as well as from a previous 335 work.<sup>48</sup> The hP23H/11-cis-retinal complex was then placed in a phospholipid bilayer of 138 336 molecules of 1,2-dioleoyl-sn-glycero-3-phosphocholine (DOPC)<sup>51</sup> added by mean of the 337 CHARMM-GUI membrane builder,<sup>52, 53</sup> solvated in a rectangular box of 14,629 TIP3P water 338 molecules, neutralized with the addition of 2 Na<sup>+</sup> counter-ions and finally relaxed through two 339 rounds of energy minimization. The first round corresponds to energy minimization of water 340 molecules and counter-ions for 1,500 steps using the Steepest Descent algorithm (SD), and for the 341 3,500 steps using the Conjugate Gradient algorithm (CG). In the second round, energy minimization 342 343 of the entire system was carried out for 10,000 steps (1,500 steps SD followed by 8,500 steps CG). The Langevin thermostat was then used to heat the system from 0 to 300 K over 1 ns at constant 344 volume, while the Berendsen barostat was used to control the density equilibration over 1 ns. 345 Finally, the system was preliminary equilibrated for 50 ns and MD trajectories were produced for 346 500 ns at constant pressure without restraints. MD simulations were carried out with the Amber18 347 program,<sup>54</sup> and the MD trajectory was analyzed by the CPPTRAJ software.<sup>55</sup> The hierarchical 348 agglomerative (bottom-up) approach was used to run cluster analysis on MD frames. The 349 representative MD frame of the most populated cluster was extrapolated from MD trajectory and 350 351 used as a rigid receptor in the docking-based virtual screening.

#### 353 Docking-based virtual Screening

The docking-based virtual screening was carried out using three different libraries of compounds: i) 354 an *in house* collection of around 1,000 natural products, the Drug Bank database,<sup>31</sup> and the 355 commercially available MolPort database containing 7,934,460 compounds in April 2021.32 356 Molecules were downloaded in SMILES format and filtered through the FILTER (OpenEye) 357 version 3.1.0.3 (aldehydes were retained through the "aldehyde" rule implemented in the 358 program).<sup>56</sup> Compounds were converted in 3D coordinates with OMEGA (OpenEye) version 359 3.1.0.3,<sup>56, 57</sup> keeping the exact stereochemistry as specified in the input file, racemic compounds or 360 molecules with unspecified chirality were discarded. The main tautomeric form of each compound 361 was retained in the virtual screening library, while the protonation state at pH 7.4 was assigned by 362 QUACKPAC (OpenEye) version 2.0.0.3.58 Compounds were then energy minimized by SZYBKI 363 (OpenEye) version 1.10.0.3,<sup>59</sup> using the MMFF94S force field.<sup>60</sup> Non-covalent molecular docking 364 simulations of the Drug Bank database and natural products were carried out with FRED (OpenEye) 365 version 3.3.0.3<sup>61, 62</sup> using the Chemgauss4 fitness function with standard settings and high docking 366 accuracy. The highest score pose of each compound was stored for visual inspection and further 367 analyses. Aldehyde compounds were docked both covalently and non-covalently using Glide XP 368 docking program from the Schrödinger Release 2019-1, using standard settings and storing the 369 highest ranking pose of each docked compound.<sup>63</sup> The pre-defined imine condensation reaction 370 between an aldehyde ligand and a lysine residue in the receptor was used in covalent docking. The 371 structure of the P23H rhodopsin mutant corresponding to the centroid of the most populated cluster 372 extracted from MD simulations was used as a rigid receptor in molecular docking simulations.  $\Delta E_b$ 373 calculations were carried out with the MMPBSA.py program.<sup>64</sup> 374

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376 Source of small molecules

Aldehyde derivatives were purchased from MolPort (Riga, Latvia). Natural compounds NP1-NP13 377 378 are known structures belonging to an *in house* library of natural products, which is stored at the Organic Chemistry Laboratory of the Department of Chemistry and Technology of Drugs of 379 Sapienza University of Rome. The library consists of about one thousand natural products, isolated 380 mainly from indigenous plants collected in biodiversity-rich countries, especially in tropical and 381 subtropical areas, and enlarged with their semi-synthetic and synthetic derivatives, as well as plant 382 material extracts. The chemical identity of the selected compounds was assessed by re-running 383 nuclear magnetic resonance spectroscopy (NMR) experiments and was proven to agree with the 384 literature data reported below for each compound. The purity of all compounds, checked by 385 386 reversed-phase high performance liquid chromatography (HPLC), was always higher than 95%. Details on natural products tested in this work including source, molecular weight, and molecular 387 formula are reported in Supporting Information, Table S1). PAINS analysis of tested compounds as 388 389 well as SMILES strings are reported in the Supporting Information.

NP1 (Emodine anthrone, 2-(3-methyl-1-butenyl)-1,8-dihydroxy-3-methoxy-6-methylanthrone
showed NMR spectra identical to those reported in the literature.<sup>65, 66</sup> NP2 (2',4'-dihydroxy-4methoxychalcone, (E)-1-(2,4-dihydroxyphenyl)-3-(4-methoxyphenyl)prop-2-en-1-one) showed
NMR spectra identical to those reported in the literature.<sup>67</sup> NP3 (g-hydroxyanthrone B, (E)-1,6,8trihydroxy-4-(4-hydroxy-3-methylbut-2-en-1-yl)-3-methyl-2,5-bis(3-methylbut-2-en-1-

395 yl)anthracen-9(10H)-one) showed NMR spectra identical to those reported in the literature.<sup>68</sup> NP4
396 (Loganin, 1-((1S,4aS,6S,7R,7aS)-6-hydroxy-7-methyl-1-(((2S,3R,4S,5S,6R)-3,4,5-trihydroxy-6-

(hydroxymethyl) tetrahydro-2H-pyran-2-yl) oxy) - 1, 4a, 5, 6, 7, 7a-hexahydrocyclopenta[c] pyran-4-

398 yl)ethan-1-one) showed NMR spectra identical to those reported in the literature.<sup>69</sup> NP5 (Sesamin,

5,5'-[(1S,3aR,4S,6aR)-Tetrahydro-1H,3H-furo[3,4-c]furan-1,4-diyl]bis(2H-1,3-benzodioxole)

400 showed NMR spectra identical to those reported in the literature.<sup>70</sup> NP6 (4,2',4',6'- tetrahydroxy-

401 3'-prenyl-3-geranyldihydrochalcone, (E)-3-(3,4-dihydroxy-5-(3-methylbut-2-en-1-yl)phenyl)-1-(3-

(3,7-dimethylocta-2,6-dien-1-yl)-2,4,6-trihydroxyphenyl)propan-1-one) showed NMR spectra 402 identical to those reported in the literature.<sup>71</sup> NP7 (Cordoin, 2'-hydroxy-4'-prenylchalcone) showed 403 NMR spectra identical to those reported in the literature.<sup>72</sup> NP8 (2-hydroxy-3',4'-404 dimethoxychalcone, (E)-1-(3,4-dimethoxyphenyl)-3-(2-hydroxyphenyl)prop-2-en-1-one) showed 405 NMR spectra identical to those reported in the literature.<sup>73</sup> NP9 (Curcumin, (1E,6E)-1,7-bis(4-406 hydroxy-3-methoxyphenyl)hepta-1,6-diene-3,5-dione ) showed NMR spectra identical to those 407 reported in the literature.<sup>74</sup> NP10 ((E)-5,7-dimethoxy-3-((7-methylocta-2,6-dien-1-408 yl)oxy)phenyl)-4H-chromen-4-one) showed NMR spectra identical to those reported in the 409 literature.<sup>75</sup> **NP11** 410 (Columbianetin, (S)-8-(2-hydroxypropan-2-yl)-8,9-dihydro-2H-furo[2,3*h*]chromen-2-one) showed NMR spectra identical to those reported in the literature.<sup>76</sup> NP12 (2-411 hydroxyderricin, 2,2'-hydroxy-4'-methoxy-3'-prenylchalcone) showed NMR spectra identical to 412 those reported in the literature.<sup>77</sup> NP13 (6-prenyl-aromadendrine, 3,5,7-trihydroxy-2-(4-413 414 hydroxyphenyl)-6-(3-methylbut-2-en-1-yl)chroman-4-one) showed NMR spectra identical to those reported in the literature.<sup>78</sup> 415

416

## 417 *Cell Culture*

ARPE-19 and U2OS cells were cultured in DMEM:F12 medium (Pan Biotech), supplemented with
10% foetal bovine serum (FBS) (Pan Biotech) and 1% penicillin/streptomycin (Sigma), under
standard cell culture conditions (in the dark, at 37.0 °C, 5% CO<sub>2</sub> and partial humidity).<sup>28</sup>

421 Cells were harvested weekly when confluent and the media was changed every 2 days. U2OS cells
422 used in this study, stably expressing—in the presence of tetracycline—the human rhodopsin bearing
423 P23H mutation and a 6 histidines tag (His-Tag, C-terminus), have been previously described.<sup>26</sup>
424 ARPE-19 (CRL-2302), human retinal pigment epithelium cells, were purchased from ATCC.

425

426 Cell Viability Assay

427 CellTiter-Blue Cell Viability Assay (Promega) was used to determine cell death rate after
 428 compounds treatment.<sup>79</sup>

Cells were harvested the day before the assay, and seeded into a 96 well plate (2x104 cells/well), 429 and maintained with DMEM:F12 supplemented with 2% FBS. After 24 hours, the cells were treated 430 with 10 µM of the tested compounds, and the following day, 20 µl of CellTiter-Blue reagent were 431 added in each well and left to incubate at 37 °C for a maximum of 4 hours. After that, the 432 433 fluorescent signal was recorded using a CLARIOSTAR plate reader setting the excitation/emission wavelengths to 560/590 nm. Data were normalized to 0.1% DMSO-treated cells (vehicle). The 434 fluorescence recorded from wells containing diluted reagent with media, and without the presence 435 436 of cells, was considered as negative control.

437

#### 438 *Single cell fluorescent microscopy assay*

439 U2OS cells stably transfected with human P23H rhodopsin were harvested 4h before the assay and 440 plated on 13 mm coverslips precoated with poly-D-lysine (PanBiotech), then left to adhere. After 441 this period and under dim red-light conditions, the media was replaced with fresh media containing 442 1  $\mu$ g/ $\mu$ l tetracycline (Invitrogene) and of 10  $\mu$ M of the compounds (0.1% DMSO final 443 concentration).<sup>28</sup>

444 Cells were incubated overnight in the dark to allow tetracycline-induced rhodopsin expression.

The following day, under dim-red light conditions, cells were washed twice with dPBS 445 (PanBiotech) and fixed with a solution of 4% methanol-free paraformaldehyde (Thermo Scientific) 446 447 for 25 minutes, followed by two PBS washes before incubating the cells with Intercept blocking buffer (LI-COR) for 1h. Then, the cells were incubated with RET-P1 antibody (Invitrogene, 1:800 448 449 Intercept buffer) for 2h, followed by incubation with the secondary antibody anti-mouse IgG (H+L), F(ab)' 2 Alexa Fluor 555 Conjugate (Cell signalling Technologies, 1:1000 Intercept Buffer), for 1h. 450 After careful repeated washing with PBS, cells were treated with a solution of 0.1% Triton for 20 451 minutes, and incubated with Anti-His Tag (Amgen, 1:500, Intercept buffer) overnight. The 452

following day, the cells were incubated with anti-mouse Ig(H+L), F(ab)'2 Fragment Alexa Fluor 454 488 Conjugate antibody (Cell Signalling Technologies, 1:1000 Intercept Buffer) for 1 h, washed 455 and nuclei were stained with DAPI (Sigma, 1:1000 Intercept buffer) for 10 minutes. Finally, the 456 coverslips were mounted on glass microscope slides using Moviol 488 mounting media.

457

## 458 Data and Software Availability

The three-dimensional structure of P23H mutant opsin extrapolated from MD simulations and used in this study as a rigid receptor in virtual screening, and docking complexes of validated hit compounds described in this work are available in PDB format as Supporting Information files.

462

## 463 Supporting Information

Additional information on compounds from the in house natural products tested in this work, including source, molecular weight, and formula. PAINS analysis of tested compounds, and SMILES strings.

467

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471

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475

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