Abstract

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Accelerating antiviral drug discovery: lessons from COVID-19

Annette von Delft @^{1,2,11}, Matthew D. Hall @³, Ann D. Kwong⁴, Lisa A. Purcell @⁵, Kumar Singh Saikatendu⁶, Uli Schmitz⁷, John A. Tallarico⁸ & Alpha A. Lee^{9,10,11}

During the coronavirus disease 2019 (COVID-19) pandemic, a wave of Introduction rapid and collaborative drug discovery efforts took place in academia and industry, culminating in several therapeutics being discovered, approved and deployed in a 2-year time frame. This article summarizes the collective experience of several pharmaceutical companies and academic collaborations that were active in severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) antiviral discovery. We outline our opinions and experiences on key stages in the small-molecule drug discovery process: target selection, medicinal chemistry, antiviral assays, animal efficacy and attempts to pre-empt resistance. We propose strategies that could accelerate future efforts and argue that a key bottleneck is the lack of quality chemical probes around understudied viral targets, which would serve as a starting point for drug discovery. Considering the small size of the viral proteome, comprehensively building an arsenal of probes for proteins in viruses of pandemic concern is a worthwhile and tractable challenge for the community.

¹Centre for Medicines Discovery, Nuffield Department of Medicine, University of Oxford, Oxford, UK. ²Oxford Biomedical Research Centre, National Institute for Health Research, University of Oxford, Oxford, UK. ³National Center for Advancing Translational Sciences, National Institutes of Health, Rockville, MD, USA. ⁴Pardes Biosciences, Carlsbad, CA, USA. ⁵Vir Biotechnology, San Francisco, CA, USA. ⁶Drug Discovery Sciences, Takeda California, Inc., San Diego, CA, USA. ⁷Gilead Sciences, Inc., Foster City, CA, USA. ⁸Novartis Institutes for Biomedical Research, Cambridge, MA, USA. 9PostEra, Inc., Cambridge, MA, USA. 10Cavendish Laboratory, University of Cambridge, Cambridge, UK. "These authors contributed equally: Annette von Delft, Alpha A. Lee. 🖂 e-mail: Annette.vondelft@ cmd.ox.ac.uk; alpha.lee@postera.ai

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Introduction

Viral outbreaks are one of the gravest public health risks of our times, exemplified by the ongoing coronavirus disease 2019 (COVID-19) pandemic that has claimed more than 6 million lives. Several global trends make pandemics more likely in the future. Climate change coupled with wildlife destruction serve to increase human–animal interactions and the risk of zoonotic spillover^{1,2}. Warming temperatures also increase the geographical areas that are hospitable to viral vectors such as mosquitoes and ticks, potentially increasing the spread of arboviruses³. The prevalence of global travel can rapidly turn a local epidemic into a global pandemic⁴. As such, developing effective therapeutics against current and future pandemics should be a global public health priority.

Before the COVID-19 pandemic, the focus of antiviral development was on human immunodeficiency virus (HIV) and hepatitis C virus (HCV), accounting for more than 67% of approved antivirals⁵. The routine drug discovery and development timescale could be of the order of decades, especially for first-generation therapeutics against a virus. COVID-19 combined the attributes of an acute, severe and rapidly transmissible viral disease. For the first time, the translational science sector has successfully executed rapid drug discovery campaigns and developed novel antivirals amid a fast-moving pandemic. Within 2 years there were two oral therapeutics with emergency use authorization (EUA): nirmatrelvir (Pfizer) and molnupiravir (Merck; developed originally for Venezuelan equine encephalitis virus, VEEV). There were also several clinical stage investigational oral therapeutics, such as ensitrelvir (S-217622; Shionogi), pomotrelvir (PBI-0451; Pardes Biosciences), bemnifosbuvir (AT-527; ATEA) and EDP-235 (Enanta). In addition, remdesivir (Gilead Sciences; developed originally for Ebola), a small-molecule therapeutic delivered intravenously, was approved early on in the pandemic.

This Perspective draws from a round table discussion between biopharmaceutical companies and public sector organizations that have substantial research and development efforts in COVID-19. We outline key lessons from rapid antiviral drug discovery efforts, or 'sprints', and articulate remaining open questions, specifically focusing on target selection, medicinal chemistry strategies, in vitro and in vivo models, and methods to pre-empt resistance.

Target selection and validation

Antiviral therapeutics can be directed at the host or at the virus itself. Host-directed antivirals target human proteins that are essential in the viral life cycle. Significant effort has been expended in finding host-directed therapeutics against COVID-19 (refs. 6,7), most notably through numerous drug repurposing screens. Some of these agents went into clinical trials, through platform trials such as Accelerating COVID-19 Therapeutic Interventions and Vaccines (ACTIV) and Randomized Evaluation of COVID-19 Therapies (RECOVERY)⁸ as well as company-sponsored trials. Nonetheless, to date there is no approved host-directed antiviral therapeutic against COVID-19. It is argued that the advantages of a host-directed approach are a higher barrier to antiviral resistance and broad-spectrum activity if the target is used by multiple viruses⁹. Nonetheless, downsides include possible host pathway-mediated (on-target) toxicity, lower efficacy if the viral life cycle leverages multiple redundant targets and poor translation of in vivo models. Historically, the only successful host-directed antivirals have been interferon for HCV and hepatitis B virus (HBV), and CCR5 antagonists for HIV¹⁰, as well as cyclophilin inhibitors such as alisporivir (Debio-025) in late-stage clinical development for HCV¹¹. Most approved antivirals therefore directly target viral proteins, and

we focus on targets associated with severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2).

Before embarking on a drug discovery effort, target selection is crucial. The ideal antiviral target is essential for the viral life cycle (Fig. 1), has a tractable mechanism of action, can be inhibited by small molecules with drug-like pharmaceutical properties and has a high fitness barrier to mutation¹². We identify several key concepts that aid SARS-CoV-2 antiviral target selection (Table 1).

Validated mechanism of action

Antiviral targets with previous clinical validation demonstrating that target inhibition leads to antiviral effects have a lower translational risk. This is a high bar to meet, and these targets might not be rapidly available in an emerging pandemic setting. However, evidence from other viruses can help to provide confidence in the target when certain viral replication mechanisms are shared. We can establish 'target-class confidence' if there are multiple approved therapeutics against the same target class in multiple viruses. Ongoing efforts by the National Institute for Allergy and Infectious Diseases aim to define prototype and priority pathogens – key viruses in viral families of pandemic concern – and to develop therapeutics for them¹³.

In the absence of clinical validation, a target is more credible if its mechanism of action is understood and it has been demonstrated that ablating protein function directly impacts viral replication in vitro or in vivo. This can be achieved via chemical probes or a reverse genetics approach.

The indirect approach of inhibiting viral proteins that are responsible for evading host immune response is less common, due to the complex interplay between multiple viral proteins and the host immune response. Likewise, care must be taken in targeting steps in the life cycle such as viral entry, where multiple pathways for infections and cell-to-cell spread exist for some viruses.

Chemical probe validation

The goal of an antiviral therapy is the chemical inhibition of the target. As such, key questions are: whether there are sites on the protein that can be engaged by a small molecule (and therefore the target is 'druggable'); whether engaging these sites modulates protein function; and whether a chemical probe that modulates protein function also leads to viral inhibition in cellular assays.

Identifying small molecules that potently inhibit the target and have corresponding cellular antiviral activity, with changes in potency of inhibition translating to changes in antiviral activity (the structure-activity relationship), helps to build confidence that a target is validated and tractable. The availability of meaningful functional assays and linked structural data can greatly facilitate the development of chemical probes for previously untargeted viral proteins. In particular, advances in cryo-electron microscopy now allow elucidation of complex protein structures¹⁴⁻¹⁶. Although many chemical probes have been developed for human targets, fewer probes and structural data are available for viral targets.

Sequence conservation

In addition to direct clinical evidence or strong mechanistic evidence, the saliency of a target can be evaluated by assessing its conservation across the virus family or within circulating variants. Sequence and structural conservation can be evaluated across the entire protein or within the active binding site. Conserved targets are perceived as more robust because a target that is essential to the viral life cycle should

accumulate fewer mutations. Even if a mutationally flexible target is essential, it is harder to drug because the molecule would need to potently inhibit all variants. Targeting a conserved viral protein also increases the likelihood of developing a broad-spectrum antiviral, an important priority for pandemic preparedness.

Clinically validated targets

The SARS-CoV-2 genome encodes four structural proteins and two open-reading frame polyproteins. The polyproteins are cleaved by two cysteine proteases: the non-structural protein 5 (NSP5) main protease (M^{pro}), responsible for cleavage at 11 positions, and the NSP3

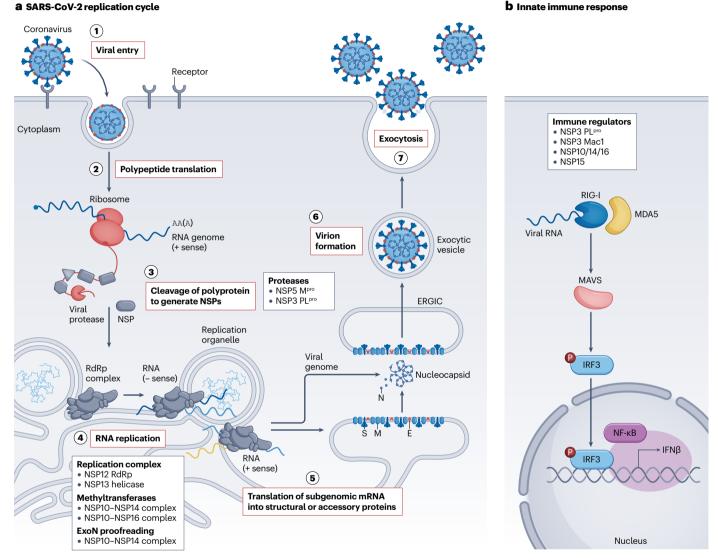


Fig. 1 | **Key targets in the SARS-CoV-2 replication cycle. a**, Stage 1: severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) enters the host cell upon binding to the extracellular receptors angiotensin-converting enzyme 2 (ACE2) and transmembrane protease serine 2 (TMPRSS2)¹¹⁹. Stage 2: following viral uncoating, the viral RNA is released and two large open reading frames (ORF1a and ORF1b) are translated into polyproteins. Stage 3: these polyproteins are co- and post-translationally processed by viral proteases into non-structural proteins (NSPs) that form the viral replication complex. Continuous cleavage of the polyprotein is required for sustained RNA synthesis, suggesting that formation of the replication complex is dynamic and occurs continually. Stage 4: the central enzyme of the replication complex is the RNA-dependent RNA polymerase (RdRp), which synthesizes viral RNA. Other enzymes such as the NSP13 helicase and the NSP14 *N*-methyltransferase contribute to initiation of replication, RNA unwinding, proofreading and sustaining RNA synthesis. Stage 5: genomic viral RNA is encapsulated by nucleocapsid protein (N), and viral

structural proteins translocate to the endoplasmic reticulum. Stage 6: structural proteins transit through the endoplasmic reticulum-to-Golgi intermediate compartment (ERGIC) to the Golgi for glycosylation and progression into exocytic vesicles. Encapsidated genomic RNA buds into the final virion, acquiring a lipid bilayer that contains structural proteins spike (S), membrane (M) and envelope (E). Stage 7: the virion is released from the infected cell by exocytosis. Key viral targets are listed in the boxes. **b**, As part of the innate immune response towards SARS-CoV-2 infection, the host's pattern recognition receptors such as proteins retinoic acid-inducible gene I (RIG-I) and melanoma differentiation-associated protein 5 (MDA5) recognize viral RNA and trigger downstream signalling cascades involving the mitochondrial antiviral signalling protein (MAVS), leading to activation of the IRF3 and nuclear factor-κB (NF-κB) transcription factors that induce interfere with components of the pathway. M^{pro}, main protease; P, phosphorylation; PL^{pro}, papain-like protease.

Target	NSP5 M ^{pro}	NS	P12 polyme	erase	NSP3 PL ^{pro}	NSP3 Mac1	NSP13 h	nelicase	NSP14 methyltra	Insferase	NSP15 endoribonuclease	NSP16 methyltransferase
Site	Catalytic site	Ectopic site	Catalytic site	NIRAN ADP site	Catalytic site	Catalytic site	ATPase site	Central channel	Catalytic site	ectopic site	Catalytic site	Catalytic site
Sequence conservation at 'pocketome' site (%) ^a	52	50	94	87	29	62	71	92	70	61	78	61
Chemical prob	e validatior	า						·				
Structural/ fragments/HTS data	1		1		1	1		1	•	/	1	1
Availability of chemical probes	1		1		1			1	~	/		
MoA validation												
Biological evidence (other viral families), MoA confirmed in vitro/in vivo	1		1					1			1	
Biological evidence (coronaviruses), MoA confirmed in vitro/in vivo	1		J		1							
Clinical evidence (other viral families)	1		J					1			1	
Clinical evidence (coronaviruses)	1		1				·					

Table 1 | Mechanism of action validation for selected SARS-CoV-2 targets

HTS, high-throughput sequencing; MoA, mechanism of action; M^{pro}, main protease; PL^{pro}, papain-like protease. ^aSequence conservation across 27 alphacoronaviruses and betacoronaviruses for selected severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) targets (data taken from ref. 38, which considered sequences up to 31 July 2020).

papain-like protease (PL^{pro}) with three cleavage positions (Fig. 1a). These cleavage steps liberate shorter viral proteins, such as the RNA-dependent RNA polymerase (RdRp) NSP12, that are crucial for viral replication and evasion of the host immune response. For example, M^{pro} directly cleaves NLRP12 and TAB1, two modulators of inflammatory pathways, which might point to a molecular mechanism for the enhanced production of cytokines and inflammatory response observed in patients with COVID-19 (ref. 17).

To date, the only oral SARS-CoV-2 therapeutics in clinical use or late-stage clinical trials target either the NSP5 M^{pro} or the NSP12 RdRp. Surveying the clinical and preclinical antiviral pipeline, we anticipate M^{pro} and RdRp to remain the most prevalent targeted proteins for the next 3–5 years.

The NSP5 Mpro

Numerous companies initiated programmes targeting M^{pro} early in the pandemic, and several SARS-CoV-2 M^{pro} inhibitors are now under EUA or in the clinical pipeline (Table 2). M^{pro} is an attractive target based on a rare confluence of factors. First, mechanistic understanding, because protease function in polyprotein processing is well-characterized and assayable given that inhibition of M^{pro} directly suppresses viral replication (as observed for M^{pro} in other viruses). Also, the rapid availability of M^{pro} structures facilitated structure-based drug design efforts^{18,19} (Fig. 2). Second, cysteine proteases are a well-characterized class of enzymes known to be druggable and to have amino acid sequence and cleavage specificity distinct from that of human cysteine proteases. Third, clinical precedent, given that multiple HIV and HCV protease inhibitors are in clinical use, and a human rhinovirus (HRV) protease inhibitor reduced viral titres in a phase II clinical trial²⁰. Fourth, chemical probe validation, with multiple SARS-CoV chemical probes targeting M^{pro} reported after the 2003 SARS-CoV epidemic in Asia^{21,22}. SARS-CoV and SARS-CoV-2 M^{pro} share 96% sequence similarity, therefore, some chemical probes were rapidly redeployed to SARS-CoV-2. For example, PF-00835231 was developed preclinically in response to the 2003 SARS-CoV pandemic, then shown to have activity against SARS-CoV-2 and rapidly entered clinical phase I trials in 2020 as an intravenous treatment (NCT04535167)^{23,24}. Upon the development of the orally bioavailable follow-up compound nirmatrelvir²⁵, no further clinical investigation of PF-00835231 was undertaken. In addition, studies on the norovirus 3C protease led to the development of GC376, a compound with good activity across norovirus, picornavirus and coronavirus families and efficacious in a cat coronavirus model^{26,27}.

The NSP12 RdRp

The replication of RNA viruses requires a mechanism to synthesize viral RNAs. The RdRp catalyses the replication of RNA from a RNA template, synthesizing a complementary RNA strand. Inhibiting the RdRp therefore inhibits viral replication. Similarly to M^{pro}, the catalytic subunit of the SARS-CoV-2 RdRp has been validated as a target for several reasons.

Compound name (company)	Hit-finding strategy	Starting point	Clinical candidate structure	HLM CL _{int} (µlmin ⁻¹ mg ⁻¹)	Rat CL _p (mlmin ⁻¹ kg ⁻¹)	Ratoral F (%)	SARS-CoV-2 antiviral activity (EC ₅₀ (nM))	Refs.
Main protease inhibitors	e inhibitors							
Nirmatrelvir (Pfizer)	Lead from historic SARS-CoV campaign			24.5	27.2	δ	62 (human airway epithelial cell)	87
(Shionogi)	Structure- based virtual screening and pharmaco- phore filtering			97% after 30 min of incubation	7.3	£	370 (Vero E6/ TMPRSS2, CPE)	8
Pomotrelvir (Pardes Biosciences)	Historic data from patents and docking across M ^{pro} structures	Undisclosed		Undisclosed	Undisclosed	Undisclosed	32 (WA1 strain, iPS-AT2, PFU)	205
Polymerase inhibitors	hibitors							
Remdesivir (Gilead Sciences)	An Ebola antiviral obtained from nucleoside library	HO OH NO OH	HO HO OH N HO OH N N N N N N N N N N N N	Undisclosed	Undisclosed	ix. drug	9.9 (human ai way epithelial cell)	251
Molnupiravir (Merck)	Designed as a VEEV antiviral	HO HO HO	HO N N N N N N N N N N N N N N N N N N N	Undisclosed	Undisclosed	52	670-2,660 (A549), 320- 2,030 (Vero E6)	252, 253

First, mechanistic understanding, as the structure and function of RdRp are well understood across RNA viruses. Second, there is clinical precedent, as multiple RdRp inhibitors are in clinical use or development for HIV, HCV, respiratory syncytial virus (RSV), influenza A and influenza B²⁸, increasing confidence in the coronavirus RdRp as a relevant target. Third, a wide range of RdRp inhibitors have been developed, allowing chemical probe validation. Some have been successfully deployed against SARS-CoV-2 infection, for example, remdesivir²⁹ and subsequently molnupiravir³⁰. In particular, remdesivir's broad-spectrum antiviral activity against coronaviruses was published before the SARS-CoV-2 pandemic^{31,32}, as well as its biochemical mechanism of action³³. Although both molecules engage the same target and require metabolic activation by the endogenous cellular machinery, once activated, the mechanisms of remdesivir and molnupiravir are different: remdesivir leads to delayed termination of RNA replication³⁴, whereas molnupiravir leads to mutated RNA products³⁵. Notably, other repositioned RdRp inhibitors such as favipiravir or sofosbuvir, albeit showing some antiviral activity in selected cellular assays, did not impact mortality and hospital admissions in SARS-CoV-2 clinical trials^{36,37}. Fourth, the sequence of the catalytic site of RdRp is broadly conserved across coronaviruses and variants of SARS-CoV-2 (ref. 38) (Table 1). Additionally, RdRps are not encoded by human cells, although inhibition of human RNA polymerases is a source of off-target toxicity for RdRp inhibitors³⁹.

Targets with chemical probe validation The NSP3 PL^{pro}

The NSP3 protease has a papain-like fold, and processes three cleavage sites in the N-terminal part of the polyproteins to produce mature NSP1, NSP2 and NSP3 (Fig. 1). The active site contains a typical protease catalytic triad, composed of Cys112–His273–Asp287. Apart from its essential role in viral replication, PL^{pro} cleaves ubiquitin, ISG15 and IRF3, which are known regulators of host innate immune pathways^{17,40}. Non-covalent inhibitors have been found against SARS-CoV⁴¹ and SARS-CoV-2 PL^{pro} (refs. 42–45), with PL^{pro} inhibition correlateing with cellular antiviral activity.

Targets with genetic evidence Viral replication

The NSP13 helicase. NSP13 is part of the RdRp replication complex and catalyses the unwinding of RNA in a 5' to 3' direction^{46,47}. It is also required for the proofreading and template switching functions of the replication complex^{48,49}. There is no reported chemical probe against any coronavirus helicase, although a crystallographic fragment screen suggested that it is a tractable target⁵⁰. Viral helicase inhibitors have been pursued for other infections; for example, amenamevir (ASP2151) is approved in Japan for treating the reactivation of varicella zoster virus (shingles)⁵¹, and pritelivir (BAY 57-1293) is in phase III clinical trials for herpes simplex virus (HSV; NCT03073967)^{52,53}.

Evading host immunity

Upon viral infection, viral components with conserved molecular motifs termed pathogen-associated molecular patterns (PAMPs) are recognized by the host's pattern recognition receptors (PRRs) to induce an antiviral innate immune response. Viruses subvert this innate immune response by targeting a range of signalling cascades such as Toll-like receptor signalling and intracellular signalling pathways via retinoic acid-inducible gene I (RIG-I) or melanoma differentiation-associated protein 5 (MDA5) (Fig. 1b).

The NSP3 macrodomain. As part of the innate immune response, host ADP-ribosyltransferases transfer ADP-ribose onto viral proteins, ultimately contributing to the suppression of viral replication. The viral macrodomain Mac1 from NSP3 counteracts this innate immune response by cleaving ADP-ribose already transferred onto viral proteins. Viral macrodomains are found in corona, alpha, rubi and herpes viruses^{54,55}, and macrodomain mutations disrupt catalytic activity and decrease virulence⁵⁶. To date, there is no reported Mac1 chemical probe with potent cellular antiviral activity, nor clinical evidence for inhibiting viral macrodomains. However, a crystallographic fragment screen revealed starting points for small-molecule inhibitor synthesis, therefore suggesting that Mac1 is tractable for small-molecule development^{54,57-59}.

The NSP14 and NSP16 methyltransferases. Methyltransferases catalyse the transfer of a methyl group from *S*-adenosylmethionine to RNA substrates. In complex with NSP10, NSP14 catalyses the N-methylation of guanosine, and NSP16 completes the formation of the RNA cap by 2'-O-methylation of viral mRNA ribose⁶⁰. The formation of the RNA cap prevents the recognition of viral RNA by host PRRs such as RIG-1, thereby subverting innate immune responses⁶¹. Recent structural biology has elucidated the mechanism of methyl transfer^{62,63}, and chemical probes targeting NSP14 have been reported^{64,65}. However, to date there is no evidence that chemical inhibition of NSP14 translates to an effect on cellular antiviral activity, nor clinical precedent for inhibition of viral methyltransferases. NSP14 also encodes an exoribonuclease activity that performs a proofreading function and antagonizes the innate immune response⁶⁶.

The NSP15 endonuclease. The NSP15 endonuclease is an RNA uridylate-specific endoribonuclease that is part of the EndoU family⁶⁷. Members of this enzyme family act on viral RNA that would activate the host innate immune response by cleaving 3' of uridylate and thereby generating a 2', 3' cyclic phosphate and 5'-hydroxyl termini⁶⁸⁻⁷¹.

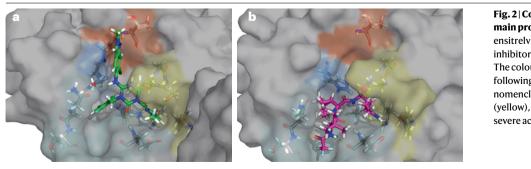


Fig. 2 | **Co-crystal structures of the SARS-CoV-2 main protease active site. a**, The inhibitor ensitrelvir (PDB: 7VU6) is bound¹⁸. **b**, The inhibitor nirmatrelvir (PDB: 7RFS) is bound²⁵. The colours indicate the various binding pockets following the standard Schechter and Berger nomenclature for proteases²⁵⁴: P1' (orange), P1 (yellow), P2 (blue) and P3–5 (cyan). SARS-CoV-2, severe acute respiratory syndrome coronavirus 2.

Nidoviral uridylate-specific endoribonucleases are highly conserved amongst the nidoviral families of *Coronaviridae*, *Areriviridae* and *Roniviridae*⁷². There are no chemical probes or approved therapeutics against coronavirus endonucleases, although a crystallographic fragment screen suggested that starting points for small-molecule inhibitor synthesis exist⁷³. An endonuclease from a different viral family has been targeted for influenza, in which an inhibitor of the cap-dependent endonuclease, baloxavir marboxil (Xofluza), has been in clinical use for several years⁷⁴. However, resistant viruses emerged in baloxavirtreated subjects at a frequency ranging from 3–11% in adults to more than 23% in children^{74,75}.

Medicinal chemistry

Once a target has been selected, medicinal chemistry is an iterative process of designing, making and testing molecules to progress chemical starting points into development candidates. Setting a realistic goal for the profile of a therapeutic is important when designing an appropriate medicinal chemistry strategy so that the final product has sufficient therapeutic value. These goals are typically divided into target product profile (TPP) or target candidate profile (TCP)⁷⁶. The TPP describes clinical attributes of a therapeutic, whereas the TCP describes the molecular attributes (such as target engagement, cellular antiviral response, safety pharmacology) that the molecule must fulfil. Here, we discuss the TPP as it informs the development of target-specific TCPs.

Target product profile

In an ideal antiviral drug discovery setting, the TPP for a directly acting antiviral aims for an orally available drug that is administered once daily or, for acute infection such as SARS-CoV-2, even once only (Table 3). In addition, a wide treatment window is desirable, to be relevant to patient populations with limited access to rapid diagnostics.

Yet, for an immediate pandemic response, many of these specifications are a luxury, and less stringent TPP requirements could be tolerated (Table 3). Considering the urgency of the situation and analysing the most vulnerable population, the following limitations alone or in combination might be acceptable for first-generation antiviral therapies. First, suboptimal dosing regimens of up to three or four times a day. Second, suboptimal delivery routes including intravenous formulations for selected high-risk patients. Albeit impractical for widespread treatment of early infection, the efficacious intravenous compound remdesivir (Veklury; Gilead Sciences) received EUA and then full FDA approval during the SARS-CoV-2 pandemic, and the first SARS-CoV-2 Mpro inhibitor entered clinical trials as an intravenous formulation²³. Third, a suboptimal distribution, metabolism and pharmacokinetic (DMPK) profile while ensuring that the trough concentration (Cmin) of the free drug determined in vivo remains above the protein-adjusted 90% effective concentration (EC₉₀) defined in cellular assays (Fig. 3). Continuous in vivo drug concentrations exceeding the EC₉₀ are generally considered to be the minimum to achieve antiviral efficacy⁷⁷, and higher trough concentrations might be desirable for second-generation antivirals once better understanding of resistance is established. Fourth, consideration of narrower patient cohorts and a willingness to monitor potential drug-drug interactions. Clinically manageable drug-drug interactions, co-dosing with pharmacokinetic enhancers or mechanisms of action precluding use in selected patient cohorts, such as in women of child-bearing potential, might be acceptable for selected high-risk patient cohorts in a pandemic. Fifth, acceptance of short therapeutic windows. For some viral therapeutics, such as oseltamivir

Table 3 | Example of target product profile for an acute viral infection

Target product profile	Pandemic response	Ideal therapeutic	
Route	Orally bioavailable	Orally bioavailable	
Dosing	Three times a day	Once, or once a day	
Dose	Up to 1g three times daily	<250 mg	
PK/PD	C _{min} >1×EC ₉₀ , unbound	Higher coverage, with high barriers to resistance	
Drug-drug interactions	Acceptable	No	
Co-dosing with PK enhancers	Acceptable	No	
Patient cohorts	Narrow cohort acceptable	Available to all (e.g., women of child-bearing age)	
Therapeutic window	Within 48h of infection	Extended up to 5 days	

 $C_{\rm min}$ trough concentration; EC $_{\rm go}$, 90% effective concentration; PD, pharmacodynamics; PK, pharmacokinetics.

for influenza, rapid treatment is required for antiviral efficacy⁷⁸. However, it can be challenging to prescribe and distribute a drug to a patient within 48 h of symptom onset, and it is preferable if antiviral therapy remains efficient if treatment is delayed for up to 5 days after symptom onset.

For SARS-CoV-2, there are several clinical observations that might require additional amendments to the TPP, such as biphasic viral kinetics, or 'rebounds' that have been observed in treated and untreated patients^{79,80}, and various chronic neurological, cardiovascular and gastrointestinal symptoms, known as post-acute COVID-19 syndrome (PACS) or colloquially 'long COVID'81,82. The aetiology of these observed symptoms is as yet unknown; several factors might be at play and have implications on the TPP. First, the free concentration of the drug may be insufficient to adequately suppress viral replication, therefore, aiming for a C_{\min} that covers multiples of the EC₉₀ might be required. Second, the viral kinetics might require longer treatment duration. Third, untargeted viral reservoirs might persist. In particular, the impact of SARS-CoV-2 infection on the central and peripheral nervous systems in the acute and chronic phases remains unclear^{83,84}, so a different tissue distribution profile might be desired in the TPP. Finally, for PACS, immune triggers might be clinically relevant and potentially require a host-directed approach beyond direct-acting antivirals.

Finally, the TPP might be refined to accommodate features relevant to compounds for pandemic preparedness and to increase the barrier to resistance. Compounds with an increased antiviral treatment spectrum, aiming to cover several viral strains from a viral family – or even across viral families – might be desirable. However, increasing the spectrum comes with medicinal chemistry challenges: a compound needs to achieve the (often conflicting) goals of simultaneously inhibiting proteins from related viruses, yet avoiding related host proteins and causing off-target effects.

Accelerating medicinal chemistry

The main drivers of an accelerated drug discovery effort during a pandemic are the upfront availability of high-quality chemical matter, the willingness to move at risk, a reconsideration of the essential attributes versus the ideal therapeutic profile to address the immediate unmet medical need, and the funding to do the work. More broadly, a sense

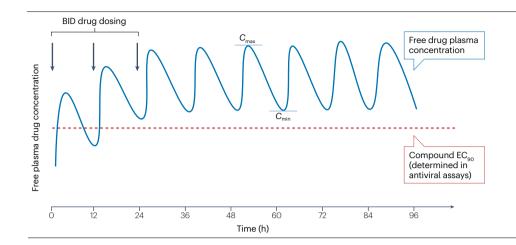


Fig. 3 | The pharmacokinetic profile of a hypothetical antiviral compound administered twice daily. The free (unbound) drug plasma concentration (blue) is depicted, including the maximum drug concentration (C_{max}) and minimum drug concentration (C_{min}) at steady state. The 90% effective concentration (EC₉₀; red dotted line), the concentration at which 90% inhibition of viral replication is observed in cellular antiviral assays, is corrected for plasma protein binding. BID, twice daily.

of organizational commitment and alignment with management is required to release significant financial investment at risk and execute fast, safe and rigorous campaigns.

Availability of high-quality chemical matter. Sir James Black, winner of the 1988 Nobel Prize in Physiology and Medicine, famously stated that "the most fruitful basis for the discovery of a new drug is to start with an old drug"85. One of the most pressing problems with antiviral drug discovery against a novel target is the availability of high-quality chemical matter. The only two approved RdRp-targeting antivirals, remdesivir and molnupiravir, were developed before the pandemic. Exceptionally rapid drug discovery efforts were executed against M^{pro}: nirmatrelvir, an example discussed above, was based on a peptidomimetic scaffold optimized for SARS-CoV in 2003, with low oral bioavailability supporting only intravenous dosing. The scaffold in turn shares structural similarity with rupintrivir, a HRV antiviral developed in the 1990s⁸⁶. Significant medicinal chemistry was required to optimize oral bioavailability, leading to the novel SARS-CoV-2 Mpro inhibitor nirmatrelvir²⁵. Another example is ensitrelvir, which is structurally different from nirmatrelvir¹⁸, but related to a P2X3 antagonist in the Shionogi clinical pipeline⁸⁷. These pockets of exceptional drug discovery appear to validate Sir James's adage, but also reflect the reality of preclinical drug development timelines. By leveraging pre-existing validated chemical matter, the timeline to first-in-human studies is dramatically shortened.

Looking ahead, for pandemic preparedness, we argue that a campaign to develop quality chemical probes and leads against targets in the viral proteome is a key opportunity for investment. Similar to efforts in systematically finding probes against human targets⁸⁸, it will be worthwhile for the scientific community to find chemical probes against every viral protein for the virus families most likely to produce the next pandemic. The viral proteome is orders of magnitude smaller than the human proteome, therefore, the level of investment required to execute such an effort is likely to be much less than the human and financial toll of a future pandemic.

Hit-finding technologies. A prerequisite of running a medicinal chemistry campaign is quality biochemical assays. This is often a chicken-and-egg problem – good-quality chemical probes help to validate an assay by generating the confluence of biophysical, biochemical, structural biology and antiviral efficacy data. Establishing a suite of high-throughput, orthogonal biochemical and cell-based assays around a target is one of the challenges of rapid drug discovery against novel viral targets. As viral targets are typically conserved, pre-emptively developing assays and making them available open source to the field should aid future drug discovery and pandemic preparedness efforts.

Several enabling technologies have been deployed successfully during the pandemic to accelerate finding hit compounds against numerous targets. Experimentally, crystallographic fragment screens have seen prolific successes against multiple targets. The confluence of high-throughput crystallography, an automated processing pipeline and expanded fragment libraries has delivered dense fragment hits against M^{pro} (ref. 89), Mac1 (ref. 54), the NSP13 helicase⁵⁰ and the NSP15 endonuclease⁷³. The latter three are novel targets with no pre-existing inhibitors. However, going from fragment to lead compound remains a challenge. Creative approaches such as the COVID Moonshot, which used crowdsourcing to generate ideas at the fragment-to-lead stage via fragment merging⁹⁰, have been attempted during the pandemic. The resulting lead is under preclinical development, although still some distance away from clinical evaluation¹⁹. Organizationally, several pharma companies in this round table have established shared hitfinding efforts, where blinded libraries of compounds were screened for M^{pro} biochemical activity.

Computationally, structure-based virtual screening yielded multiple successes. The discovery of S-217622 used structure-based virtual screening followed by pharmacophore filtering to generate novel noncovalent hits against M^{pro} (ref. 18). An unrelated effort similarly used virtual screening to discover novel chemotypes that led to potent M^{pro} inhibitors with broad-spectrum antiviral activity⁹¹. Beyond hit finding, free energy perturbation (FEP)-guided optimization was used to redesign the weak hit perampanel into a potent inhibitor⁹². However, successes in computational chemistry have so far been focused on M^{pro}, a target with well-developed inhibitors predating SARS-CoV-2; computational hit-finding campaigns against novel viral targets performed by members of this round table were less successful.

Late-stage drug development. Beyond the discovery stage, developing and executing process-scale chemistry for late-stage drug development, clinical trials and eventual market distribution require significant resources. A holistic view on chemistry timelines needs to be considered. For example, process-scale chemistry should be involved as soon as lead scaffolds emerge. This allows process development towards key building blocks or intermediates to commence before candidates are

declared, thus reducing the lead time. Concomitantly, the commercial availability of building blocks, and the scalability of synthetic routes, should be factored into the medicinal chemistry campaign.

Further, we argue that a crucial juncture for a drug discovery sprint campaign is when to commit to scaling up synthesis, and to what scale and quality. Conventional drug discovery usually takes a stage gate approach, with separate scale-up campaigns initiated once positive results from various preclinical toxicity experiments are available. This mitigates risk, as the compound can fail at each stage of the development process. However, to accelerate drug development during a pandemic, stage gates and milestones can lead to delays by preventing time-consuming activities being performed in parallel. The most successful sprints during the pandemic benefited from a large upfront investment to enable all chemical manufacturing stages in parallel, when the evidence for the drug candidate was still at the level of a cellular antiviral assay and early pharmacokinetics. In this case, resources for process chemistry and pilot plants also need to be reserved at an early stage. However, delays in the drug discovery campaign, or a negative read-out during the development process, can mean these expensive downstream resources become underused.

Ultimately, speed comes at a cost, in both cash expenditure and increased risk. If the aim is to impact an ongoing pandemic via a drug discovery sprint, we argue that the investment has to be provided upfront in its entirety. Piecemeal investments can lead to significant delays later in the process. This point is particularly poignant for public sector investments and grants for drug discovery, as excessive risk cannot be directly economically compensated.

Cell culture models

Cellular antiviral infection models are paramount to the identification of effective small-molecule inhibitors. A crucial part of the medicinal chemistry effort is to understand the variation in biological activity through a cellular assay as a function of chemical structures, which is only feasible with a low-variance system. Especially in the later phases of drug discovery campaigns, the throughput of a cellular assay is crucial and ideally matches chemical synthesis. Assay data are often used to strategically rank compounds, so comparing potencies of different compounds across assays should be avoided.

Many assays use pathogenic infectious viral strains and therefore need to be run in laboratories with higher containment capabilities (that is, biosafety level (BSL) 3, or BSL4). This complicates assay logistics and accessibility of relevant antiviral assays and ultimately impacts assay throughput. With these restrictions in mind, the round table agrees that reproducible antiviral cellular assays that can be run in a high-throughput set-up are much preferred over noisy and/or low-throughput assays, regardless of purported biological relevance. A crucial component of the ideal assay is tracking variance, robustness and reproducibility with statistical measures such as Z scores.

In antiviral drug discovery campaigns, cellular assays are generally grouped into high-throughput tier 1 and lower-throughput tier 2 assays (Fig. 4). Tier 1 cellular assays are reliable, straightforward and scalable 2D cell cultures infected with a SARS-CoV-2 strain. Efficacy of antiviral inhibitors is generally assessed by adding different concentrations of compound to the culture (either before or after infection), and viral replication is subsequently measured using various methods. In contrast, tier 2 cellular assays are often lower throughput and might use primary cells with a higher disease relevance.

A wide range of experimental parameters influence the use and scalability of cellular assays (Fig. 5), including the type of cell lines chosen, the infecting viral strain and the experimental read-out used. Modifications to these parameters can impact efficacy measurements and could contribute to the significant lab-to-lab variability reported in antiviral efficacy measurements. As drug discovery efforts rely on comparability of results over time, early assay optimization and consistent use of a fixed protocol within an established facility are essential to medicinal chemistry efforts and understanding of structure-activity relationships.

Common tier 1 cellular models

Several cell lines are routinely used to assess antiviral activity against SARS-CoV-2. Initially, many assays focused on the African green monkey cell line Vero E6, a cell line commonly used for antiviral assays and previously used for SARS-CoV replication⁹³. Vero E6 cells are very susceptible to SARS-CoV-2 viral infection and grow easily. However, nucleos(t)ide analogues often show decreased activity in these cells owing to inefficient metabolic activation compared with human cells⁹⁴. In addition, SARS-CoV-2 mutates rapidly in Vero E6 cell lines^{95,96}, often accumulating changes in the furin cleavage site of the spike protein, amongst others^{95,97,98}. Further, the high expression of functionally active P-glycoprotein (p-gp) efflux pumps can require the additional use of p-gp inhibitors to assess antiviral activity²⁵.

The non-small-cell lung cancer cell line Calu-3 is another commonly used line that supports SARS-CoV-2 replication⁹⁹, albeit at significantly lower levels than Vero E6 cells⁹⁴. Additionally, low growth rates and irregular growth patterns of Calu-3 cells have led to difficulties in scaling up and automating high-throughput assays. Other human cell lines in which SARS-CoV-2 replicates efficiently include the intestinal cell line Caco-2, in line with clinical manifestation of SARS-CoV-2 symptoms, and the liver cell line Huh7 (refs. 100,101).

Cell lines with overexpressed entry receptors

SARS-CoV-2 cellular entry occurs upon binding of its spike protein to angiotensin-converting enzyme 2 (ACE2) and transmembrane protease serine 2 (TMPRSS2) receptors⁷ (Fig. 1a). These entry receptors

Primary enzyme assay

 In vitro assessment of compound activity against the target Various high-throughput formats

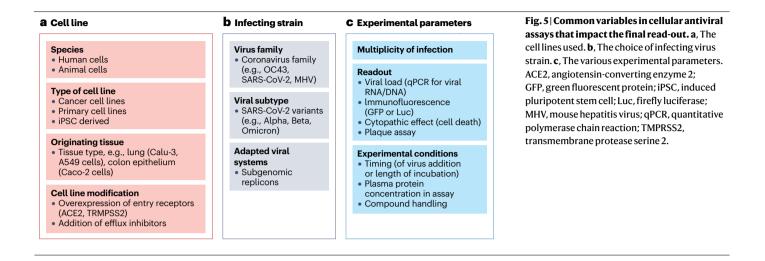
Tier 1 cellular assay

- Easy to run, reliable and scalable
- Suitable for high-throughput screening, including replicons
 Cell lines used for SARS-CoV-2 include VeroE6, A549-hACE2
- · Common read-outs include cytopathic effect or immunofluorescence

Tier 2 cellular assav

- Generally lower throughput, high variability
- Disease relevance (e.g., cell type)
- Primary cells used for SARS-CoV-2 include HAEC, iPSC-derived pneumocytes
- Variable read-outs include immunofluorescence and plaque assay

Fig. 4 | A typical cascade approach for antiviral screening. After the initial primary enzymatic assays, a high-throughput tier 1 cellular assay is used to drive medicinal chemistry, and a lower-throughput tier 2 assay is used to predict human dose. A549-hACE2, A549 cell line overexpressing human angiotensinconverting enzyme 2; HAEC, human airway epithelial cell; iPSC, induced pluripotent stem cell; SARS-CoV-2, severe acute respiratory syndrome coronavirus 2.



can be overexpressed to enable the use of cell lines with low physiological levels of ACE2 and TMPRSS2 that SARS-CoV-2 does not infect efficiently. For example, overexpression of human ACE2 (hACE2) or TMPRSS2 in the lung adenocarcinoma cell line A549 permits infection with SARS-CoV-2 (ref. 102). Additionally, culturing A549 cells in an air-liquid interface culture increases the endogenous expression levels of ACE2 and TMPRSS2 (ref. 103). Similarly, the overexpression of ACE2 on HeLa cervical cancer cells enables efficient SARS-CoV-2 entry¹⁰⁴, as previously shown for SARS-CoV¹⁰⁵. However, for the assessment of entry inhibitors, we recommend that cell lines with physiological levels of receptor expression are used, as over-expression can significantly alter antiviral activity and complicate the interpretation of results, as shown for SARS-CoV-2 monoclonal antibodies¹⁰⁶.

Common tier 2 primary cellular models

After a small set of optimized leads or a lead candidate are identified, compounds can be evaluated in more physiologically relevant tier 2 cellular assays. These cellular models include human airway epithelial cells, normal human bronchial epithelial cells or pneumocytes derived from induced pluripotent stem cells. Primary cells offer a more physiological immune system than cancer cell lines commonly used for tier 1 assays, which can be particularly relevant for assessing molecules that interact with the host immune response^{107–109}. In addition, primary cell models allow for a more translationally relevant understanding of drug uptake and cellular metabolism. In SARS-CoV-2 drug discovery efforts to date, data from both tier 1 and tier 2 cellular assays have been used for human dose predictions depending on availability^{18,110}.

However, primary cells are generally not used for screening compounds, as they are expensive, more difficult to culture and scale, and assays often show high variability. For example, human airway epithelial cells and normal human bronchial epithelial cells need to grow in an air-liquid interface with differential treatment on the basal and apical cell sides^{111,112}. In addition, the phenotype of primary cells can be maintained only for a short number of passages, which limits their utility for high-throughput assays¹¹³, as they can rapidly de-differentiate and adopt senescence phenotypes¹¹⁴. These limitations also apply for more complex cellular models such as bioprinted and 3D organoid models, which are not used for routine antiviral drug discovery¹¹⁵.

Choice of infecting strains

The choice of the infecting virus is another variable in setting up in vitro antiviral assays for drug discovery. Some viruses such as SARS-CoV-2 replicate readily in numerous human and animal cell lines, whereas replication of others such as HCV is a significant challenge¹¹⁶.

Based on previous knowledge from SARS-CoV, it was rapidly established that various clinical SARS-CoV-2 isolates readily infect a wide range of human and animal cell lines¹⁰¹. Significant variability in replication efficacy occurs for different SARS-CoV-2 strains, with Omicron demonstrating significantly longer replication cycles compared with wild-type SARS-CoV-2 and earlier variants of concern^{117,118}. In addition, differential dependency on entry receptors has been suggested, with SARS-CoV-2 Omicron BA.1 showing higher relative affinity for ACE2 whereas SARS-CoV-2 Delta depends on high levels of TMPRSS2 expression¹¹⁹. Therefore, it can be challenging to compare antiviral efficacy in cellular assays against multiple SARS-CoV-2 variants.

In addition to the variable pathogenicity of variants, SARS-CoV-2 can adapt to different cell lines by accumulating mutations upon viral passaging. These viral adaptations can render additional cell lines susceptible to the virus, such as liver cell lines (Huh7 and Huh7.5) and lung cancer lines (unmodified Calu-1 and A549)¹²⁰. In addition to naturally circulating viral strains, synthetically engineered viruses such as infectious cDNA clones and reporter viruses can be used in cell culture and optimized to express engineered molecular markers, facilitating high-throughput screening¹²¹⁻¹²³.

Non-infectious cellular models with replicons

Non-infectious subgenomic replicons can be used to connect enzymatic assays and cellular systems. Subgenomic replicons are artificially constructed RNA molecules that contain all the viral genome except genes that encode the structural proteins. They can replicate in cells, but are unable to infect other cells, thus are safer to operate and can often be handled in a BSL2 laboratory environment. Replicons enable a cell-based assay system to interrogate the fitness of different protein mutants, as well as to screen for potential antivirals. Historically, replicon systems have been crucial in drug discovery for viruses where cellular replication was difficult to achieve, such as HCV, or where laboratory handling is associated with significant health risks^{124–126}.

For SARS-CoV-2, several replicon systems have been reported. In principle, these are based on the deletion of selected viral proteins

(S, E and/or M proteins) and the addition of genes encoding firefly luciferase (Luc), green fluorescent protein (GFP) or other reporters¹²⁷⁻¹²⁹. SARS-CoV-2 replicons suitable for BSL2 environments rely on a variety of technologies, including transient reporter replicons¹³⁰, transcomplementation systems¹³¹ and attenuated viruses with deletions of viral accessory genes¹³².

However, replicons have limitations. They cannot be used to assess targets that are not included in the construct; interdependency of host and viral targets and immunological responses might not be modelled; and compounds optimized against a replicon might not show activity against wild-type virus, so should always be cross-checked during development. In addition, with increasing availability of high-throughput SARS-CoV-2 BSL3 screening facilities^{133,134}, the future importance of SARS-CoV-2 replicon systems as a screening option remains an open question.

Animal models

Various animal models for SARS-CoV-2 infection have been described in the NIH COVID-19 Open Data Portal and reviewed^{135,136}. Based on animal models for SARS-CoV^{137,138}, the ferret and^{139,140} hamster models^{141,142} that are susceptible to SARS-CoV-2 infection were rapidly deployed early in 2020. However, both models have significant logistical and financial overheads. More recent studies use mouse models, which are easier to deploy owing to their high accessibility, low cost, rapid breeding speed and ease of manipulation. Mouse models expressing specific SARS-CoV-2 entry receptors (for example K18-hACE2) and infected with wild-type virus143, or wild-type mice infected with mouse-adapted viral strains¹⁴⁴ have been frequently used. In addition, the acquisition of the 501Y mutation in variants of concern enables the infection of wild-type mice and other rodents, particularly aged animals, albeit at overall lower viral loads¹⁴⁵. Preclinical studies in non-human primates have been predictive of COVID vaccine outcomes in clinical efficacy studies¹⁴⁶, but are not routinely used in small-molecule drug discovery.

Similarly to human infections, animals infected with SARS-CoV-2 show major differences in viral load and pathology dependent on the infecting viral strain¹⁴⁷. Specifically, animal susceptibility appears to be linked to the affinity of the SARS-CoV-2 spike protein for the ACE2 receptors, with variant-specific spike substitutions such as N501Y, D614G and V367F affecting transmission in animals¹⁴⁶. Significant variant-specific differences in viral load distribution and disease pathology have been described¹⁴⁸⁻¹⁵¹, with lower viral loads and little weight loss observed for the Omicron variant compared with Delta in wild-type and hACE2transgenic Syrian hamsters¹⁵². These results are in line with clinical data suggesting that infectious viral load was lower in Omicron-infected individuals than in Delta-infected individuals^{153,154}. Overall, these differences in how variants infect both animals and humans are expected to delay defining effective animal models for every new variant of concern. Therefore, firmly establishing the translational relevance of an animal model might not be significantly less arduous than performing clinical studies in patients.

We assert that animal efficacy models should not be crucial for small-molecule antiviral discovery against SARS-CoV-2. Indeed, the first directly acting antivirals against SARS-CoV-2 were advanced solely on the basis of in vitro cellular data and projections for human drug exposure that exceeded the level sufficient for a pharmacodynamic effect. We therefore suggest that it is sufficient to define a cellular EC_{90} in a primary cell model and determine the human dose and dosing frequency that is required to remain above the cellular benchmark at all times (for example, the free fraction of the drug at C_{min} over EC_{90} for treatment duration). Although efficacy in animal models is a generally recommended (but not absolute) requirement for regulatory approval of human therapeutics, HIV and HCV antivirals have set a precedent for approval in the absence of animal models. However, animal models can offer reassurance on the mechanism of action during preclinical development, especially if investigated inhibitors can be shown to impact significantly on SARS-CoV-2 viral load and histopathological end points, and dose-related effects can be linked to unbound drug exposure^{25,94,155,156}.

Animal models should also have an important role in pandemic preparedness, particularly for diseases such as Ebola where a human phase IIa study is not possible if disease is not circulating at the time or human challenge models are not available^{157–159}. In these cases, animal efficacy in a relevant model, in combination with human pharmacokinetics and safety studies, might be sufficient for drug approval¹⁶⁰.

Despite potential differences in pathology between animal and human models, studies of infected animals might also provide insights into issues such as disease transmission and the impact of viral load on transmission¹¹², the effect of age and comorbidities on disease progression¹⁶¹, organ and brain involvement, vascular symptoms, secondary infections, 'long COVID'¹⁶² and immunological sequelae¹⁶³. However, for most of these presentations, the human pathogenicity remains unclear, and relevant animal models require further validation¹⁴⁶.

Human viral challenge models

Ultimately, the most relevant model to assess natural infection, viral load distribution and efficacy of antiviral inhibitors is a human viral challenge (HVC) model. This model enables viral load kinetics and viral shedding to be assessed in human healthy volunteers, with certainty of the time of infection and prospective assessment of symptoms¹⁶⁴.

HVCs have been used to assess the natural disease course of acute respiratory viruses, including RSV, influenza, HRV and most recently SARS-CoV-2 (refs. 165,166). Generally, the availability of 'rescue' treatments and upfront knowledge on potential human disease pathology and complications are paramount to the conduct of HVCs. Nevertheless, for novel human pathogens such as SARS-CoV-2 with incomplete understanding of long-term disease implications, complex ethical issues have to be carefully assessed before embarking on HVCs.

Potential confounding factors in HVCs are the typically short time frame between infection and the start of treatment, which can be precisely controlled in a HVC but is less controllable in natural infection, potentially leading to an overestimation of compound efficacy. The careful selection of healthy volunteers and regular sampling might also explain some of the differences noted between natural infection and HVC trials for SARS-CoV-2 and other respiratory viruses¹⁶⁶. For example, higher peak viral loads were measured for SARS-CoV-2 HVCs than for natural infection^{166,167}, and more common upper respiratory tract infections were noted in RSV HVCs, compared with more lower respiratory tract infections in natural infection¹⁶⁸. Overall, data generated in HVC studies can be highly variable dependent on the inoculation dose, the viral strain used and the immune profile and age of the healthy volunteers.

A key point at which HVCs can contribute to clinical decisionmaking is in determining treatment duration based on the evolution of viral load. This is enabled by assessing viral circulation clearance using regular viral load measurements after a standardized infection dose. The TPP, including the treatment duration, can then be specified, as exemplified for influenza infection¹⁶⁹. However, translation from efficacy in an HVC to natural infection is not certain: for rupintrivir,

Glossary

C_{\min}

The minimum or trough concentration of a drug in plasma over the treatment duration, with the free or unbound C_{min} defined as the minimum concentration multiplied by the percentage of compound unbound in plasma.

Crystallographic fragment screen

A sensitive biophysical technique for finding chemical motifs that can be expanded into leads and eventually drugs; protein crystals are soaked or grown at high concentrations with libraries of very small molecules (fragments, <250 Da) carefully selected to contain signatures present in drugs and ligands.

EC_{90}

The drug concentration at which 90% inhibition of viral replication is observed in cellular assays. Cellular assay medium can contain protein components such as fetal calf serum. To calculate the protein-adjusted EC₉₀ the EC₉₀ is multiplied by the percentage of unbound compound measured for the cellular assay medium.

Free drug

The concentration of the drug that is not bound to plasma, also termed unbound drug, as assessed by measuring the plasma protein binding in vitro. Typically only the free drug can act on its target in tissues and cause pharmacologyrelevant effects.

Pharmacokineticpharmacodynamic

(PK–PD). The relationship between pharmacokinetics (the concentration of drug in plasma or a tissue of interest) and the drug's therapeutic effect. In antiviral therapeutics, the PK–PD relationship required for an efficacious therapeutic is typically a free C_{min} greater than (at least 1×) the protein-adjusted EC₉₀.

Structure-activity relationship The relationship between the chemical structure of a molecule and its

Virtual screening

biological activity.

A computational technique used in drug discovery to identify chemical structures that are most likely to bind to a specific target.

an investigational protease inhibitor against HRV, efficacy in HVCs overestimated its utility in natural infection^{20,170}.

Pre-empting resistance

Resistance mutations can render an antiviral therapy inefficient. Viral mutations can occur spontaneously and are selected to preferentially replicate under immunological pressure or selection pressure exerted by drug therapy. Nonetheless, only mutants that are transmissible and cause adverse pathologies are of concern.

The likelihood of a virus developing mutations depends first on viral factors, such as how readily the virus mutates and whether it has a polymerase proofreading function. Second, it depends on host factors, including the patient's HLA type, immunosuppression and other disease or co-infection. Third, it depends on environmental factors such as whether antiviral treatment is given, the drug target, whether treatment is single or combination therapy or whether infection is acute or chronic. Drug-induced resistance has been observed across the spectrum of antiviral therapeutics and is largely independent of treatment duration; it has been reported after short courses for acute infection, such as with the influenza drugs oseltamivir¹⁷¹ and baloxavir¹⁷², as well as after longer treatment courses used for chronic viral infections¹⁷³.

Although the lower likelihood of viral drug resistance is commonly used as an argument for host-targeting antivirals, this is not necessarily a solution. For example, targeting cyclophilin with smallmolecule inhibitors resulted in amino acid substitutions in the HCV NS5a protein¹⁷⁴, and targeting CCR5 led to substitutions in the HIV gp120 protein^{175,176}.

We suggest that the essential strategies to circumvent druginduced resistance are to design compounds that sit tightly in the substrate binding site, to drive the free drug concentration as high as safely possible and to consider combination therapies. At the discovery stage for SARS-CoV-2 drugs, several approaches can pre-empt the development of resistance.

Selecting the target

A commonly used approach to identify viral targets that carry a low tolerance to resistance mutations is based on sequence conservation, with the assumption that highly conserved proteins are more likely to be essential and their alteration would be detrimental to viral replication^{38,177–179}. Various levels of sequence conservation can be considered, for example, across the *Coronaviridae* family, such as across alphacoronaviruses (including 229E and NL63), betacoronaviruses (SARS, SARS-CoV-2 and OC43), or within circulating variants of SARS-CoV-2. For certain conserved targets such as the polymerase, it is feasible to even consider targeting strategies across other viral families; for example, molnupiravir is active against *Filoviridae* (Ebola), *Togaviridae* (VEEV) and *Coronaviridae*¹⁸⁰.

Another approach entails the incorporation of data on resistance mutations identified through sequence surveillance in patients infected with SARS-CoV-2. This is particularly relevant if there is target-specific evidence of drug-induced resistance, as described for the early protease inhibitors developed for HIV and HCV. Of note, coronaviruses as a family accumulate fewer mutations than other RNA viruses such as HIV and HCV¹⁸¹, for which closely related mutant spectra, termed viral quasispecies, can be detected in each infected individual, due to the lack of RdRp proofreading function and the individual's immune response¹⁸²⁻¹⁸⁵. In contrast, coronaviruses have a unique error-correcting mechanism that was unknown among RNA viruses before its discovery in SARS-CoV¹⁵⁶. The NSP14 exoribonuclease excises nucleotides misincorporated by the low-fidelity RdRp and thereby lowers the replication error rate compared with other RNA viruses¹⁸⁷⁻¹⁸⁹.

When interpreting phylogenetic data and resistance mutations in treated patients, several caveats have to be taken into account. First, natural mutations occur without drug selection pressure and do not imply pre-existing drug resistance for a certain target. For example, baseline resistance-associated mutations do not predict treatment failure¹⁹⁰. Second, variants need to persist and remain transmissible to become relevant resistance-associated variants (RAVs). Viruses with resistance-associated mutations in their genome often have a fitness cost or growth disadvantage compared with the wild-type virus in the absence of selective pressure. Evolutionary competition between wild-type virus and mutants has been observed in patients (for example with HCV), where variants rapidly expand in the presence of selection pressure. However, once the drug is removed, the wild-type virus again outcompetes the RAVs¹⁹⁰. Nevertheless, several known druginduced variants are fit and transmissible, such as those in patients with influenza who are treated with neuraminidase inhibitors^{191,192} or capdependent endonuclease inhibitors¹⁹³⁻¹⁹⁵. Finally, mutations observed only under treatment do not per se imply drug-induced escape. This is particularly important when interpreting data from clinical case reports¹⁹⁶⁻¹⁹⁸. Large-scale clinical studies that sequence the whole viral genome and monitor viral load longitudinally across the treatment

duration are required to identify causative drug-induced mutations (for example, the PANORAMIC trial; EudraCT number: 2021-005748-31)¹⁹⁹. Even if the mutant is replication competent and persists, the impact on disease presentation and progression has to be assessed on a large scale.

Drugging the target

Strategic approaches to drugging the target can mitigate resistance development at the discovery stage. Members of our round table deploy structural biology to define regions of the target that should be robust to resistance, biochemical enzymatic assays to screen for antivirals that avoid resistance and cell culture systems to provide insight into resistance development.

Structural biology. A structure-based discovery approach allows the medicinal chemistry campaign to focus not only on maximizing protein–ligand interaction, but also on defining the region of the protein to target with chemical inhibitors. To circumvent viral resistance mutations from the start, the first consideration is to select the relevant sequence to crystallize. This is a pragmatic decision, as even single mutations can affect the propensity to form crystals, but it is also important for the analysis of resistance. Common approaches include selecting a wild-type sequence, a clinically relevant strain or a consensus sequence that comprises the most frequently occurring residues across variants.

The next consideration is whether to target the active site or an allosteric site. Our consensus is that it is preferable to directly target the enzyme active site, as allosteric inhibitors can have a lower barrier to resistance. For example, HCV NS5B polymerase has highly polymorphic allosteric sites, and non-nucleoside inhibitors targeting these sites were associated with a lower barrier to resistance compared with nucleoside inhibitors targeting the active site^{200,201}. In addition to targeting allosteric sites, targeting distal pockets of the active site can rapidly lead to resistance mutations during therapy, as shown for baloxavir, an inhibitor of the influenza cap-dependent endonuclease^{172,202}.

Another consideration is the concept that within the active site, a high barrier to resistance can be achieved by designing compact inhibitors that limit their binding to the substrate envelope. The substrate envelope is defined as the space spanned by a key set of residues that interact with diverse native substrate sequences^{203,204}. Any resistance mutations that occur within the substrate envelope are likely to cause a significant disruption to enzyme function and loss of viral fitness, whereas mutations outside the envelope incur significantly less fitness cost. The substrate envelope approach can be further refined by designing the inhibitor to interact predominantly with consensus residues within the substrate envelope that are shared across a viral family²⁰⁵.

This concept has been applied to HIV and HCV protease inhibitors^{206,207} and recently deployed in SARS-CoV-2 (ref. 208). For HIV, analysing structures of protein–ligand complexes for FDA-approved protease inhibitors revealed that contacts outside the substrate envelope correspond to the primary drug resistance mutation sites²⁰⁶. For SARS-CoV-2, the substrate envelope of M^{pro} was defined by crystallizing a library of substrate peptides bound to the native cleavage site²⁰⁸. Then, analysis of several protease inhibitors revealed that contacts mostly lie within the substrate binding envelope, although some parts of the molecules interact with residues outside the envelope. However, without comparative in vitro studies using M^{pro} inhibitors engaging different regions of the substrate envelope, or comprehensive sequencing data on patients treated with M^{pro} inhibitors, it is too early to tell whether these interactions will manifest as clinically observed resistance mutations.

Enzymology. The impact of selected resistance mutations on enzyme function can be defined experimentally, with saturation mutagenesis providing a more comprehensive assessment. For example, every amino acid in SARS-CoV-2 M^{pro} was mutated to reveal which mutations still resulted in a functional enzyme²⁰⁹. Reassuringly, the saturation mutagenesis approach showed that mutationally intolerant residues are also conserved across homologues. Mutationally intolerant sites were revealed at both the active site and the dimer interface, and at the allosteric communication network between these regions. However, further work is needed to interrogate the fitness of these mutant enzymes in authentic viral systems using reverse genetics. A similar mutagenesis approach has been successfully applied to predict clinically relevant patterns of resistance in bacterial β-lactamase^{210,211}.

In addition to assessing variants within SARS-CoV-2, further robustness to resistance can be engineered by designing inhibitors that are active against enzymes from different viruses within the same family. However, we have found that routinely screening compounds against a broad panel of enzymes as primary screens is laborious and expensive. An alternative approach could be to use enzyme engineering to design a 'consensus enzyme'^{212,213}, namely a single model enzyme that contains the most frequent residues across a viral family.

Ideally, as understanding of viral evolution increases, the screening cascade should include enzymatic assays of circulating variants or clinically observed drug-resistant mutations. However, in the context of a drug design campaign that races against an emerging and evolving pandemic, constantly moving goalposts by including new variants in the assay cascade is not feasible.

Beyond direct enzyme inhibition, we identify the degrader technology as another potentially viable way to overcome resistance. This approach exploits intracellular proteolysis to degrade the target protein. The paradigmatic example is proteolysis-targeting chimeras (PROTACs), which are heterobifunctional molecules in which one ligand binds to the target protein and the other ligand engages with an ubiguitin ligase, resulting in ubiquitylation of the target and subsequent degradation by the proteasome. Potential advantages of PROTACs are that lower-affinity binders can have a biological effect, as the target protein is irreversibly removed; degradation by PROTACs is catalytic, as the ligand is not consumed; and the pharmacodynamic efficacy is driven by the viral protein production rate and can extend beyond the detectable pharmacokinetic presence of the PROTAC molecule. The feasibility of a PROTAC approach has been explored for the HCV protease²¹⁴. The degrader paradigm has been extended to RNA degradation by using ligands that recruit a ribonuclease, and this approach has been applied to target SARS-CoV-2 RNA²¹⁵.

Cell culture systems. In addition to evaluating resistance mutations at the structural and enzymatic levels, viruses or replicons harbouring mutations can be propagated in cell culture to determine the effect of compounds. Modification of the previously described non-infectious replicon systems so that they contain resistance mutations is a nascent method in the SARS-CoV-2 field. However, for HCV, a large body of literature has elucidated mechanisms of resistant replicon formation against protease inhibitors^{216,217}, polymerase inhibitors^{218,219} and combinations²²⁰, as well as comparing the barrier of resistance of nucleoside and non-nucleoside inhibitors²²¹. Inhibitors can be designed to have a favourable profile against a panel of replicons harbouring mutations

from various viral genotypes, or against drug-resistant mutations observed after treatment with other inhibitors from the same class, as reported for HCV^{222,223}. Further, the replication efficiency of a replicon system can quantify the fitness cost of a mutation²¹⁶. Of note, mutations with efficient growth in a replicon may not be fit in vivo²²⁴, thus careful validation of in vitro–in vivo correlation and comparison with clinically observed mutations²²⁵ are required to elucidate the fitness cost of resistance.

Beyond replicons, cell culture systems with live virus can be used to model resistance development under drug pressure. A typical approach is serial passaging – subjecting the virus to low concentrations of the inhibitor over long periods of time, isolating and growing the surviving mutants, then re-exposing these to another cycle of inhibitor treatment. The number of cycles required for resistant mutants to emerge is a metric that assesses the barrier to resistance. The replicative fitness of the mutants can be quantified by measuring the growth rate of the mutant, as well as by cellular competition studies in which mutants are co-infected with wild-type virus. Further, sequencing of viral mutants can reveal residues that are susceptible to mutations in cell culture. In cases where the chemical compound is discovered phenotypically, serial passaging studies can help to elucidate the viral target^{226,227}. Viral passaging can be used during lead optimization, where the barrier to resistance can be used as an additional factor to select the lead series²²⁸. Overall, significant series-specific differences in the barrier to resistance are common, as different chemical series typically contact different sets of residues in the binding site. Passaging experiments using remdesivir in the SARS-CoV-2-related virus mouse hepatitis virus (MHV)²²⁹, and later for SARS-CoV-2 (refs. 230,231), revealed potential point mutations that could confer resistance. Viral passaging on MHV with the M^{pro} inhibitor nirmatrelvir was used to investigate the potential mutation sites accompanied by reduced nirmatrelvir sensitivity¹¹⁰. Additional mutations were reported for serial passaging using probe compound ALG-097161, leading to a combination of mutations that also confer resistance to nirmatrelvir in vitro²³². However, the relevance of these mutations detected in serial passaging experiments has to be independently verified by clinical trials. Furthermore, serial passaging studies of clinically approved inhibitors are contentious owing to the potential to select for resistant variants, which could impact biosecurity and public health. As such, funding agencies have put restrictions in place for such studies²³³.

Deploying the therapeutic. Strategic approaches to pre-empt resistance development can also be used at the clinical stage. For example, combination therapies that target multiple viral proteins have a lower likelihood of selecting for escape mutants^{234,235} and are commonly used in clinical settings for several viruses, including HIV and HCV. Only influenza and HSV have monotherapies in routine clinical use, and optimal treatment regimens for SARS-CoV-2 are still being explored. Further, it is likely that certain patient populations, such as immunosuppressed patients, might require combination therapy as they are more likely to harbour resistant viruses.

As a second approach, maintaining high drug concentrations (with C_{\min} of the free drug as high multiples of the EC₉₀) might lower the likelihood of inducing viral resistance. For SARS-CoV-2, the appropriate level of C_{\min} above the EC₉₀ is not yet clear, with early clinical data still emerging. The clinical strategy for nirmatrelvir and pomotrelvir^{236,237} is to select dosing that enables a C_{\min} greater than EC₉₀ for 90% of the patient population. For ensitrelvir, less stringent criteria of a C_{\min} greater than the half-maximal effective concentration (EC₅₀) were reported for animal efficacy¹⁸. We argue that during a drug discovery sprint, a pragmatic approach is required, driving the medicinal chemistry campaigns to optimize EC_{90} and drug exposure, while recognizing that the pharmacokinetic-pharmacodynamic (PK-PD) relationship might be a point of product differentiation between the ideal and pandemic TPP (Table 3).

Concluding remarks

The exigencies of the COVID-19 pandemic have spurred a wave of rapid drug discovery campaigns. In less than 2 years, several antivirals were discovered, clinically evaluated and approved. We have summarized key scientific drivers and considerations behind these sprint discovery campaigns and how knowledge from previous antiviral drug discovery campaigns was fruitfully deployed. Beyond scientific approaches, the broader organizational context has enabled rapid discovery, outlining future directions for the community.

We find that a common strand underlying many campaigns is the optimism among the project team and support from all levels. Planning and executing future steps assuming that previous experiments will be successful, while also having a mitigating plan in place in case of failure, is crucial to moving quickly. Further, upfront investment is needed to move rapidly. In the fast-moving research environment of a pandemic, it remains an open question how public sector funding, traditionally more risk-averse, can rapidly enable drug discovery.

Another fruitful experiment during the pandemic was the unprecedentedly collaborative philosophy across biopharmaceutical companies, nucleating public–private partnerships such as IMI CARE, close-knit consortia of companies, and even completely open science consortia with company participation¹⁹. Further, the rapid implementation of clinical trial networks, such as ACTIV⁸, RECOVERY (NCT04381936)²³⁸ and PANORAMIC (EudraCT number: 2021-005748-31), has greatly contributed to the accelerated assessment of potential COVID-19 therapies. The unique severity of the pandemic created the strong impetus for these collaborations. The successes of these projects can inspire more openness and collaboration in the biopharmaceutical industry, and we believe commercial organizations should be more willing to work quickly and collaboratively during global emergencies.

Furthermore, the pandemic has been exceptional for fast-moving and rigorous regulatory emergency review and approval, with agencies establishing rapid response mechanisms as early as May 2020 (refs. 239,240). Regulatory agencies have outlined more efficient processes to give rapid feedback on supporting data, with the aim to enable clinical trials and provide upfront definitions of clinical end points²⁴¹. We argue that in view of the rapidly changing clinical picture - with increasing natural immunity and vaccination rates, as well as variable pathogenicity of circulating strains - a regular review of acceptable clinical trial end points should be conducted. End points initially used for small-molecule clinical trials in COVID-19, such as mortality and hospitalization rate, are now considered too low in frequency to support reasonably sized clinical trials. Instead, additional primary end points such as viral replication could be considered. These are easier to standardize than symptom-related end points and are considered acceptable for other viral diseases such as HIV and HCV infections²⁴²⁻²⁴⁴. In particular, viral kinetic data from human challenge trials, not immediately available at the start of the pandemic, could feed into defining alternative end points.

Ultimately, a successful drug discovery campaign is contingent upon selecting and drugging the right protein target. We note that

mechanism-free repurposing has been widely attempted during the COVID-19 pandemic, but has failed to deliver therapeutics²⁴⁵, with early positive results partly due to confounding factors such as phospholipidosis²⁴⁶. This is perhaps not surprising, as most therapeutics and chemical compound libraries are optimized for human targets, which are generally dissimilar to viral targets.

Therefore, we conclude with a call to arms on pandemic preparedness. A responsive mode to antiviral drug discovery, even armed with modern technology, is too slow to prevent the significant human and economic catastrophe of a fast-moving pandemic – it took a decade to offer a therapeutic for HIV and about 2 years for COVID. With significant funding in place, for example, the decision by the NIH to allocate \$577 million to fund nine Antiviral Drug Discovery (AViDD) Centers for Pathogens of Pandemic Concern²⁴⁷, the question becomes how do we best nucleate a concerted effort for pandemic preparedness?

One strategy is to systematically target the viral proteome. Of the 16 non-structural proteins and four structural proteins in SARS-CoV-2, only three have validated chemical probes. Once these existing targets are drugged and resistance inevitably emerges, we will need to uncover new viable viral targets, new mechanisms of action, or judicious combinations of therapeutics with no cross-resistance. Another related strategy is open dissemination of tools such as assay protocols, building on successful precedents for human targets such as the RAS initiative²⁴⁸ and the Structural Genomics Consortium²⁴⁹. Focused efforts should be invested in ensuring that the myriad of assays developed, and resulting data, are disseminated with good data management practices, to ensure 'Findability, Accessibility, Interoperability and Reusability'²⁵⁰.

Considering the broad toll of a pandemic, we argue that public sector investment should be put into systematically developing chemical probes and focused libraries against proteins in viruses of pandemic concern. Concerted funding should be in place to push chemical matter against promising targets into early clinical development, so that it can enter phase II clinical trials when a pandemic of the same viral family strikes. This is even more pressing for other viruses of pandemic concern, such as Dengue and Zika, which are endemic in the Global South and currently lacking effective therapeutics. Therefore, a global health angle to drug discovery and development is acutely needed to alleviate significant unmet medical need.

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Author contributions

All authors researched data for the article and contributed substantially to discussion of the content. A.v.D. and A.A.L. wrote the article. All authors reviewed and edited the manuscript before submission.

Competing interests

All authors and/or their employers are involved in COVID drug discovery or development programmes, and may continue to be involved in future programmes. These programmes may lead to the generation of intellectual property for their respective employers, and may contribute to past, present or future revenue of their respective employees. M.D.H. is an employee of NCATS, A.K. is an employee of Pardes Biosciences, L.A.P. is an employee of Vir Biotechnology, K.S.S. is an employee of Takeda California, Inc., U.S. is an employee of Gilead Sciences, J.A.T. is an employee of Novartis Institutes for Biomedical Research, A.v.D. is an employee of CAYS, and CSO for PostEra, Inc. A.A.L. is an employee of Cambridge University and CSO for PostEra, Inc.

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