# **Computational identification of novel Kir6 channel inhibitors**

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# 12 Abstract

13 KATP channels consist of four Kir6.x pore-forming subunits and four regulatory sulfonylurea receptor (SUR) subunits. These channels couple the metabolic state of the cell to membrane excitability and 14 play a key role in physiological processes such as insulin secretion in the pancreas, protection of cardiac 15 16 muscle during ischemia and hypoxic vasodilation of arterial smooth muscle cells. Abnormal channel 17 function resulting from inherited gain or loss-of-function mutations in either the Kir6.x and/or SUR 18 subunits are associated with severe diseases such as neonatal diabetes, congenital hyperinsulinism or 19 Cantú syndrome (CS). CS is an ultra-rare genetic autosomal dominant disorder, caused by dominant 20 gain-of-function mutations in SUR2A or Kir6.1 subunits. No specific pharmacotherapeutic treatment 21 options are currently available for Cantú syndrome. Kir6 specific inhibitors could be beneficial for the 22 development of novel drug therapies for Cantú syndrome, particular for mutations, which lack high 23 affinity for sulfonylurea inhibitor glibenclamide. By applying a combination of computational methods including atomistic MD simulations, free energy calculations and pharmacophore modelling, we 24 25 identified several novel Kir6.1 inhibitors, which might be possible candidates for drug repurposing. 26 The in silico predictions were confirmed using inside/out patch-clamp analysis. Importantly, Cantú 27 mutation C176S in Kir6.1 and S1020P in SUR2A, retained high affinity towards the novel inhibitors. Summarizing, the inhibitors identified in this study might provide a starting point towards developing 28 29 novel therapies for Cantú disease.

# 30 Introduction

- 31 Cantú syndrome is a rare genetic autosomal dominant disorder caused by dominant gain-of-function
- 32 mutations in the ATP-dependent potassium channel subunits ABCC9 (Harakalova et al., 2012; Van
- Bon et al., 2012) and KCNJ8 (Brownstein et al., 2013; Cooper et al., 2014, 2017), encoding SUR2 and
- 34 KIR6.1 respectively. Cantú patients are chronically ill; they suffer from congenital hypertrichosis,
- 35 distinctive facial features and cardiac defects (Cantú et al., 1982; Nichols et al., 2013; Scurr et al.,
- 36 2011) and have a decreased life expectancy. Currently, no specific pharmacotherapeutic options are
- 37 available to treat the disease (Kharade et al., 2016).

- 38 Recent breakthroughs in solving atomic and near-atomic resolution structures of eukaryotic inward
- 39 rectifier potassium channels provide an excellent opportunity to investigate the structural basis of CS
- 40 mutations and for developing novel therapies for KATP channelopathies. Starting from January 2017,
- 41 the first (near-)atomic resolution structures (resolution ranges from 3.63 Å to 6.3 Å) of these hetero-
- 42 octameric complexes have been solved by cryo-EM microscopy by three independent labs (Lee et al.,
- 43 2017; Li et al., 2017; Martin et al., 2017a, 2017b; Wu et al., 2018). These structures confirm that KATP
- 44 channels are formed by four Kir6.x pore–forming subunits and four regulatory sulfonylurea receptor
- 45 (SUR) subunits.
- 46 KATP channels couple the metabolic state of the cell to membrane excitability and play a key role in
- 47 physiological processes such as insulin secretion in the pancreas (Ashcroft, 2005), protection of cardiac
- 48 muscle during ischemia (Crawford et al., 2002; Nichols and Lederer, 1991; Zingman et al., 2007) and
- 49 hypoxic vasodilation of arterial smooth muscle cells (Dart and Standen, 1995).
- 50 Channel activity is regulated by voltage and ligands. While inhibitory adenosine-triphosphate (ATP)
- 51 binds to the Kir6.x subunit, magnesium-adenosine-triphosphate-(MgATP) and adenosine-diphosphate-
- 52 (ADP) activate the channel via interacting with the SUR subunits (MacGregor et al., 2002; Matsuo et 53 al., 1999, 2000; Tanabe et al., 1999; Ueda et al., 1999; Vanoye et al., 2002). Phospholipid
- 54 phosphatidylinositol-4,5-bisphosphate (PIP<sub>2</sub>), is necessary for channel opening of all inward rectifying 55 potassium channels and binds to the Kir6.x subunit (Huang et al., 1998; Shyng and Nichols, 1998;
- 56 Zhang et al., 1999). Abnormal channel function, resulting from inherited gain or loss-of-function
- 57 mutations in either the Kir6.x and/or SUR subunits are associated with severe diseases such as neonatal
- 58 diabetes, congenital hyperinsulinism and Cantú syndrome (Harakalova et al., 2012; Remedi and
- 59 Nichols, 2009). Further, SUR2 subunits have been shown to play a role in human neurological disease,
- 60 including prevalent diseases of the aged brain (Nelson et al., 2015).
- Pharmaceutical interventions in KATP channels include sulfonylurea-like inhibitors such as 61 glibenclamide and channel openers, such as diazoxide, which are clinically used to treat neonatal 62 63 diabetes and hypertension and target the sulfonylurea subunits (Gribble and Reimann, 2003; Pearson 64 et al., 2006). More recently, side effects due to inhibition of KATP channels have been reported as 65 well. For example, in 2011, Yu et al. (Yu et al., 2011) reported that all isoforms of KATP channels are 66 blocked by rosiglitazone (RSG) at micro molar concentrations, which could be harmful due to 67 promotion of adverse cardiovascular effects. RSG is a high-affinity agonist of the peroxisome 68 proliferator-activated receptor  $\gamma$ , which was introduced in 1999 for the treatment of type II diabetes mellitus. The drug increases insulin sensitivity in fat cells by regulating genes involved in glucose and 69 70 lipid metabolism and might have additional beneficial effects including anti-atherosclerotic, anti-71 inflammatory and anticancer effects (Brown and Plutzky, 2007). Due to reports of increased risk of 72 myocardial infarction, RSG was withdrawn from the market in Europe in 2010 (Agency European 73 Medicines, 2010) and had its access restricted in the US by the FDA in 2011 (U.S. Food and Drug 74 Administration, 2011). Recently it was shown that this increased cardiovascular risk might be due to 75 modification of different ion channels including Kv4.3, L-type calcium channels and KATP channels (Hancox, 2011; Jeong et al., 2011; Szentandrássy et al., 2011; Yu et al., 2011, 2012). Studies on pigs 76 77 demonstrate that RSG and other thiazolidinedione drugs can block cardiac sarcolemmal KATP 78 channels in vivo at clinically relevant doses (Lu et al., 2008). The reported IC<sub>50</sub> of this drug is 45 µM 79 for Kir6.2/SURx (pancreatic and heart) channels and 10 µM for vascular Kir6.1/SUR2B. Interestingly, 80 potency has been shown to be even higher in the presence of therapeutic concentrations of 81 sulforylureas reducing the IC<sub>50</sub> to 2  $\mu$ M. Since plasma concentrations of RSG used to treat type II diabetes mellitus are in the range of 3 µM (Cox et al., 2000), block of KATP channels could be a 82 83 serious problem. Experiments performed on Kir6.2AC36 constructs revealed that the drug acts

84 predominantly on the pore-forming Kir6.x subunits and not on the SUR subunits. Further analysis of 85 single KATP channels suggests that the drug suppresses channel activity by extending long-lasting

86 channel closures, most likely via modulating the gating mechanism (Yu et al., 2012).

87 Kir6 inhibitors such as RSG, which block channels at clinically relevant doses, could provide a good 88 starting point towards development of novel, specific inhibitors, suitable for developing drugs towards 89 treatment of Cantú syndrome. Thus, in this study, we investigated the structural mechanism of pore 90 block of RSG in Kir6 channels. We carried out extensive unbiased full atomistic simulations of drug 91 binding to the closed channel state. Based on the thereby identified binding site, we postulate a 92 structural mechanism by which the drug might prolong the long-closed state of the channel. Further, 93 structure-based pharmacophore models were constructed to enable identification of novel Kir6 94 inhibitors, which might be useful for future drug development to treat Cantú disease.

95

# 96 **Results and discussion**

97 Based on the experimental finding that RSG predominantly acts on the long-closed state of Kir6.1 98 channels (Yu et al., 2012), a homology model of the Kir6.1 pore model was constructed using the 99 closed state crystal structure of the Kir3.2 channel (Protein Data Bank (PDB) code: 3SYA (Whorton 100 and MacKinnon, 2011)) as template. A sequence alignment is shown in Supplementary Figure 1A. The root mean square deviation (RMSD) of the Kir6.1 model converged to  $\sim 4$  Å at around 100 ns, 101 102 indicating that the simulated systems are stable and at equilibrium (see Supplementary Figure 1C). 103 Starting in October 2017, the first atomic resolution structures of the KATP channel formed by Kir6.2 104 and SUR1 were published (Lee et al., 2017; Li et al., 2017; Martin et al., 2017a, 2017b; Wu et al., 105 2018). Thus, we compared the structural differences of our Kir3.2 based homology model with the new 106 Kir6.2 templates. Due to the low RMSD of the structural alignments (< 1.5 Å, see Supplementary 107 Figure 1B) we continued to use the Kir6.1 homology model based on the Kir3.2 template in subsequent 108 molecular dynamics (MD) simulations.

109

# 110 Unbiased µs time scale MD simulations identify putative RSG binding sites

111 In an effort to identify the putative binding site of RSG (5-[[4-[2-[methyl(pyridin-2-112 yl)amino]ethoxy]phenyl]methyl]-1,3-thiazolidine-2,4-dione)), and its main metabolite N-desmethyl 113 Rosiglitazone (5-[[4-[2-(pyridin-2-ylamino)ethoxy]phenyl]methyl]-1,3-thiazolidine-2,4-dione), N-114 RSG for short, full atomistic molecular dynamics simulations were performed. Specifically, the 115 binding was probed by adding 20 molecules (10 x S conformer, 10 x R conformer, since the prescribed 116 drug is a racemic mixture) randomly into the solvent, leading to an effective drug concentration of  $\sim$ 117 170 mM. As seen in Figure 1, 13 ligands partition into the lipid membrane within 1,5 µs. Three out of 118 20 molecules occupied sites close to the protein for 1.3 - 1.5 µs (see Table 1). The three major binding 119 sites (Figure 2) identified are: close to the PIP<sub>2</sub> binding site, denoted site A; the interface between two 120 cytoplasmic domains (CTDs), denoted site B, and between the  $\beta$ -sheet  $\beta$ D and the  $\beta$ G- $\alpha$ G loop, 121 denoted site C.

122 Binding site A is of particular interest since the ligand binds close to the transmembrane gate and the

123 PIP<sub>2</sub> binding site. Binding includes mainly hydrophobic interactions with residue LEU57 and ILE60.

124 Additionally, hydrophobic and hydrogen bond interactions with POPC lipid molecules are observed.

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Even though PIP<sub>2</sub> is within 5 Å of ligand no specific interactions with RSG are observed. All residues within 6 Å of ligand are shown in Figure 2C. Given the importance of this area for channel gating

- 127 (Zhang et al., 2015), we decided to perform a more exhaustive sampling of this region. We therefore 128 used computationally less demanding docking simulations with both compounds, followed by 250 ns
- MD simulations of the best-scored pose for RSG, and 200 ns of the best-scored pose for N-RSG. This
- 129 MD simulations of the best-scored pose for RSG, and 200 hs of the best-scored pose for N-RSG. This 130 way, strengthened binding interactions (defined as increased accessible surface area:  $0.9 \text{ nm}^2$  for site
- 131 A vs. 3 nm<sup>2</sup> when using the best docking pose) were obtained. We refer to this new site A as site A ref.
- A vs. 5 min when using the best docking pose) were obtained. We refer to this new site A as site A\_ref.

132 To further characterize the three binding sites, the potential of mean force (PMF) of the ligands at site 133 A ref, B and C, were calculated using umbrella sampling (US) simulations. As can be seen in Figure

3, the PMFs reveal clear differences between the three sites. Binding of RSG to site A ref is most

favorable. Since PMF calculations reveal shallow binding for ligands bound at sites B and C, we did

- 136 not further investigate these two binding sites. Nevertheless, ligand binding site B, might be potentially
- 137 interesting, since intersubunit interactions in this region have been shown previously to be important
- 138 for the inactivation process in Kir6.2 channels (Borschel et al., 2017; Lin et al., 2003).
- 139

# 140 Detailed characterization of binding site A\_ref

141 The interactions of RSG and N-RSG at site A ref over 200 ns of the MD simulations were quantified 142 using interaction matrices as described in the methods section. Ligands were decomposed as five parts 143 (Figure 4A and Supplementary Figure 2): the pyridine (Ring A), the benzene (Ring B), the 144 thiazolidinedione (Ring C), the linker connecting pyridine and benzene (Linker D), and the linker connecting benzene and thiazolidinedione (Linker E). RSG mainly formed hydrophobic interactions 145 146 with the binding site throughout the trajectory. More than 75% of the frames contain hydrophobic interactions between the Ring A and residue PHE76, VAL172 and MET173, and between the Linker 147 148 E and TRP69. Residues LEU64, ILE75, PHE80, ILE168 and ILE169 also frequently formed 149 hydrophobic interactions with RSG (Figure 4B). The interaction map of N-RSG molecule reveals a 150 similar trend indicating mainly hydrophobic interactions with the binding site (see Supplementary 151 Figure 2). Both ligands also form hydrogen bonds with POPC lipid molecules, which are not included 152 in the interaction map calculations.

153

# 154 Structure based dynamic pharmacophore models of RSG binding to site A\_ref

155 Understanding the inhibition mechanisms of the pore-forming Kir6.1 subunit could be a first step to develop novel blockers for the treatment of rare disease causing mutations (e.g. Cantú mutations 156 157 V64M), which are not amenable for sulforylurea therapy (Cooper et al., 2017). In line with this 158 reasoning we constructed dynamic structure-based pharmacophore models and screened for hits in 159 DrugBank (Law et al., 2014), which contains all marketed drugs, by using the common hits approach 160 (CHA) (Wieder et al., 2017). Structure-based pharmacophore models were generated using 5,000 161 frames from the MD simulation, which included the lipid bilayer but omitted solvent molecules. 162 Pharmacophore models, which contain common pharmacophore features and identical involved ligand 163 atoms, are considered as one representative pharmacophore model. Five representative pharmacophore 164 models (Model 1 - 5) were observed from the frames (shown in Supplementary Figure 3). Model 1 was 165 observed most frequently (>95%, 4,776 times out of 5,000 of frames). The other four models appeared 166 in less than 5% of the frames. All models share two hydrophobic features formed with pyridine and 167 benzene in the ligand. Model 1 contains one additional hydrogen bond donor with the NH moiety of

thiazolidinedione. Model 2 only contains the shared hydrophobic features. Model 3 and Model 4 also

share the same hydrophobic features plus one hydrogen bond donor and one hydrogen bond acceptor.

170 Model 5 comprises the shared hydrophobic features and one hydrogen bond acceptor. All five 171 pharmacophore models were used to screen *DrugBank*. The top ranked hitlist for binding site A ref is

- 172 shown in Table 2.
- 173

# 174 Inhibition of Kir6.2/SUR2A by Travoprost, Betaxolol and Ritodrine

175 From earlier work it was established that in the absence of pharmacological activation, Kir6.1/Sur2a channels yield very low current amplitude which hampers efficacy assessment of blockers (Cooper et 176 al., 2014). Therefore, Travoprost, Betaxolol and Ritodrine (three top ranked hits (Table 2)) were tested 177 178 for Kir6.2/SUR2A inhibition instead, using the inside/out mode on HEK293T cell derived excised 179 membrane patches. Travoprost  $(IC_{50}outward=2.46\pm0.52)$ μM; Hill coefficient 0.71: 180 IC<sub>50</sub>inward= $2.30\pm1.26$  µM; Hill coefficient 0.65) dose-dependently inhibited inward and outward 181 current components of IKir6.2/SUR2A whereas Betaxolol (IC500utward=22.06±2.47 µM; Hill coefficient 182 0.89) and Ritodrine (IC500utward=7.09±0.45 µM; Hill coefficient 0.86) markedly and dose-183 dependently inhibited the outward component (Figure 5). Betaxolol and Ritodrine induced rectification 184 behavior of the channel, i.e. outward current was more strongly inhibited than inward current (Figure 185 5B). This induction of rectification is in contrast with inhibition characteristics of Travoprost and RSG.

186 Similar findings have been made with Pentamidine and Pentamidine-Analogue-6 (De Boer et al., 2010;

187 Takanari et al., 2013). These structurally related compounds bind to the same site in the Kir2.1 channel,

but whereas Pentamidine induces channel rectification (De Boer et al., 2010), Pentamidine-Analogue-

189 6 inhibited both inward and outward current with similar efficacy (Takanari et al., 2013).

190

# 191 Further experimental support of RSG binding to site A\_ref

192 Experimental data from Yu et al., 2012 (Yu et al., 2012) revealed that RSG binding to inward rectifier 193 K<sup>+</sup> channels is Kir6.x specific. Electrophysiology measurements on Kir1.1, Kir2.1 and Kir4.1 channels 194 showed that these channels are insensitive to RSG. Thus, we performed a multiple sequence alignment 195 of these channels and evaluated the conservation of the predicted binding site residues. As shown in 196 Figure 6, differences between Kir6.x and members of other Kir channels at site A ref can be found at 197 positions 64 (LEU vs. VAL/CYS/PHE), 79 (SER vs. ALA/THR), 172 (VAL/ILE vs. PHE) and 176 198 (CYS vs. ALA/THR). Of particular interest is position 172, which contains a bulky phenylalanine side 199 chain in non-Kir6.x channels, which would prevent RSG from binding in a similar mode in these 200 channels. Experimental mapping of the binding site has not been performed, possibly due to challenges 201 measuring Kir6.1 subunits (Cooper et al., 2014). Nevertheless, mutational data on the closely related 202 Kir6.2 channel supports that residues in the binding area are critical for normal channel gating (Zhang 203 et al., 2015). Interestingly, two Cantú disease causing gain-of-function mutations (V65M, C176S) 204 (Brownstein et al., 2013; Cooper et al., 2014) are in close proximity to binding site A ref, further 205 supporting the importance of this region for gating. A further, indirect validation of the binding site 206 was gained by correctly identifying novel hits in DrugBank, based on the in silico predicted structure-207 based drug-protein interactions.

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# 209 Suggestions for experimental validation of the binding site

210 Our modelling predictions suggest that mutating position VAL172 to PHE should decrease or prevent

211 binding of RSG and its main metabolite N-RSG. Unfortunately, mutating the equivalent position in

Kir6.2 (ILE162) to PHE does not produce functional channels (Piao et al., 2001), preventing experimental validation of this prediction. Since the binding site is very close to the  $PIP_2$  molecule,

interference of PIP<sub>2</sub> interactions with the channel are likely. Previous studies on other Kir channels,

support drug PIP<sub>2</sub> interference for drugs such as carvedilol and ivermectin (Chen et al., 2017; Ferrer et

- al., 2011; Kikuta et al., 2006) or the anti-cancer agent gamboic acid (Scherer et al., 2017). For a recent
- 217 review see (Heyden et al., 2013).
- 218

# 219 **Proposed mechanism of drug action**

RSG binds at the interface between two subunits, very close to  $PIP_2$ , an essential gating modulator of inward rectifier channels. It is conceivable that the drug interferes with normal channel activation,

possibly via "blocking" the activation gate and/or via hindering normal lipid modulation of channels.

In line with this reasoning, we observed frequent hydrogen bonds to lipid molecules in our simulations.

Further simulations, using different lipid types will be necessary in the future to investigate this possibility. In addition, the predicted binding site A\_ref is in close proximity of two previously identified gain-of-function mutations causing Cantú disease (V65M and C176S (Brownstein et al., 2012) Compared a 2014) So for 100 as MD simulations are the set of the set of

227 2013; Cooper et al., 2014)). So far 100 ns MD simulations on these two mutations have been performed 228 (Cooper et al., 2017), revealing no changes in this region. Thus, in order to investigate if RSG or the

newly identified inhibitors might be able to counterbalance the gating disturbance effects of Cantú

230 mutations, we determined dose-response effects of currents mediated by C166S Kir6.2, which is

homologues to C176S in Kir6.1.

232

# Cantú mutations C166S (Kir6.2) and S1020P (SUR2A) are inhibited by RSG, Ritodrine, Travoprost and Betaxolol

Since CS C176S mutant is in close proximity of the predicted binding site A\_ref, we performed inside/out measurements on Kir6.2 C166S, the homologues mutation of Kir6.1 C176S, with RSG and the newly identified drugs Travoprost, Betaxolol and Ritodrine. As shown in Figure 7 all drugs dosedependent inhibit outward current, having IC<sub>50</sub> similar as WT channels (RSG: WT 25.98±1.49  $\mu$ M vs. C166S 34.88±2.34  $\mu$ M n.s.; Ritodrine: WT 7.09±0.45  $\mu$ M vs. C166S 10.42±0.87 n.s.; Betaxolol: WT 22.06±2.47 vs. 41.16±2.89  $\mu$ M n.s.) except for Travoprost (WT 2.46±0.52  $\mu$ M vs. 14.82±2.16  $\mu$ M, p<0.05).

Since the majority of Cantú mutations have been identified in the SUR2A subunits, we also tested the inhibitors on currents mediated by the S1020P SUR2A mutation. Again, mutant channels were sensitive for all for compounds with outward current IC<sub>50</sub> values (Rosiglitazone: 25.38±4.24  $\mu$ M; Ritodrine: 6.77±0.49  $\mu$ M ; Betaxolol: 29.51±3.78  $\mu$ M) not significantly different from WT channels except for Travoprost (10.99±1.28, p<0.05 vs. WT).

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- 247

# 248 Conclusions

249 Understanding the molecular mechanisms of inhibition of Kir6.x channels is critical to in paving the 250 way to develop novel blockers, useful for the treatment of channelopathies such as neonatal diabetes 251 (Remedi et al., 2017) or Cantú syndrome (Brownstein et al., 2013; Cooper et al., 2014). Further, our 252 study provides insights into how RSG might exert its cardiovascular side effects, via interfering with 253 its gating mechanism. We performed unbiased MD simulations on the microsecond time scale of the 254 pore forming Kir6.1 model with RSG randomly placed in the solvent. After identification of a putative 255 RSG binding site, we constructed dynamic pharmacophore models using the recently introduced 256 common hits approach and screened for hits in DrugBank, which contains all drugs available on the 257 market. Functional testing confirmed three new high affinity blockers, with different chemical 258 scaffolds (see Figure 5). The identified compounds (see Table 2) provide an important first starting 259 point for developing novel therapies for rare diseases such as CS. Taken together this study provides 260 novel insights into the structural basis of Kir6.x channel block and may have broader implications for 261 the molecular pharmacology of Kir6 channels in general.

- 262
- 263 **Methods**

#### 264 **Homology modelling**

265 At the beginning of this study, no atomic resolution structure of a KATP channel was available. Thus, a Kir6.1 homology model in the closed state was built using the crystal structure of Kir3.2 (PDB code: 266 267 3SYA (Whorton and MacKinnon, 2011), 2.98 Å resolution) as template with the program 268 Modeller9.11 (Martí-Renom et al., 2000). The sequence identity between Kir6.1 and Kir3.2 is 48.36%. 269 The sequence alignments can be found in Supplementary Figure 1A. Comparison of the Kir3.2 270 template with recent available Kir6.2 structures reveal that the structures are highly similar with RMSD 271 values below 1 Å (comparing the transmembrane domains). The structural alignments, generated with

- 272 the Swiss-pdb-viewer (Guex and Peitsch, 1997) are shown in Supplementary Figure 1B.
- 273

#### 274 **MD** simulations

275 MD simulations were performed using Gromacs5.1 (Abraham et al., 2015) and the Amber99sb force 276 field (Hornak et al.. 2006). The Kir6.1 protein was embedded into the 277 palmitoyloleoylphosphatidylcholine (POPC) lipid bilayer with four PIP<sub>2</sub> molecules bound to the 278 channel, as described previously (Lee et al., 2016). PIP<sub>2</sub> was parameterized using the Hartree-Fock 279 geometry optimization with the 6-31G\* basis set (Frisch et al., 2013). POPC parameters were taken 280 from Berger lipids parameters (Berger et al., 1997). The system was solvated using the SPCE water 281 model (Berendsen et al., 1987; Kusalik and Svishchev, 1994) and 150 mM KCl were added to the 282 solvent. To keep the selectivity filter stable, five K<sup>+</sup> ions were placed at sites S0 to S4. The force field 283 parameters of the ligand were generated and optimized with Gaussian09 (HF/6-31G\* basis set) and 284 antechamber (Wang et al., 2004, 2006). Ten R-form and ten S-form ligands were randomly placed in 285 the solvent of the system. The algorithm to integrate Newton's equation of motion was leap-frog, with 286 a time step of 2 fs. The LINCS algorithm (Hess et al., 1997) was used to constrain all bonds. The 287 cutoff-scheme for neighbor searching used Verlet (Verlet, 1967) within 1 nm and updated the list every 10 fs. The electrostatics and VdW interactions were measured with the particle-mesh Ewald (PME) 288 289 method (Darden et al., 1993), using a cut-off of 1 nm and Fourier spacing of 0.16 nm. Temperature 290 coupling used the V-rescale method (Bussi et al., 2007) at a reference temperature of 310 K and time 291 constant 0.1 ps. The pressure was kept constant at 1 bar by using the Parrinello-Rahman barostat

292 algorithm (Parrinello and Rahman, 1981) with a coupling constant of 2 ps. The system was minimized with the steepest descent algorithm, followed by a 6 ns equilibration simulation. 1.5 us unbiased MD 293

simulations were performed to detect the ligand binding sites. Additionally, 200 ns MD simulations 294 295 were run from the best docking pose of the ligand.

296

#### 297 Docking

298 RSG was docked at the putative binding site identified from unbiased MD simulations, using the 299 program Gold4.0.1 (Jones et al., 1997). The binding sites identified in the 1.5 µs free MD simulations 300 were used as starting point and the radius was set to 20 Å. 100,000 operations of the GOLD genetic 301 algorithm were used to dock the compounds with the ChemPLP scoring function.

302

#### 303 **Umbrella sampling (US)**

304 In order to estimate the ligand binding affinity, we performed US at each binding site. Ligands were 305 firstly pulled into the solvent using the pull code in GROMACS by applying a harmonic biasing force 306 between the center of mass (COM) of ligand and the COM of binding site (defined by residues within 5 Å of the ligand). The initial systems were taken from the last frames of the MD simulations for 307 308 binding sites A ref, B and C. To ensure that the ligands were pulled along the reaction coordinates 309 fully into the solvent area, a harmonic force of 1,000 kJ/(mol·nm<sup>2</sup>) was applied for most of the pulling 310 simulations. In cases, where the ligand displayed high mobility during the pulling trajectories, the 311 harmonic force was increased to  $2,000 \text{ kJ/(mol \cdot nm^2)}$ . Starting configurations for US were chosen from 312 the pulling trajectories by taking steps every 0.1 nm along the reaction coordinates. Several intermediate windows were added if the adjacent US windows did not overlap sufficiently. Harmonic 313 314 forces of 500, 1,000, 2,000 or 3,000 kJ/(mol·nm<sup>2</sup>) were applied to restrict the ligands during US 315 sampling. For each window, a 10 ns simulation was performed, excluding the first 1 ns as equilibration. 316 In total, 242 windows were simulated. Thus, in total, 2.42 us simulations were performed to obtain 317 good US window overlaps (Supplementary Figure 4). The potential of mean forces (PMF) were 318 calculated by using weighted histogram analysis method (WHAM) (Hub et al., 2010) and the statistical 319 errors were estimated by 100 times bootstrap analysis (Efron, 1979). A more detailed description about 320 the US method can be found in the Supplementary Methods.

321

#### 322 **Pharmacophore modelling**

323 The recent published Common Hits Approach (CHA) (Wieder et al., 2017) was applied to construct 324 dynamic pharmacophore models and to generate a hit-list by virtual screening in DrugBank (Law et 325 al., 2014). The CHA is implemented by LigandScout 4.10 (Wolber and Langer, 2005).

5,000 snapshots were extracted from the last 100 ns MD simulation of RSG at binding site A ref and 326

used as input for the CHA. For each snapshot, a pharmacophore model was built by considering the 327

328 ligand interactions with protein and lipids. Water molecules were discarded during the pharmacophore

329 generation. Pharmacophore features (mainly including hydrophobic interactions, hydrogen bond donor/acceptor, aromatic ring, ionizable area etc.) and constrains were defined as described in detail in

330

331 the LigandScout user manual (LigandScout user manual, 2010).

- 332 Representative pharmacophore models were obtained by merging all identical features, extracted from
- the 5,000 frames. In the end, five representative pharmacophore models were used for virtual screening
- against *DrugBank4.0* (Law et al., 2014) (see Supplementary Figure 3). The molecules in *DrugBank*
- were prepared as libraries for virtual screening using the *LigandScout* command line tool *idbgen*.
   Conformers for each molecule in the database were generated using the icon best option in *idbgen*; this
- 336 Conformers for each molecule in the database were generated using the icon best option in *labgen*; this 337 option produces a maximum number of 200 conformations for each molecule processed. The CHA
- 338 produced a ranked hit-list for the binding site. The approved drugs that fits at least two of the five
- representative pharmacophore models were proposed in the final hit-list shown in Table 2.
- 340

# 341 Interaction map

342 The interactions of RSG and N-RSG at site A ref (only protein and PIP<sub>2</sub> were considered) over the 343 200 ns MD simulations were analyzed and quantified by interaction maps, which were generated by 344 the python package matplotlib (Hunter, 2007) and the chemoinformatic toolkit CDPkit (Seidel and 345 Langer, 2017). Interactions were analyzed by generating a structure-based pharmacophore model at 346 every saved frame of the MD trajectories and subsequently analyzing the frequency of the individual 347 features. The interaction types were defined and described as pharmacophore features in the 348 LigandScout user manual, including hydrophobic (H), hydrogen bond (HB) acceptor/donor, positive 349 ionizable (PI) and aromatic (AR) features. The ligands were decomposed into five areas (Figure 4A 350 and Supplementary Figure 2): the pyridine (Ring A), the benzene (Ring B), the thiazolidinedione (Ring 351 C), the linker connecting pyridine and benzene (Linker D), and the linker connecting benzene and 352 thiazolidinedione (Linker E). The frequencies of interactions observed were numbered and colored in 353 the interaction map.

354

# 355 Electrophysiology

- 356 Inside-out patch clamp electrophysiology was performed as described previously (Harakalova et al.,
- 2012). In short, HEK293T cells were cultured on 10 mm glass coverslips and transfected with 0.16  $\mu$ g
- of rat pCMV6-Kir6.2, 0.16 µg of rat pCMV6-SUR2A and 0.08 µg of pEGFP1 expression constructs.
- Measurements were performed using an AxoPatch 200B amplifier controlled by pClamp 9 software (Molecular Devices) at 22 °C using a ramp protocol ranging from -100 to +100 mV in 5 s from a
- holding potential of -40 mV. The sampling rate was 50 kHz, filter frequency was 2 kHz. Bath solution
- 362 contained 131 mM KCl, 1 mM EGTA, 7.2 mM K<sub>2</sub>HPO<sub>4</sub>, 2.8 mM KH<sub>2</sub>PO<sub>4</sub>, 1 mM MgCl<sub>2</sub>, pH
- 363 7.20/KOH. The pipette solution contained 145 mM KCl, 1 mM CaCl<sub>2</sub>, 1 mM MgCl<sub>2</sub>, 5 mM HEPES,
- 364 pH 7.40/KOH. Pipette resistance was 1.5-3 M $\Omega$ . Data were not corrected for rundown, which was less
- than 10% at 10 minutes. All measurements were performed within a timeframe of 8-10 minutes. Fractional block at -80 and +50 mV was determined by dividing current levels obtained with test
- 367 compound containing solutions by current levels of control traces recorded in the absence of test
- 368 compound.
- 369 Betaxolol (Sigma-Aldrich, St. Louis MO, USA) and Ritodrine (Sigma-Aldrich) were dissolved in H<sub>2</sub>O
- at 100 mM. Travoprost (MedChemExpress, Monmouth Junction, NJ, USA) was dissolved in DMSO
- at 10 mM. Test compounds were diluted in bath solution at the indicated concentrations before the start
- of measurements.

### 373

# **374 Author contributions**

375 XC, MW, AG and MJCH performed research, ASW and MvdH designed the study, XC, MW, EMZP,

AG, MJCH, TL, MvdH and ASW analyzed data, ASW, MW, MvdH and XC wrote the paper. All authors reviewed the manuscript.

378

# 379 Competing interests

- 380 The authors declare no competing interests.
- 381

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387

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391

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  621 doi:10.1152/japplphysiol.00747.2007.
- 622
- 623 Tables
- 624 Table 1. Three binding sites observed during unbiased MD simulations and their corresponding

625 occupation time. All three ligands occupied the binding site for at least 1 µs and until the end of the

626 simulation. Ligands migrate to binding site A at 300 ns, to binding site B right after the equilibration,

and to binding site C at 200 ns.

Binding site	Binding time of ligand to binding site	Stereochemistry of ligand
А	1.2 μs (300 ns - 1.5 μs)	R conformer
В	1.5 μs	S conformer
С	1.3 μs (200 ns – 1.5 μs)	S conformer

629	Table 2. Top ranked hit-list for binding site A	\_ref.	The hit-list was	established by so	creening the
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029	Table 2. Top fanked int-inst for binding site A_ref. The int-inst was established by screening the
630	dynamic pharmacophore models to the Drugbank database. Top 20 approved drugs ranked by CHA
631	score are proposed in the displayed hit-list.

DrugBank ID	Generic name	CHA score	Number of active pharmacophores
DB08907	Canagliflozin	2.7417	3/5
DB01095	Fluvastatin	2.7246	3/5
DB09351	Levobetaxolol	2.7035	3/5
DB00917	Dinoprostone	1.8892	2/5
DB00195	Betaxolol	1.862	2/5
DB00841	Dobutamine	1.852	2/5
DB00287	Travoprost	1.8516	2/5
DB00938	Salmeterol	1.8475	2/5
DB00179	Masoprocol	1.8458	2/5
DB00867	Ritodrine	1.8104	2/5
DB09198	Lobeglitazone	1.8102	2/5
DB04855	Dronedarone	1.8096	2/5

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DB06817	Raltegravir	1.805	2/5
DB09570	Ixazomib	1.8038	2/5
DB01346	Quinidine barbiturate	1.8019	2/5
DB00204	Dofetilide	1.7997	2/5
DB01240	Epoprostenol	1.7992	2/5
DB00662	Trimethobenzamide	1.7935	2/5
DB08875	Cabozantinib	1.7838	2/5
DB09330	Osimertinib	1.7275	2/5

### 632

### 633 Figure legends

Figure 1. Simulation setups: The first and last frame of free MD simulation. Protein (grey cartoon)
is embed in the lipid bilayer (cyan lines with red head groups). As a starting simulation setup (t=0), 20
ligands (shown as spheres) were randomly distributed in the solvent. After a 1.5 μs MD simulation,

637 the ligands either are bound to the protein or entered the lipid phase.

638

639 Figure 2. Three binding sites observed after 1.5 µs unbiased MD simulation. The protein is 640 represented as cartoon; adjacent subunits are colored in green and grey, respectively. PIP<sub>2</sub> molecules are shown as orange sticks. Ligands are represented as purple spheres. (A) Side view of the whole 641 protein highlighting the three ligands bound to binding sites A - C. Site A: in close proximity to the 642 PIP<sub>2</sub> binding site; Site B: at the interface between 2 CTDs; Site C: between the β-sheet βD and the βG-643 644 αG loop. (B) Bottom view of Site B and Site C. (C) Detail view of site A: residues within 6 Å of the 645 ligand are labeled and presented as grey sticks. The ligand mainly forms hydrophobic interaction with LEU57 and ILE60; additionally, it forms hydrophobic and hydrogen bond interactions with lipid 646 647 molecules (transparent sticks in light grey).

648

# 649 Figure 3. Potential of Mean Forces (PMFs) derived from umbrella sampling for both RSG and

650 N-RSG at the three binding sites. The energy profiles are depicted including their standard

- 651 deviations. The WHAM histograms are shown in Supplementary Figure 4. Site A\_ref shows higher
- binding affinity for both, RSG and N-RSG, compared to the other binding sites.

653

- 654 Figure 4. RSG interactions with the protein and PIP<sub>2</sub> at binding site A ref. (A) Molecular structure of RSG including the denotation corresponding to the interaction map. (B) Interaction map of RSG 655 with protein and PIP<sub>2</sub> during 200 ns MD simulation. The matrix is colored and numbered by the 656 657 percentage of frames, in which interactions were observed: aromatic (AR), hydrophobic (H), hydrogen bond (HB). The residues in the Kir6.1 are named by the corresponding amino acid with its residue 658 number and chain ID (A or D). (C) RMSD plot of RSG at binding site A ref during a 250 ns MD 659 660 simulation. (D) Best PMF energy pose: Kir6.1 is represented as cartoon with two neighboring subunits 661 colored in grey and green, respectively. RSG (purple), the surrounding residues within 3.5 Å, and the 662 PIP<sub>2</sub> (orange) are shown as stick.
- 663

664 Figure 5. Inhibition of Kir6.2/SUR2A carried I<sub>KATP</sub> by Travoprost, Betaxolol and Ritodrine. (A) Current traces of Kir6.2/SUR2A channels in the inside-out orientation exposed to Travoprost, 665 Betaxolol or Ritodrine at the indicated drug concentrations (0, 3 and 30 µM). Dotted horizontal line at 666 0 pA. (B) Normalized block of inward (black bars, at -80 mV) and outward (open bars, at +50 mV) 667 currents with 30 µM of the indicated drug. \*P<0.001 (paired T-test, inward vs. outward; n=8, n=11 668 669 and n=9 for Travoprost, Betaxolol and Ritodrine, respectively. (C) IC<sub>50</sub> curves of outward components 670 of Kir6.2/SUR2A in response to different concentrations of Travoprost (open squares; n=8), Betaxolol (black triangles; n=11 or n=7 (100  $\mu$ M)) and Ritodrine (black circles; n=9 (control and 1  $\mu$ M), n=8 (0.3 671  $\mu$ M) or n=7 (3, 10, 30  $\mu$ M)). Data were fitted with Hill equation to estimate the IC<sub>50</sub> values. Data in 672 673 panels b and c are shown as mean±SEM.

674

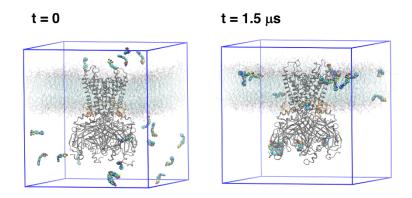
Figure 6. Sequence alignment of Kir6.x, Kir1.1, Kir2.1 and Kir4.1 from binding site A\_ref. The
alignment of residues on chain A and chain D within 3.5 Å of RSG at the lowest PMF energy pose.
Coloring of the alignment was performed using the BLOSUM62 algorithm. SH: slide helix; TM1:
transmembrane helix 1; TM2: transmembrane helix 2.

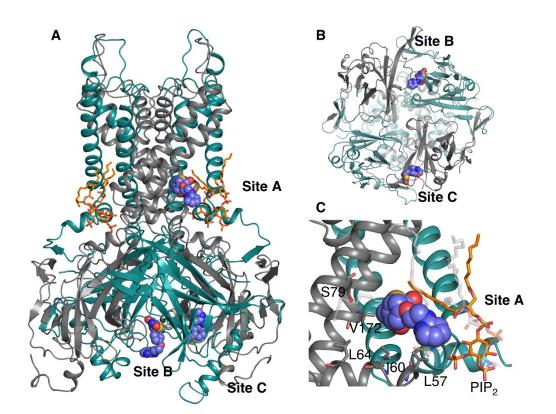
679

# Figure 7. Inhibition of C166S (Kir6.2) and S1020P (SUR2A) by Rosiglitazone, Travoprost, Betaxolol and Ritodrine

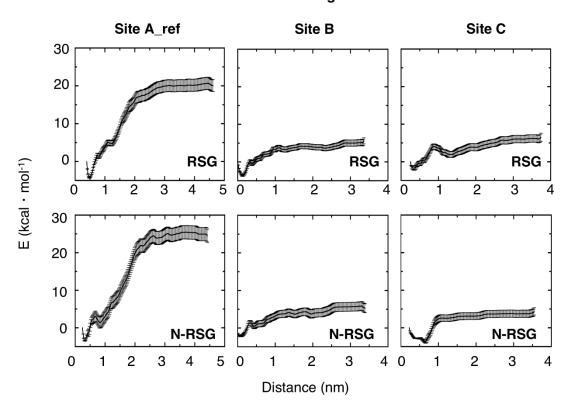
682 IC<sub>50</sub> curves of outward components of Kir6.2/SUR2A (WT, C166S Kir6.2, S1020P SUR2A) in 683 response to different concentrations of Rosiglitazone, Travoprost, Betaxolol and Ritodrine. N-values 684 are: WT, C166S and S1020P respectively: Rosiglitazone n=8, 8, 6; Travoprost n=8, 7, 11; Betaxolol 685 n=11, 7, 7; Ritodrine n=9, 8, 7. Data were fitted with Hill equation to estimate the IC<sub>50</sub> values. Data 686 are shown as mean±SEM.

687

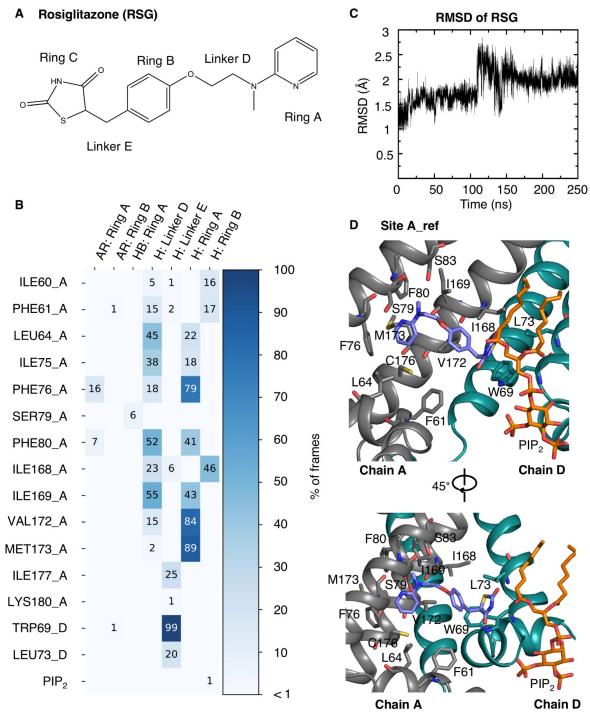








PMFs at binding sites



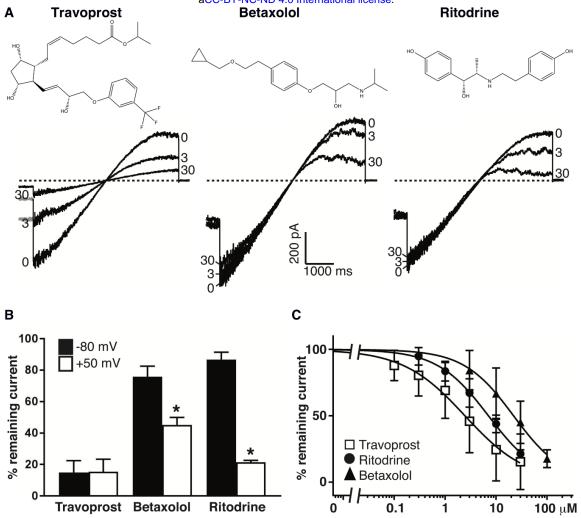


Figure 5

Chain A SH	Chain A TM1	Chain A TM2	Chain D TM1
61 64	76 79 80 83	168 169 172 173 176	69 73
Kir6.1 │ <mark>F</mark> TT <mark>L</mark> V 65	IFTMSFLCSW84	LIINAVMLG <mark>C</mark> I177	K <mark>W</mark> RHT <mark>L</mark> V <b>7</b> 4
Kir6.2 ∨ <mark>F</mark> ⊤ ⊤ L ∨ 64	IFTMSFLCSW83	L <mark>M I</mark> NA I <mark>M</mark> L G <mark>C</mark>   167	К <mark>W</mark> РНТ <mark>L</mark> L 73
Kir1.1 │ <mark>W</mark> ⊤ ⊤ <mark>V</mark>	IFITAFLGSW92	V I I NS FMCGA   178	K <mark>W</mark> RYK <mark>M</mark> T 82
Kir2.1   <mark>F</mark> ⊤ ⊤ C ∨ 77	<b>F</b> C L <b>A F</b> V L <b>S</b> W 96	C I I DA F I I G A V 179	R <mark>W</mark> RWM <mark>L</mark> V86
Kir4.1 ∟ <mark>W</mark> ⊤⊤F∣ 60	LFSATFAGTW 79	T <b>I L</b> E I <b>F I</b> T G <b>T</b> F 165	Q <mark>W</mark> RYK <mark>L</mark> L69

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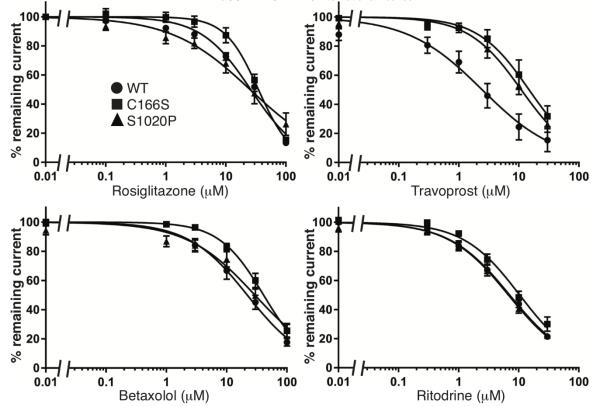


Figure 7