

1 **Title Page**

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3 **Filovirus antiviral activity of cationic amphiphilic drugs is associated with**
4 **lipophilicity and ability to induce phospholipidosis**

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6 Authors and affiliations:

7 Antonia P. Gunesch^{a,b,c}, Francisco J. Zapatero-Belinchon^{a,b,c}, Lukas Pinkert^d, Eike
8 Steinmann^e, Michael P. Manns^{a,b}, Gisbert Schneider^f, Thomas Pietschmann^{b,c}, Mark
9 Brönstrup^{b,d}, Thomas von Hahn^{a,b,c,g#}

10

11 a. Department of Gastroenterology, Hepatology and Endocrinology, Hannover
12 Medical School, Hannover, Germany13 b. German Center for Infection Research (DZIF), Hannover-Braunschweig site,
14 Germany;15 c. Institute of Experimental Virology, TWINCORE, Center for Experimental and
16 Clinical Infection Research Hannover, Hannover, Germany17 d. Department of Chemical Biology, Helmholtz Centre for Infection Research
18 (HZI), Braunschweig, Germany19 e. Department for Molecular & Medical Virology, Ruhr-Universität Bochum,
20 Bochum, Germany21 f. Department of Chemistry and Applied Biosciences, Institute of Pharmaceutical
22 Sciences, Eidgenössische Technische Hochschule (ETH) Zürich, Switzerland23 g. Department of Gastroenterology and Interventional Endoscopy, Asklepios
24 Hospital Barmbek, Semmelweis University, Campus Hamburg, Germany

25

- 26 #Corresponding author: Prof. Dr. med. Thomas von Hahn, t.hahn@asklepios.com.
- 27 Short running title: Antiviral structure-activity relationship of cationic amphiphilic drugs

28 1. Abstract

29 Several cationic amphiphilic drugs (CADs) have been found to inhibit cell entry of
30 filoviruses and other enveloped viruses. Structurally unrelated CADs may have
31 antiviral activity, yet the underlying common mechanism and structure-activity
32 relationship are incompletely understood.

33 We aimed to understand how widespread antiviral activity is among CADs and which
34 structural and physico-chemical properties are linked to entry inhibition.

35 We measured inhibition of Marburg virus pseudoparticle (MARVpp) cell entry by 45
36 heterogeneous and mostly FDA-approved CADs and cytotoxicity in EA.hy926 cells.

37 We analysed correlation of antiviral activity with four chemical properties: pKa, ClogP,
38 molecular weight and distance between the basic group and hydrophobic ring
39 structures. Additionally, we quantified drug-induced phospholipidosis (DIPL) of a CAD
40 subset by flow cytometry. Structurally similar compounds (derivatives) and those with
41 similar chemical properties but unrelated structure (analogues) to strong inhibitors
42 were obtained by two *in silico* similarity search approaches and tested for antiviral
43 activity. Overall 11 out of 45 (24 %) CADs inhibited MARVpp by 40 % or more. The
44 strongest antiviral compounds were dronedarone, triparanol and quinacrine.

45 Structure-activity relationship studies revealed highly significant correlations between
46 antiviral activity, hydrophobicity (ClogP>4), and DIPL. Moreover, pKa and intra-
47 molecular distance between hydrophobic and hydrophilic moieties correlated with
48 antiviral activity, but to a lesser extent. We also showed that in contrast to analogues,
49 derivatives had similar antiviral activity as the seed compound dronedarone. Overall,
50 one quarter of CADs inhibits MARVpp entry *in vitro* and antiviral activity of CADs
51 mostly relies on their hydrophobicity, yet is promoted by the individual structure.

52 2. Introduction

53 Outbreaks of emerging viral diseases have repeatedly posed major challenges
54 to global health in the recent years (<https://www.who.int/csr/don/en/>). Important
55 examples include the *Filoviridae* Ebola virus (EBOV) and Marburg virus (MARV),
56 *Arenaviridae* Lassa virus (LASV), *Coronaviridae* like Middle East Respiratory
57 Syndrome coronavirus (MERS-CoV), or the *Flaviviridae*-member ZIKA. Some of
58 these infections are associated with high case-fatality rates, e.g. 50 % for EBOV and
59 MARV, 35 % for MERS-CoV (2), and up to 30 % for hospitalized LASV patients (3).
60 Thus according to the *WHO-List of Blueprint priority diseases* of 2018, the
61 aforementioned pathogens share priority status concerning the need for research
62 and development given that effective vaccines or direct acting antivirals are
63 unavailable in most cases (4). It would be of great value to have drugs that are active
64 against a broad range of viral pathogens (5, 6). Such agents would likely not target
65 specific components of individual viruses but rather cellular structures or processes
66 that are utilized by various unrelated viruses. An attractive target pathway concerns
67 cellular endosomal processes, since these are used by numerous pathogens
68 including members of the families *Filoviridae*, *Arenaviridae*, *Rhabdoviridae*,
69 *Coronaviridae*, *Togaviridae*, *Flaviviridae* and *Bunyaviridae*.
70 Cationic amphiphilic drugs (CADs) are a diverse group of compounds, many of which
71 are in medical use for various clinical indications. CADs are defined by a hydrophilic
72 group marked by a basic amine with high pKa (the negative logarithm of the acid
73 dissociation constant Ka) and hydrophobic group(s) characterised by several
74 aromatic or aliphatic structures (7). Due to their amphiphilic nature CADs
75 translocate membranes which can be enhanced by different substituents like
76 halogen residues. Upon reaching acidic compartments like late endosomes (LE) and
77 endolysosomes, the basic amine groups gets protonated, which leads to lysosomal

78 trapping of the compounds (8). Consequently, CADs primarily accumulate in acidified
79 compartments (9, 10).

80 Several studies, most of which analysed sets of approved drugs, have found that
81 various CADs have antiviral activity. The antiarrhythmics amiodarone, dronedarone
82 and verapamil (11) as well as the estrogen receptor antagonists clomifene and
83 toremifene (12) have been shown to inhibit filoviral entry in different cell lines.
84 Moreover, clomifene and toremifene were shown to elevate survival rates of mice
85 infected with mouse-adapted EBOV up to 90% (12). Of note, they could show that the
86 antiviral activity of these two CADs was unrelated to their clinical mechanism of
87 action as estrogen receptor modulators. Beyond filoviruses, CADs have also been
88 found to inhibit *Arenaviridae* LASV and Guanarito virus (GTOV) (13), Hepatitis C
89 virus (HCV) (14–18), Japanese encephalitis virus (JEV) (19), Severe acute
90 respiratory syndrome-related coronavirus (SARS-CoV) (20), and Epstein-Barr virus
91 (EBV) (21). Moreover, it was found that the CADs amiodarone, bepridil, raloxifene
92 and amodiaquine besides several non-CAD compounds have broad antiviral effects
93 against all tested alpha- and flaviviruses (with the exception of ZIKA virus), as well as
94 varying other viruses, but none inhibited Human immunodeficiency virus (HIV) (22).
95 Highest antiviral activity for all four CADs was found against EBOV virus like
96 particles. Despite these observations, it is not known so far how widespread antiviral
97 activity really is among CADs. Likewise, the mechanism of action behind the antiviral
98 activity is unclear. For this reason, we undertook a comprehensive study of antiviral
99 activity among 45 heterogeneous CAD compounds and correlated antiviral activity
100 with various physico-chemical properties.

101

102

103 **3. Material and Methods**104 *2.1 Pseudoparticle production and transduction*

105 Pseudoparticles were produced as described before (23, 24). In brief, producer HEK-
106 293T cells were seeded at 8×10^5 cells/well in a poly-L-lysine coated 6-well plate. After
107 24 h cells were co-transfected with 1 μ g DNA using polyethyleneimine (PEI) to
108 produce HIV-based pseudoparticles bearing individual viral envelope gp. The
109 plasmids used were (1) a packaging plasmid containing HIV-based gag-pol genes
110 (25), (2) a plasmid encoding for the *env* gene of MARV (pCAGGS-MARVGP) (26) or
111 an empty vector pcDNA3.1 and (3) a gutted yet packaging competent HIV-based
112 transfer plasmid encoding for NLuc reporter gene (pWPI_NanoLuc_BLR) (in a ratio
113 1:1:4). After 6 h post-transfection, medium was exchanged for 3 % FCS DMEM
114 containing 5 % Penicillin/Streptomycin and pseudoparticles harvested, pooled and
115 filtered after 48 h and 72 h. For lentiviral transduction, target EA.hy926 cells were
116 seeded 1×10^4 cells / well in a 96-well plate. After incubation for 24 h, 50 μ L of
117 MARVpp or 50 μ L complete DMEM were mixed with polybrene (1:1000) and CADs to
118 an end-concentration of 5 μ M and applied in triplicates. As a solvent control sterile
119 water, EtOH, or DMSO were diluted in DMEM complete in the same ratio as the
120 drugs. At 6 h post transduction (h.p.t), cells were washed once with phosphate
121 buffered saline (PBS) and 100 μ L of complete DMEM were applied. Seventy-two
122 h.p.t, cells were washed with PBS and lysed. Next, 20 μ L of cell lysate were
123 transferred to a 96-well luminometer plate, mixed with 80 μ L of the luciferase
124 substrate coelenterazine, and incubated shortly in the dark before NLuc activity
125 quantification in a GloMax® plate luminometer (Promega, Madison, WI, USA),
126 representing gp-driven cell entry.

127

128 *2.2 Cytotoxicity test*

129 EA.hy926-NLuc were seeded at 1×10^4 cells/well in a 96-well plate. The next day, cells
130 were treated in triplicate with either complete DMEM, solvent control (complete
131 DMEM + solvent), or with diluted CADs at a final concentration of 5 μ M. After 6 h,
132 cells were washed with PBS and incubated with 100 μ L complete DMEM for another
133 72 h at 37 C. Then cells were lysed and luciferase activity was determined as an
134 aggregate measure of cell viability and proliferation.

135

136 *Compounds and similarity search*

137 The compounds amiodarone HCl (A8423), amorphine HCl (SML0283), bepridil HCl
138 (B5016), clemastine fumarate salt (SML0445), clomiphene citrate salt (C6272),
139 dasatinib (CDS023389), dronedarone HCl (D9696), perhexiline maleate salt
140 (SML0120), promazine HCl (P6656), sertraline HCl (S6319), terconazole (32355),
141 toremifene citrate salt (T7204), triparanol (T5200), chlorcyclizine (SML1473),
142 clozapine (C6305), cyclizine HCl (C3090000), N-Desethylamiodarone HCl solution
143 (D-055), verapamil HCl (V4629), W-7 (N-(6-Aminoethyl)-5-chloro-1-
144 naphthalenesulfonamide hydrochloride) (A3281), amantadine HCl (A1260),
145 Benzylamine (185701), chloroquine diphosphate salt (C6628), clomipramine HCl
146 (C7291), chlorpromazine HCl (C0982), enclomiphene HCl (SML0719), fenfluramine
147 HCl (F112), flupentixol dihydrochloride (Y0000064), fluphenazine dihydrochloride
148 (F4765), gentamicin sulfate (G1914), imipramine HCl (I0899), maprotiline HCl
149 (M9651), mianserin HCl (M2525), prochlorperazine dimaleate salt (P9178),
150 promethazine HCl (P4651), propranolol HCl (P0884), quinacrine dihydrochloride
151 (Q3251), teicoplanin (T0578), thioridazine HCl (T9025), trifluoperazine HCl (T6062),
152 tripelennamine HCl (T7511), U18666A (U3633), W-5 (N-(6-Aminoethyl)-1-
153 naphthalenesulfonamide hydrochloride) (SML0657), zimelidine dihydrochloride

154 (Z101) were purchased from Sigma-Aldrich Chemie GmbH (Taufkirchen, Germany).
155 The compound Ro 48-8071 was purchased from Biomol GmbH (Hamburg,
156 Germany).
157 Dronedarone-derivatives were received using SciFinder® software (Chemical
158 Abstracts Service, 2017). D-1 (N-Mesyldronedarone; TRC-M225785) and D-2 (S-
159 Desmethyl S-Chloromethyl Dronedarone; TRC-D291470) were purchased from
160 BIOZOL Diagnostica Vertrieb GmbH (Eching, Germany). To obtain analogous CADs,
161 chemical advanced template search (CATS) software was used (Schneider et al.,
162 1999). The compounds AC1 (1-(4-Ethyl-1-piperazinyl)-4-[1-(4-methylbenzyl)-1H-
163 indol-3-yl]-1-butanone; E230-0651), CS3 (2-[(E)-2-{4-[Ethyl(4-
164 methoxyphenyl)amino]phenyl}vinyl]-3-methyl-1,3-benzothiazol-3-ium; 7165-0012)
165 and QT1 (G119-1593; G119-1593) were obtained by ChemDiv (San Diego, CA,
166 USA). CS1 (2-{2-[(3,4-dichlorophenyl)thio]ethyl}-1-(2-oxo-2-phenylethyl)pyridinium
167 bromide; 5841320) and CS2 (1-{2-[4-(1-methyl-1-
168 phenylethyl)phenoxy]ethyl}pyrrolidine; 7020606) were ordered from ChemBridge
169 Corporation (San Diego, CA, USA). DQ1 (2-(4-(sec-butyl)phenyl)-N'(1-
170 phenethylpiperidin-4-ylidene)quinolone-4-carbohydrazide; IVK 9315735) was
171 purchased from SRC Alinda (Moscow, Russia) and CS4 (5-bromo-2-[[1-(3-
172 fluorophenyl)ethyl]sulfanyl]pyridine; PB742999078) from Chemspace (Riga, Latvia).
173 CT1 ((E)-1-(5-chlorothiophen-2-yl)-3-(4-(diphenylamino)phenyl)prop-2-en-1-one;
174 Z46049784) was purchased from Enamine (Monmouth junction, NJ, USA). As
175 solvents water, ethanol (EtOH) (Carl Roth, Karlsruhe, Germany), or dimethylsulfoxid
176 (DMSO) (Carl Roth, Karlsruhe, Germany), were used.
177

178 *Cell culture*

179 Immortalized epithelial HEK-293T and EA.hy926, a fusion product of A549 and
180 human umbilical vein endothelial cells, were cultured in Dulbecco's Modified Eagle
181 medium (DMEM) with 10 % fetal calf serum (FCS), 5 % Penicillin/Streptomycin, 5 %
182 non-essential aminoacids (NEAA) and 5 % L-glutamine (complete DMEM) at 37 °C
183 with 5 % CO₂. Luciferase-expressing EA.hy926-NLuc cells were obtained by
184 transduction with VSV-Gpp harboring the nano luciferase (NLuc) gene and cultured
185 as previously described.

186

187 *Phospholipidosis assay*

188 EA.hy926 cells were seeded at 1×10^4 cells/well in a 96-well plate. The next day,
189 CADs and their solvents (DMSO and water) were diluted in culture medium.
190 Phospholipidosis was quantified using LipidTOX™ Green Phospholipidosis Detection
191 Reagent (H34350, Thermo Fisher Scientific, Waltham, MA, USA) according to a
192 modified version of a degradation assay (Mesens et al., 2009). In brief, LipidTOX™
193 was diluted 1:500 in complete DMEM and sterile filtered. Then 50 µL of either CAD
194 mixture or controls were applied to the cells together with 50 µL of diluted LipidTox,
195 resulting in a final CAD concentration of 5 µM and a final LipidTox dilution of 1:1000.
196 After incubation for 6 h at 37 °C, cells were washed once with PBS. Medium was
197 exchanged for 100 µL culture medium and only the drugs (5µM) but no LipidTOX™
198 were added a second time. After 24 h in total, cells were washed with PBS,
199 trypsinised, and transferred to FACS tubes. Cells were washed with 1 mL FACS
200 buffer (2 % FCS in PBS), centrifuged for 5 min at 1000 rpm and supernatant
201 discarded. In some replicates, cells were fixed with 100 µL 3-6 % PFA with no
202 influence on the results. Finally, CAD-induced lysosomal accumulation of LipidTOX™
203 was quantified as intracellular green fluorescence by flow cytometry in BD

204 FACSCanto II (BD, Franklin Lakes, NJ, USA) or for derivatives in Spectral Cell
205 Analyzer SA3800 (Sony Biotechnology, San Jose, CA, USA) and analysed with
206 FlowJo V9 and V10.

207

208 *Chemical properties / parameters*

209 The chemical parameters of CADs including molecular weight, pKa and octanol/water
210 partitioning coefficient (ClogP) were obtained from either the respective data sheets
211 or the databases Pubchem (Kim et al., 2019), drugbank (Wishart et al., 2018) and
212 ChemDraw Professional 18 (PerkinElmer, Hamburg, Germany). The parameter
213 “linker length” was defined as the distance between the amine group and the first
214 hydrophobic ring structure. We determined linker length by compiling the 3D structure
215 of each CAD in Chem3D Pro 18 (PerkinElmer, Hamburg, Germany), performed a
216 MM2 energy minimization and then used coordinates x, y and z of the amine and
217 hydrophobic group to calculate the distance.

218

219 *Statistical analysis*

220 Unless stated otherwise, experiments were conducted three times in triplicate.
221 Statistical analysis was performed in GraphPad Prism 7 (La Jolla, CA, USA). The
222 statistical significance between multiple groups and the control groups was evaluated
223 by ordinary One-way ANOVA followed by multiple comparisons test (Dunnett) and for
224 correlation analyses a non-parametric Spearman-correlation was run. Concentration-
225 response curves were fitted by non-linear regression ([Inhibitor] vs. response -
226 variable slope (four parameters)) and IC50 and CC50 values interpolated from the
227 resulting standard curve.

228

229

230 **4. Results**

231 **3.1 Side-by-side assessment of MARV gp-driven cell entry inhibition and**
232 **cytotoxicity of 45 CADs**

233 We firstly attempted to evaluate how common antiviral activity is among CADs.
234 Therefore, we selected an initial set of 45 CADs (Table 1) based on the following
235 criteria: (i) coverage of multiple drug classes, (ii) diverse chemical structures aside
236 from being CADs, (iii) preferentially FDA- or EMA-approved compounds / no known
237 major toxicity and (iv) commercial availability. We included CADs that have either
238 previously been reported to have antiviral activity or are known to cause drug-
239 induced phospholipidosis (DIPL).

240 In order to test many drugs at the same time, a single-point 96-well assay was
241 established, that enabled testing the entire set of compounds at the same micromolar
242 concentration against a high-titer preparation of lentiviral particles pseudotyped with
243 the MARV gp (MARV pseudovirus, MARVpp) in endothelium-derived EA.hy926 cells.
244 Beforehand, we conducted concentration-response and -toxicity curves of the
245 prototypical, antivirally active CAD amiodarone in EA.hy926 cells against MARVpp.
246 The half-maximal inhibitory (IC_{50}) and cytotoxic (CC_{50}) concentrations were
247 $IC_{50} = 1.6 \mu\text{M}$ and $CC_{50} = 54 \mu\text{M}$, respectively (Figure S1). Consequently, we chose a
248 test concentration of $5 \mu\text{M}$ for all CADs, i.e. 2.8-fold above the IC_{50} and almost 10-fold
249 below the CC_{50} of amiodarone.

250 The ability to inhibit MARVpp entry in EA.hy926 differed widely within the set of CADs
251 tested (Figure 1a). Approximately 24 % of CADs showed antiviral activity (>40 %
252 inhibition), with strongest effects by dronedarone and triparanol (>80 % inhibition),
253 followed by >60 % inhibition of quinacrine, sertraline, amiodarone, perhexiline,
254 clomifene and N-desethylamiodarone. Notably, cytotoxicity measurement in EA.hy-
255 NLuc cells revealed that most CADs do not have major toxic effects on these cells.

256 However, treatment with dasatinib, quinacrine and sertraline showed a 42 %, 22 %
257 and 19 % reduction of viability, respectively (Figure 1b). Our results demonstrate that
258 antiviral activity is not a common feature of all CADs and independent of the drug
259 class.

260

261 **3.2 Determination of antiviral potency and safety of top and bottom CADs**

262 Next, we generated concentration-response curves for the six CADs that showed the
263 highest antiviral activity (dronedarone, triparanol, sertraline, amiodarone, perhexiline
264 and clomifene) (Figure S1) and for the six least antiviral CADs (propranolol,
265 tripeleennamin, amantadine, promazine, zimelidine and benzylamine) (Figure S2).
266 Quinacrine and dasatinib were excluded from further analyses due to their high
267 cytotoxicity (Figure 1). Likewise, teicoplanin was excluded because its high molecular
268 size and structural complexity would hamper the structure-function analysis. The
269 determined IC_{50} and CC_{50} values as well as the selective indices (SI) are
270 summarised in Table 2. We observed that strong antiviral CADs act in a micromolar
271 concentration with IC_{50} values between 1.3 μ M (dronedarone) and 2.9 μ M (sertraline)
272 and CC_{50} between 13.2 μ M (dronedarone) and 54 μ M (amiodarone). In contrast,
273 weakly active CADs in most cases did not allow for IC_{50} and CC_{50} calculation except
274 for propranolol (IC_{50} 64.6 μ M) and promazine (IC_{50} = 29.3 μ M and CC_{50} = 51.6 μ M).
275 Notably, we observed relatively narrow non-toxic activity windows, with the broadest
276 one for amiodarone (SI = 34), followed by clomifene (SI = 17), triparanol (SI = 13),
277 and dronedarone (SI = 10).

278

279 **3.3 Anti-MARVpp activity of CADs correlates with specific physico-chemical**
280 **properties and DIPL induction**

281 Next, we addressed the question whether strong antiviral activity of CADs was
282 associated with physico-chemical properties. Specifically, we correlated the CADs'
283 antiviral activity with their acidity (pK_a), hydrophobicity (ClogP), molecular weight
284 (MW) and the distance between hydrophilic amine and hydrophobic ring structure of
285 the molecules ('linker length') (Figure 2 a-d). The parameters pK_a , ClogP and MW
286 were obtained mainly from databases, whereas the linker length was calculated
287 according to the 3D structure of the molecules. Although we could not observe any
288 correlation between antiviral activity and linker length (Figure 2 d), we noticed a
289 modest yet insignificant ($R = -0.24$; $p = 0.11$) association of antiviral activity with
290 pK_a , showing that more alkaline CADs have higher antiviral activity (Figure 2 a). We
291 observed similar correlation with molecular weight ($R = -0.33$; $p = 0.02$) (Figure 2 c).
292 Most strikingly, we found a highly significant correlation between antiviral activity and
293 hydrophobicity ($R = -0.78$; $p < 0.0001$) (Figure 2 b). Although the majority of CADs is
294 rather hydrophobic ($1 < \text{ClogP} < 8$), all strong antiviral CADs had a octanol/water
295 partitioning coefficient larger than four ($\text{ClogP} > 4$). Taken together, CADs with
296 $\text{ClogP} > 4$ and $pK_a > 8$ are more likely to be antiviral.

297 Next, we analysed to what extent antiviral activity is associated with induction of DIPL
298 (Figure 3). Therefore, we treated EA.hy926 cells with 16 of the CADs at 5 μM or their
299 solvents, both in presence of LipidToxTM. The latter is a fluorophore-conjugated
300 phospholipid which permeates cellular membranes, but is believed to be complexed
301 in endosomes upon DIPL induction. The selected CADs were chosen for their varying
302 degrees of antiviral activity against MARVpp and comprised of ten more or less
303 active CADs and six inactive CADs – thus, we aimed to represent the full spectrum of
304 antiviral activity seen with CADs. We detected green fluorescence as a measure for
305 lysosomal accumulation of LipidToxTM, representing CAD-induced DIPL. Here, we
306 could not only show a highly significant correlation of MARVpp antiviral activity with

307 the degree of DIPL induction ($R = -0.81$; $p = 0.0001$) (Figure 3 a), but also significant
308 association of DIPL-induction and hydrophobicity of these compounds ($R = 0.73$;
309 $p = 0.0011$) (Figure 3 b). These findings underline the importance of hydrophobicity,
310 mediating both antiviral activity and DIPL of CADs. Furthermore they hint that DIPL
311 and antiviral activity might be more closely related than previously suggested.

312

313 **3.4 Selection of additional CADs based on our previous findings and validation** 314 **of their antiviral activity and cytotoxicity**

315 We observed that strong antiviral activity in CADs is associated with certain physico-
316 chemical features, yet antiviral CADs can vary widely in their scaffold structures. In
317 order to gain an insight how far the chemical structure and/or chemical properties
318 influence antiviral activity, we validated additional CADs that were identified by two
319 distinct approaches.

320 First, we tested whether compounds with comparable molecular structure
321 (derivatives) would have similar or even stronger antiviral effects than antiviral CADs.
322 Dronedarone-derivatives (N-Mesyldronedarone (D-1) and S-Desmethyl S-
323 Chloromethyl Dronedarone (D-2)) were obtained by a similarity search using
324 SciFinder®, a curated chemistry information database (27). We thus analysed their
325 antiviral activity against MARVpp gp-driven cell entry as well as their cytotoxicity in
326 comparison to dronedarone and solvent (Figure 4 a, b). We found 94 % and 91 %
327 inhibition for 5 μM D-1 and D-2, respectively. This is comparable to the antiviral effect
328 seen with dronedarone itself and suggests that the CAD structure may be important
329 for antiviral activity. Furthermore, we could show that these two compounds induce
330 DIPL similarly to dronedarone (Figure S4). In line with our previous observations, D-1
331 and D-2 have a basic pKa and are highly hydrophobic with ClogP-values of 8.6 and
332 9.2, respectively.

333 As a second approach, we looked for chemically similar, but structurally diverse
334 CADs (analogues) by chemically advanced template search (CATS) analysis (28).
335 CATS largely disregards structural similarities and considers only similar chemical
336 properties of compounds. As query substances, we submitted the seven most potent
337 CADs amiodarone, dronedarone, triparanol, sertraline, quinacrine, perhexiline and
338 clomifene. We found 33 new compounds that were identified as 'double hits' for
339 showing functional similarity to two unrelated seed CADs. As we were aiming for
340 putative antiviral candidates and in accordance with the observed importance of
341 hydrophobicity for antiviral effective CADs, we further narrowed the number of hits
342 down to compounds with ClogP > 4. By further selecting for diverse functional groups
343 we obtained a set of eight compounds and named them according to the two seed
344 compounds they derive from. We tested their antiviral activity against MARVpp as
345 wells as cytotoxicity (Figure 5 a, b) and found that the compounds CT1, CS3, AC1,
346 CS1, CS2 and QT1 decreased MARVpp entry (inhibition ranged from 17 % - 45 %).
347 Still, the newly identified compounds did not reach the level of inhibition seen with
348 their respective seed compounds.

349 **5. Discussion**

350 This study is to date the most comprehensive evaluation of both the distribution of
351 antiviral activity among different types of CADs as well as their antivirally relevant
352 physico-chemical properties. It reveals that: (1) Antiviral activity is not universal
353 among CADs, but limited to a minority. (2) Antiviral CADs come from a broad range
354 of pharmacological classes and have diverse molecular structures. (3) Certain
355 physico-chemical features are associated with antiviral activity, most notably
356 hydrophobicity. (4) There is a strong association between antiviral activity, the ability
357 to induce cellular phospholipidosis and hydrophobicity.

358 Previous studies showed that amiodarone, as well as its close relative dronedarone
359 act in low micromolar concentrations against pseudoparticles of different filovirus
360 species, GTOV and influenza H5N1. Furthermore, amiodarone was shown to inhibit
361 authentic EBOV, HCV, SARS and recently semliki forest virus, dengue virus, Sindbis
362 virus, Ross river virus, herpes simplex virus and the attenuated vaccine strain of
363 yellow fever virus. Conversely, ZIKV, HIV or vaccinia virus were not affected. (14, 15,
364 20, 22, 29–31) Triparanol was found to inhibit EBOV VLP as well as EBOV infection
365 and HCV replication (17, 32). Among a variety of other CADs, quinacrine, sertraline
366 and clomifene inhibited mainly EBOV VLPs, mouse-adapted EBOV and other
367 filovirus strains, including MARV (12, 33). To our knowledge, perhexiline has not
368 been investigated in the context of antivirals yet and was included in our study due to
369 reported association with DIPL (8). Furthermore, the amiodarone metabolite mono-N-
370 desethylamiodarone (MDEA) was shown to have additive effects with amiodarone
371 (30). With our results, we partially confirmed and extended the previous studies.
372 Notably, we could show that the drugs dronedarone and triparanol followed by
373 quinacrine, sertraline, amiodarone, perhexiline, clomifene and N-desethylamiodarone
374 have higher antiviral potential within the broad field of described CADs. Furthermore,
375 we show that candidates previously not associated with antiviral effects but only with
376 DIPL (e.g. perhexiline) may also be potent antivirals or templates for further drug
377 development. Experiments were performed in the endothelium/lung-hybrid cell line
378 EA.hy926 that is easy to cultivate and gives low background. Besides monocytes,
379 macrophages, endothelial cells, hepatocytes and fibroblasts, this cell line was shown
380 to be susceptible to several enveloped viruses including filoviruses (11, 13, 34, 35).
381 Concentration-response analyses showed that the six strongest CADs act at low
382 micromolar concentrations. The IC_{50} values for amiodarone and sertraline are
383 comparable to the reported plasma concentrations ($C_{max(amiodarone)} = 1.5 - 2.5$ mg/L

384 (2.2 – 3.7 $\mu\text{mol/L}$) and $C_{\text{max(sertraline)}} = 0.352 \mu\text{mol/L}$, which can accumulate up to 20-
385 fold in the liver (36–38). In case of dronedarone, the determined IC_{50} value is 10-fold
386 higher than the plasma concentration achieved in treatment of arrhythmia
387 ($C_{\text{max(dronedarone)}} = 84 - 147 \mu\text{g/L}$ (0.14 – 0.25 $\mu\text{mol/L}$)) (39). The selectivity index of
388 these CADs is relatively narrow *in vitro*. However, it may be worth to probe whether a
389 therapeutic window exists *in vivo*, which might be acceptable when dealing with a
390 severe or even life-threatening disease or in an outbreak setting triggered by emerging
391 enveloped viruses, given that they act against a range of viruses.

392 In a previous study, Shoemaker et al. identified six highly antiviral CADs among
393 various sterol pathway inhibitors. These CADs were characterized with a positively
394 charged amine group, alkaline pK_a (> 8.8), small MW, high hydrophobicity, and they
395 caused cholesterol accumulation (32). However, it is not known whether the previous
396 observations apply necessarily to all antivirally active CADs and which set of
397 structural features define antiviral activity. To understand the relationship between
398 CAD structure and antiviral activity we initially focused on a limited number of
399 properties including pK_a , ClogP , MW, and linker length. Hydrophobicity is an
400 important determinant of membrane permeability and bioavailability of a molecule,
401 and has been described as one of the key factors for ligand binding together with
402 molar refractivity and formal charge density (8, 40, 41). We could show that strongly
403 hydrophobic compounds have significantly stronger capacity to inhibit viral entry. The
404 reason for this observation is so far unclear, but it may suggest that CADs need to be
405 able to traverse membranes in order to exert their antiviral effect. Apart from the
406 CAD-determining amine and hydrophobic groups, we were not able to identify a set
407 of functional groups that is required for antiviral activity.

408 We further analysed CADs with either structural (derivatives) or functional
409 (analogues) similarity to strong antiviral CADs of our screen (28, 42). The fact that

410 only the derivatives, but none of the analogues reached the level of inhibition seen
411 with their respective seed compounds suggests that structural architecture seemed to
412 have more impact on the CADs activity than chemical properties only. Nevertheless,
413 the analogues' activity rate is far higher than the one obtained by screening random
414 collections. However, these data show that hydrophobicity alone is not a certain
415 predictor for antiviral activity, but rather a combination of chemical properties, which
416 is also suggested for DIPL-induction (43, 44). An extended multiparametric analysis
417 would be useful to identify a larger set of (interdependent) parameters that enable
418 and enhance activity (28).

419 In addition, our studies showed a strong association between CAD antiviral activity
420 and the ability to induce DIPL in target cells, i.e. lysosomal accumulation of charged
421 phospholipids, an effect that has been reported for many CADs (8, 45). DIPL shows
422 morphological resemblance of Niemann-Pick type C disease (NPC-1), an inherited
423 and generally fatal lipid-storage disorder, and similar diseases (8, 46). Amiodarone
424 preferentially accumulates in the lung, causes DIPL and is associated with lung
425 dysfunction (47). However, the CADs in clinical use have not been linked to
426 Niemann-Pick like symptoms and a clear general link between cellular DIPL and
427 organ toxicity has not been demonstrated. Moreover, tissue accumulation seems to
428 be reversible within a few days (48). Nevertheless, DIPL is considered a concern in
429 drug development. In our study, we found that DIPL strongly correlates with both
430 antiviral activity and with hydrophobicity. However, visible DIPL itself is not required
431 for antiviral activity of CADs since effects like EBOV VLP inhibition (32) or lysosomal
432 calcium flux changes (49) precede DIPL induction for hours. In conclusion, DIPL
433 induction seems to be more prominent among CADs with antiviral activity. In fact, in
434 our series all CADs with antiviral activity also induce DIPL to some extent. Yet, the

435 ability to induce DIPL is not the only determinant of antiviral activity, as some CADs
436 with similar DIPL values have quite different degrees of antiviral activity.
437 Filoviruses are late-penetrating viruses that are taken up into endosomes following
438 low-specificity interactions with one or more of various cell surface attachment factors
439 (34). Within the endosome, they undergo gp priming by low-pH dependent cathepsin
440 and interact with their endolysosomal receptor NPC1, a cholesterol transporter (50).
441 This enables membrane fusion, thereby releasing the nucleocapsid into the cytosol
442 (51, 52). It is conceivable that CADs modulate endosomal or endolysosomal
443 membranes or membrane-attached proteins in a manner that perturbs viral
444 penetration. Direct evidence or a clear concept of how this might occur is as yet
445 lacking. So far, it has not even been fully established whether CADs exert their
446 antiviral effects on the host cell or the viral particle. It has been reported for a group
447 of structurally diverse EBOV-inhibiting CADs – of which toremifen, bepridil, and
448 sertraline were tested in our study – that these compounds decrease the overall
449 stability of the GP1-GP2 dimers, thus inhibiting fusion (53, 54). Another recent study
450 described that the CAD flunarizine as well as the structurally similar fluphenazine,
451 trifluoperazine, chlorcyclizine and chlorpromazine seem to inhibit membrane fusion of
452 HCV particles by targeting a specific hydrophobic region in the E1 protein (16, 55).
453 Moreover, the antiviral spectrum of amiodarone, bepridil, amodiaquine and raloxifene
454 together with lipid mixing assays suggest that mostly late penetrating viruses and a
455 late entry step, most probably membrane fusion, are affected by these CADs (22).
456 However, given that we and others have described a range of structurally diverse
457 CADs as inhibitors of cell entry by different unrelated virus species it seems likely that
458 besides these virus-specific effects there is a shared mechanism common to diverse
459 CADs affecting a range of enveloped viruses. The correlation of antiviral effects and
460 early events of DIPL points towards a cell-based effect of CADs that takes place in

461 the endolysosomal compartment. Thus, we consider that the perturbation of late
462 endosomal homeostasis might be the underlying antiviral mechanism of CADs. The
463 clearer elucidation of the antiviral mechanism of some CADs is part of an ongoing
464 follow-up study.

465 In summary, we describe the most comprehensive evaluation to date of the antiviral
466 properties among CADs and show how antiviral activity is linked to structural
467 features. Most notably, we show that antiviral activity is strongly associated with
468 hydrophobicity and DIPL induction in target cells, corroborating previous studies (32).
469 Overall, our findings help clarify the structure-activity relationship of antiviral CADs.
470 Furthermore, using an *in silico* screening approach for identification of structurally
471 and functionally related compounds, we identified novel CADs with antiviral
472 properties. By showing that CAD-antiviral activity is partially fingerprinted on their
473 molecular architecture, we set a basis for the structure-based design of potent
474 antiviral CADs.

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476

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487 **7. Declaration of interests**

488 None.

489 **8. References**

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- 678

679 **Table 1: Cationic amphiphilic drugs included in single-point assay and their**
680 **properties.**

	Compound name	Drug class	pK _a	ClogP	Molecular weight [g/mol]
1	Fenfluramine HCl	Anorexic	10.22	3.36	267.72
2	Clemastine fumarate salt	Antiallergic	9.55	5.2	459.96

3	Perhexiline maleate salt	Antianginal	10.58	6.2	393.56
4	Bepidil HCl	Antianginal	9.16	5.49	403
5	Dronedaron HCl	Antiarrhythmic	9.08	5.28	593.22
6	Propranolol HCl	Antiarrhythmic	9.67	3.48	295.8
7	Verapamil HCl	Antiarrhythmic	9.68	5.04	491.06
8	Amiodarone HCl	Antiarrhythmic	8.47	7.64	681.77
9	Gentamicin sulfate	Antibiotic	10.18	-3.1	516.604
10	Teicoplanin	Antibiotic	7.1	-3.71	1879.7
11	Sertraline HCl	Antidepressant	9.85	5.1	342.69
12	N-Desethylamiodarone HCl solution	Antidepressant	9.4	6.27	653.72
13	Clomipramine HCl	Antidepressant	9.2	5.19	351.31
14	Fluoxetine HCl	Antidepressant	9.8	4.09	345.79
15	Imipramine HCl	Antidepressant	9.2	4.8	316.87
16	Maprotiline HCl	Antidepressant	10.54	5.1	313.86
17	Mianserin HCl	Antidepressant	6.92	3.52	300.83
18	Zimelidine Dihydrochloride	Antidepressant	8.62	3.39	390.15
19	Cyclizine HCl	Antiemetic	8.51	3	302.84
20	Amorolfine HCl	Antifungal	7.1	6.4	353.97
21	Terconazole	Antifungal	8.8	4.8	532.46
22	Thioridazine HCL	Antifungal	8.8	4.8	407.04
23	Promethazine HCl	Antihistaminic	9.05	4.81	320.88
24	Tripelennamine HCl	Antihistaminic	8.76	3.3	291.82
25	Chlorcyclizine	Antihistaminic	8	4.15	300.83
26	Quinacrine dihydrochloride	Antiprotozoal	10.33	5.5	472.88

27	Chloroquine salt	Diphosphate	Antiprotozoal	10.32	4.63	515.86
28	Promazine HCl		Antipsychotic	9.4	4.55	320.88
29	Clorpromazine HCl		Antipsychotic	9.35	5.41	355.33
30	Prochlorperazine salt	dimalate	Antipsychotic	8.39	4.88	606.09
31	Flupentixol dihydrochloride		Antipsychotic	8.51	4.51	507.44
32	Trifluoperazine HCl		Antipsychotic	8.39	5.03	480.42
33	Clozapine		Antipsychotic	7.35	3.23	326.82
34	Fluphenazine dihydrochloride		Antipsychotic	8.21	4.36	510.44
35	Amantadine HCl		Antiviral	10.71	2.53	187.71
36	Clomiphene citrate salt		Hormone analogue	9.31	6.47	598.08
37	Enclomiphene HCl		Hormone analogue	9.31	6.47	442.42
38	Ro 48-8071		Lipid lowering	8.8	5.7	448.4
39	Triparanol		Lipid lowering	9.6	6.7	438
40	W-5 HCl		Non-clinical	10.3	2.9	342.88
41	U18666A		Non-clinical	9.7	5.1	424.06
42	Benzylamine		Non-clinical	9.51	1.1	107.15
43	W-7		Non-clinical	10.3	3.8	377.33
44	Dasatinib		Antineoplastic	8.49	1.8	488.01
45	Toremifene Citrate salt		Antineoplastic	8.76	6.8	598.08

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685 **Table 2: Antiviral activity (IC₅₀) and toxicity (CC₅₀) as well as selective indices**686 **of top and bottom antiviral CADs.**

Antiviral effect	Compound name	IC ₅₀ [μM]	CC ₅₀ [μM]	SI
Top antiviral CADs	Dronedarone	1.3	13.2	10
	Triparanol	2.0	25.1	13
	Sertraline	2.9	18.7	6
	Amiodarone	1.6	54.0	34
	Perhexiline	2.4	13.8	6
	Clomifene	2.7	44.8	17
Bottom antiviral CADs	Promazine	29.3	51.6	2

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690 **Figure 1: Antiviral activity against MARVpp gp-driven cell entry and cytotoxicity**
691 **of 45 CADs.** (a) EA.hy926 target cells were transduced with MARVpp encoding an
692 NLuc reporter gene in a single-point approach in the presence of various CADs at 5
693 μM . Results were normalised to solvent control. (b) Cytotoxic and antiproliferative
694 effects were evaluated for CADs at 5 μM in EA.hy926 cells stably expressing NLuc.
695 Box-whiskers plots show the median, interquartile range and standard deviation of
696 $n=3$ independent experiments. Asterisks indicate statistical significance of differences
697 between compounds and solvent control that was calculated by One-way ANOVA
698 with correction for multiple comparisons. (* $p < 0.01$; ** $p < 0.001$; *** $p < 0.0001$)

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700 **Figure 2: Correlation of MARVpp antiviral activity of 45 CADs and their**
701 **physico-chemical properties.**

702 Residual transductoin of 45 CADs against MARVpp gp-driven cell entry of single-
703 point assays were normalised and the average of $n=3$ independent experiments was
704 correlated with (a) pK_a , (b) ClogP, (c) molecular weight and (d) linker length of all
705 tested CADs. The prototypical CAD amiodarone is labelled. Non-parametric
706 Spearman-correlation was computed and the correlation coefficient R and p-value
707 represent statistical significance (ns: $p > 0.12$; * $p < 0.03$; ** $p < 0.002$; *** $p < 0.0002$;
708 **** $p < 0.0001$).

709

710 **Figure 3: Correlation of MARVpp antiviral activity, DIPL induction and**
711 **hydrophobicity.**

712 (a) EA.hy926 cells were treated in triplicate with 16 different CADs at a 5 μM
713 concentration and the fluorescent phospholipid LipidTox™ Green (1:1). After 6 h
714 incubation, medium was exchanged and compounds (without LipidTox™) were

32

715 added again for extra 18 h. Fluorescence measured by FACS represents DIPL
716 induction by CADs. Delta mean fluorescence intensity (Δ MFI) was calculated by first
717 subtracting the average solvent control from single values. Averages of n=3
718 independent stainings were calculated and plotted against average antiviral activity.
719 (b) DIPL induction was correlated with ClogP of the investigated 16 CADs.
720 Correlation coefficients R were determined via Spearman-correlation (ns: $p > 0.12$;
721 * $p < 0.03$; ** $p < 0.002$; *** $p < 0.0002$; **** $p < 0.0001$).

722

723 **Figure 4: Antiviral activity and cytotoxicity of dronedarone structural**
724 **derivatives.**

725 Dronedarone-derivatives D-1 and D-2 were found by SciFinder® similarity search
726 and applied in a 5 μ M concentration (a) together with MARVpp on EA.hy926 cells or
727 (b) on EA.hy-NLuc cells for 6 h. Luciferase activity was determined after 72 h.p.t. and
728 triplicate values of n=3 independent experiments were normalised to solvent control.
729 Statistical difference was calculated by One-way ANOVA corrected for multiple
730 comparisons and is represented by asterisks (* $p < 0.01$; ** $p < 0.001$; *** $p < 0.0001$).

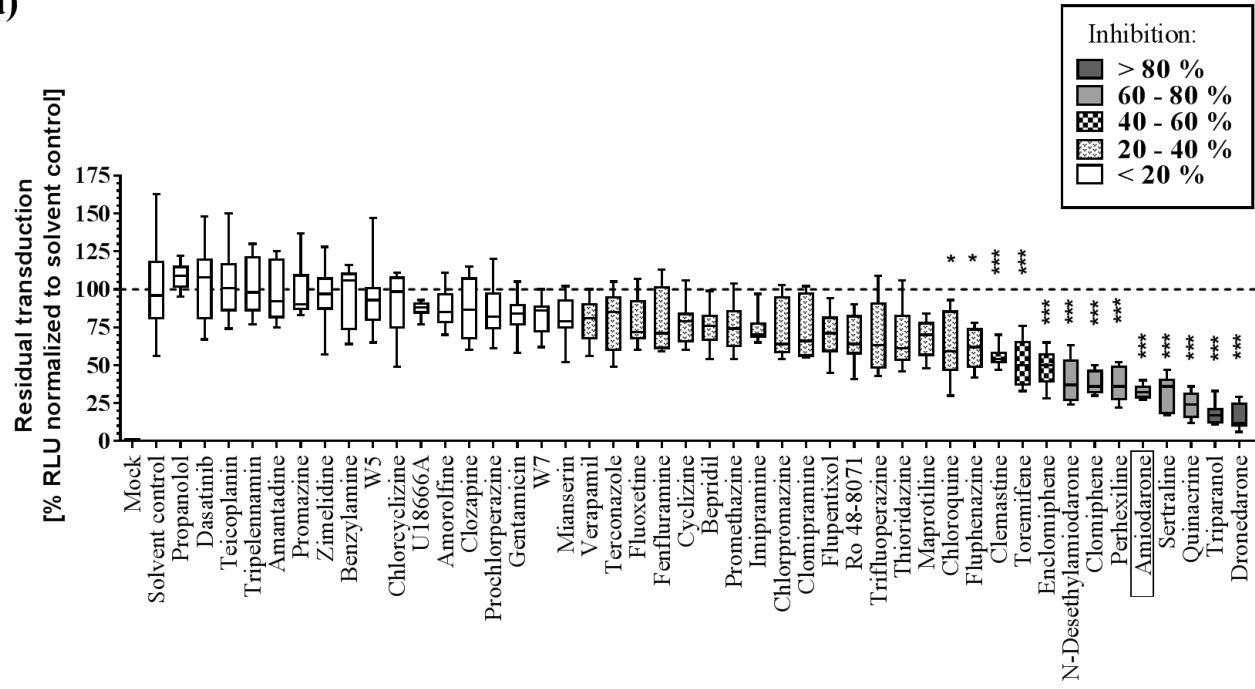
731

732 **Figure 5: Inhibition of MARVpp gp-mediated cell entry and cytotoxicity of**
733 **additional CADs identified by CATS analysis.**

734 New CADs were identified in a CATS-screen for compounds with similar chemical
735 properties to seed compounds. Eight double hits were chosen which fitted the
736 requirements of being a CAD, having diverse functional groups, and having ClogP
737 > 4 . In order to simplify compound nomenclature, new CADs were abbreviated
738 according to the initials of their two seed compounds. (a) For analysis of viral entry
739 inhibition, 5 μ M CADs were applied together with MARVpp on EA.hy926 cells and
740 luciferase activity was measured in transduced cells 72 h.p.t. (b) Cytotoxicity of new

741 CADs, seed compounds and solvent controls was measured in EA.hy-NLuc cells
742 treated with 5 μ M CADs for 6 h. Normalised results of n=3 experiments with three
743 technical replicates are shown and asterisks indicate statistical significance to solvent
744 control calculated by One-way ANOVA including multiple comparisons test. (*p<0.01;
745 **p<0.001;***p<0.0001)

(a)



(b)

