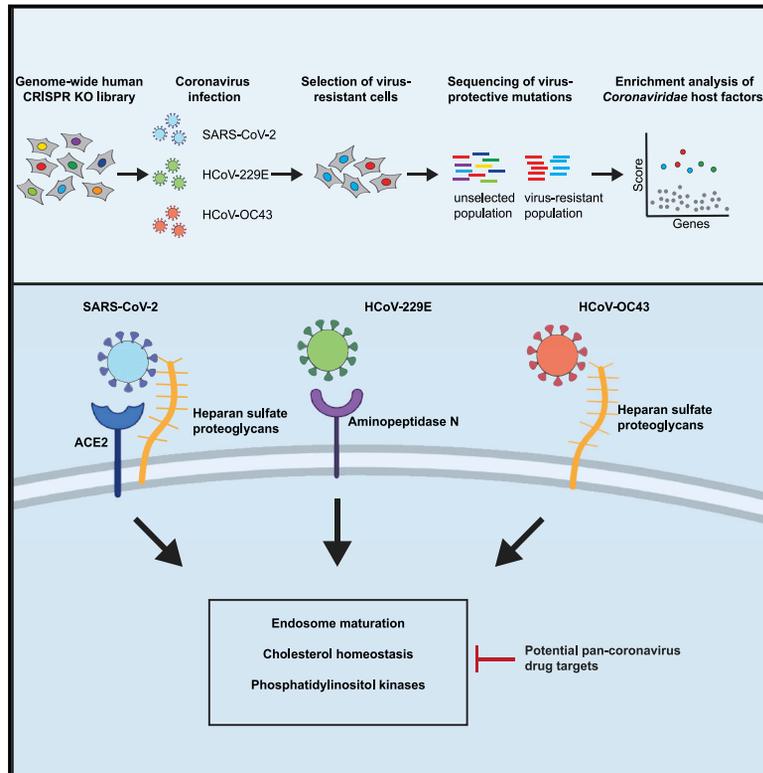


Genetic Screens Identify Host Factors for SARS-CoV-2 and Common Cold Coronaviruses

Graphical Abstract



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In Brief

To identify host factors required for the infection with SARS-CoV-2 and the common cold coronaviruses OC43 and 229E, Wang et al. conduct genome-wide CRISPR knockout screens. In addition to virus-specific entry factors, they uncover shared host pathways, including cholesterol homeostasis and phosphatidylinositol kinases, required for the infection with all three viruses and demonstrate that pharmacological inhibition of these pathways exhibits pan-coronavirus antiviral activity.

Highlights

- Genome-wide CRISPR screens for SARS-CoV-2, HCoV-229E, and HCoV-OC43 host factors
- Screens correctly identified divergent entry factors for the three coronaviruses
- Cholesterol and phosphatidylinositol pathways are shared host dependency factors
- Pharmacological inhibition of host factors reduces coronavirus replication



Article

Genetic Screens Identify Host Factors for SARS-CoV-2 and Common Cold Coronaviruses

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<https://doi.org/10.1016/j.cell.2020.12.004>

SUMMARY

The *Coronaviridae* are a family of viruses that cause disease in humans ranging from mild respiratory infection to potentially lethal acute respiratory distress syndrome. Finding host factors common to multiple coronaviruses could facilitate the development of therapies to combat current and future coronavirus pandemics. Here, we conducted genome-wide CRISPR screens in cells infected by SARS-CoV-2 as well as two seasonally circulating common cold coronaviruses, OC43 and 229E. This approach correctly identified the distinct viral entry factors ACE2 (for SARS-CoV-2), aminopeptidase N (for 229E), and glycosaminoglycans (for OC43). Additionally, we identified phosphatidylinositol phosphate biosynthesis and cholesterol homeostasis as critical host pathways supporting infection by all three coronaviruses. By contrast, the lysosomal protein TMEM106B appeared unique to SARS-CoV-2 infection. Pharmacological inhibition of phosphatidylinositol kinases and cholesterol homeostasis reduced replication of all three coronaviruses. These findings offer important insights for the understanding of the coronavirus life cycle and the development of host-directed therapies.

INTRODUCTION

The *Coronaviridae* family includes seven known human pathogens for which there are no approved vaccines and only limited therapeutic options. The seasonally circulating human coronaviruses (HCoV) OC43, HKU1, 229E, and NL63 cause mild, common cold-like respiratory infections in humans (van der Hoek, 2007). However, three highly pathogenic coronaviruses emerged in the last two decades, highlighting the pandemic potential of this viral family (Drosten et al., 2003; Wu et al., 2020; Zaki et al., 2012). Infection with severe acute respiratory syndrome coronavirus 1 (SARS-CoV-1) and Middle East respiratory syndrome coronavirus (MERS-CoV) can lead to acute respiratory distress syndrome and death, with fatality rates between 10%–

40% (Petersen et al., 2020). SARS-CoV-2, though less deadly, is far more transmissible than SARS-CoV-1 and MERS-CoV and has been responsible for over 50 million cases and 1.2 million deaths globally as of November 2020 (Dong et al., 2020; Petersen et al., 2020). Because of the severity of their impact on global health, it is critical to understand how SARS-CoV-2 and other coronaviruses hijack the host cell machinery during infection and apply this knowledge to develop new therapeutic strategies.

Coronaviruses are enveloped, positive-sense single-stranded RNA viruses with a genome length of approximately 30 kb. Upon receptor binding and membrane fusion, the viral RNA is released into the cytoplasm, where it is translated to produce viral proteins. Subsequently, the viral replication/transcription



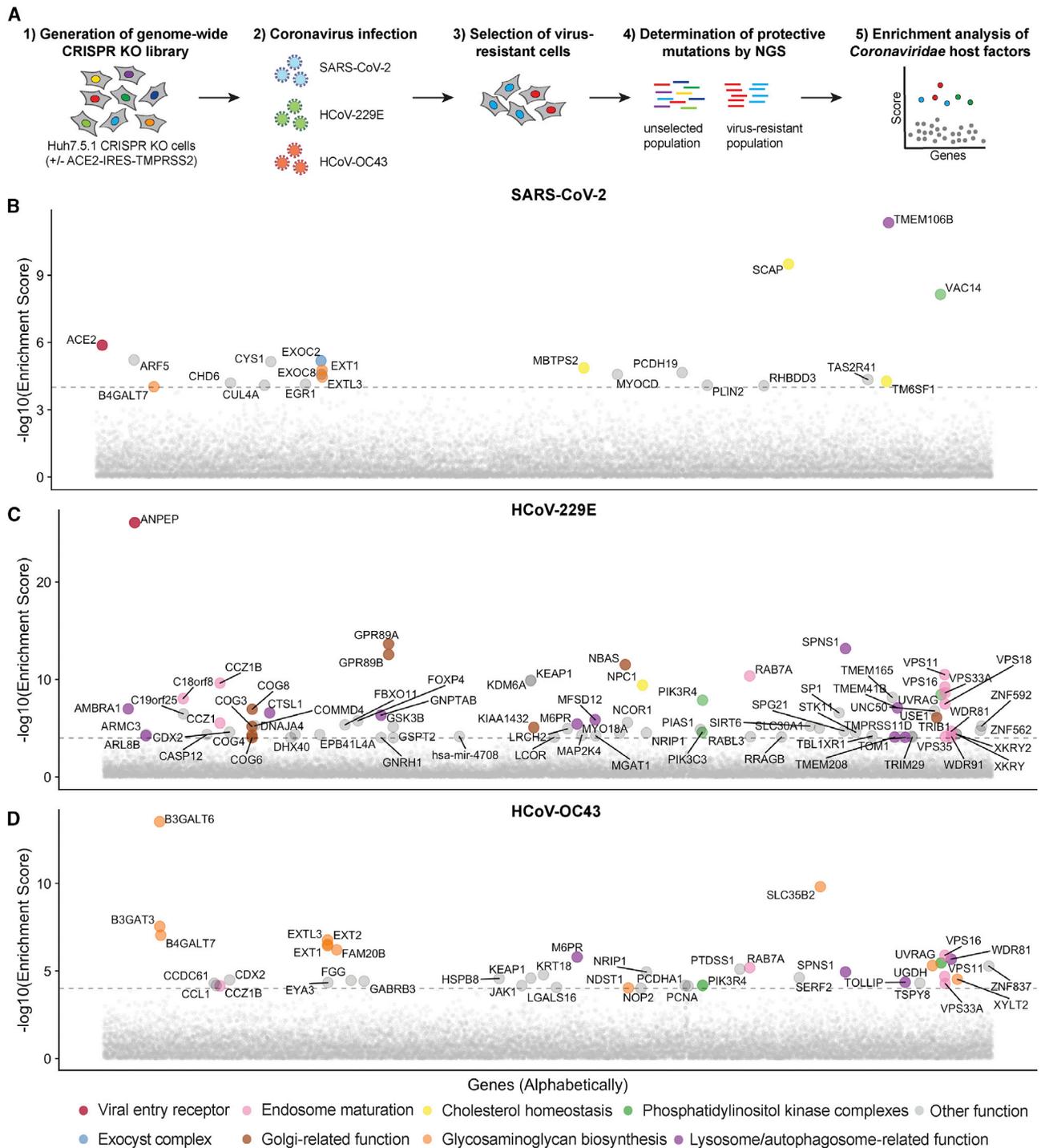


Figure 1. Genome-wide Loss-of-Function Screens in Human Cells Identify Host Factors Important for Infection by SARS-CoV-2, 229E, and OC43

(A) Schematic of CRISPR-based KO screens for the identification of coronavirus host factors. Huh7.5.1-Cas9 (with bicistronic ACE2-IRES-TMPRSS2 construct for SARS-CoV-2 and without for 229E and OC43 screen) were mutagenized using a genome-wide single-guide RNA (sgRNA) library. Mutant cells were infected with each coronavirus separately and virus-resistant cells were harvested 10–14 days post infection (dpi). The abundance of each sgRNA in the starting and selected population was determined by high-throughput sequencing and a gene enrichment analysis was performed.

(legend continued on next page)

complexes form on double-membrane vesicles and generate genome copies. These are then packaged into new virions via a budding process, through which they acquire the viral envelope, and the resulting virions are released from infected cells (Fung and Liu, 2019). During these steps, specific cellular proteins are hijacked and play crucial roles in the viral life cycle. For example, the angiotensin-converting enzyme 2 (ACE2) is exploited as the viral entry receptor for NL63, SARS-CoV-1, and SARS-CoV-2 (Hofmann et al., 2005; Letko et al., 2020; Li et al., 2003). Additionally, cellular proteases, such as TMPRSS2, cathepsin L, and furin, are important for the cleavage of the viral spike (S) protein of several coronaviruses thereby mediating efficient membrane fusion with host cells (Bertram et al., 2013; Hoffmann et al., 2020b; 2020c; Shirato et al., 2013; Simmons et al., 2005). Systematic studies have illuminated virus-host interactions during the later steps of the viral life cycle. For example, proteomics approaches revealed comprehensive interactomes between individual coronavirus proteins and cellular proteins (Gordon et al., 2020a; 2020b; Stukalov et al., 2020). Additionally, biotin labeling identified candidate host factors based on their proximity to coronavirus replicase complexes (V'kovski et al., 2019). While these studies uncovered physical relationships between viral and cellular proteins, they do not provide immediate information about the importance of these host components for viral replication.

An orthogonal strategy is to screen for mutations that render host cells resistant to viral infection using CRISPR-based mutagenesis. These screens identify host factors that are functionally required for viral infection and could be targets for host-directed therapies (Puschnik et al., 2017). In this study, we have performed a genome-wide CRISPR knockout (KO) screen using SARS-CoV-2 (USA/WA-1 isolate) in human cells. Importantly, we expanded our functional genomics approach to distantly related *Coronaviridae* members in order to probe for commonalities and differences across the family. This strategy can reveal potential pan-coronavirus host factors and thus illuminate targets for antiviral therapy to combat the current and potential future outbreaks. We conducted comparative CRISPR screens for SARS-CoV-2 and two seasonally circulating common cold coronaviruses, OC43 and 229E. Our results corroborate previously implicated host pathways, uncover new aspects of virus-host interaction, and identify targets for host-directed antiviral treatment.

RESULTS

CRISPR KO Screens Identify Common and Virus-Specific Candidate Host Factors for Coronavirus Infection

Phenotypic selection of virus-resistant cells in a pooled CRISPR KO screen is based on survival and growth differences of mutant cells upon virus infection. We chose Huh7.5.1 hepatoma cells as

they were uniquely susceptible to all tested coronaviruses. We readily observed drastic cytopathic effect during OC43 and 229E infection (Figure S1A). Huh7.5.1 also supported SARS-CoV-2 replication but exhibited limited virus-induced cell death (Figures S1B and S1C). To improve the selection conditions for the SARS-CoV-2 CRISPR screen, we overexpressed ACE2 and/or TMPRSS2, which are present at low levels in wild-type (WT) Huh7.5.1 cells (Figure S1D). This led to increased viral uptake of a SARS-CoV-2 S-pseudotyped lentivirus, confirming the important function of ACE2 and TMPRSS2 for SARS-CoV-2 entry (Figure S1E). We ultimately used Huh7.5.1 cells harboring a bicistronic ACE2-IRES-TMPRSS2 construct for the SARS-CoV-2 screen as these cells sustained efficient infection that led to widespread cell death while still allowing the survival of a small number of cells (Figures S1C and S1F). The generated CRISPR KO libraries in Huh7.5.1 and Huh7.5.1-ACE2-IRES-TMPRSS2 cells had virtually complete single-guide RNA (sgRNA) representation prior to the start of the virus challenge but, as expected, were depleted of cells containing sgRNAs against commonly essential fitness genes within 7 days post-library transduction (Figures S1G and S1H) (Hart et al., 2015).

The three CRISPR screens—for resistance to SARS-CoV-2, 229E, and OC43—identified a compendium of critical host factors across the human genome (Figure 1A; Table S1). The overall performance of the screens was robust as indicated by the enrichment of multiple individual sgRNAs against the top 10 scoring genes from each screen (Figure S1I). Importantly, the known viral entry receptors ranked among the top hits: ACE2 for SARS-CoV-2 and aminopeptidase N (ANPEP) for 229E (Figures 1B and 1C) (Letko et al., 2020; Yeager et al., 1992). OC43, unlike the other coronaviruses, does not have a known proteinaceous receptor but primarily depends on sialic acid or glycosaminoglycans for cell entry (Hulswit et al., 2019; Ströh and Stehle, 2014); consistent with this fact, multiple heparan sulfate biosynthetic genes (*B3GALT6*, *B3GAT3*, *B4GALT7*, *EXT1*, *EXT2*, *EXTL3*, *FAM20B*, *NDST1*, *SLC35B2*, *UGDH*, *XYLT2*) were identified in our OC43 screen (Figures 1D and S2A). Several of these genes were also markedly enriched in the SARS-CoV-2 screen (Figures 1B and S2A), which is consistent with a recent report that SARS-CoV-2 requires both ACE2 and cellular heparan sulfate for efficient infection (Clausen et al., 2020). Overall, the identification of the expected entry factors validates the phenotypic selection of our host factor screens.

Gene Ontology (GO) enrichment analysis for each screen found a number of cellular processes to be important for multiple coronaviruses. These processes included proteoglycan and aminoglycan biosynthesis, vacuolar and lysosomal transport, autophagy, Golgi vesicle transport, and phosphatidylinositol metabolic processes (Figure 2A; Table S2).

In the phosphatidylinositol metabolic process, the SARS-CoV-2 screen identified *VAC14*, which is part of the PIKfyve kinase complex (Figure 1B). *PIKfyve* itself was moderately enriched

(B) Gene enrichment for CRISPR screen of SARS-CoV-2 infection. Enrichment scores were determined by MaGECK analysis and genes were colored by biological function. Dotted line indicates $-\log_{10}(\text{Enrichment Score}) = 4$. The SARS-CoV-2 screen was performed once. All genes and their enrichment scores can be found in Table S1.

(C) Gene enrichment for CRISPR screen of 229E infection. The 229E screen was performed twice and combined MaGECK scores are displayed.

(D) Gene enrichment for CRISPR screen of OC43 infection. The OC43 screen was performed twice and combined MaGECK scores are displayed.

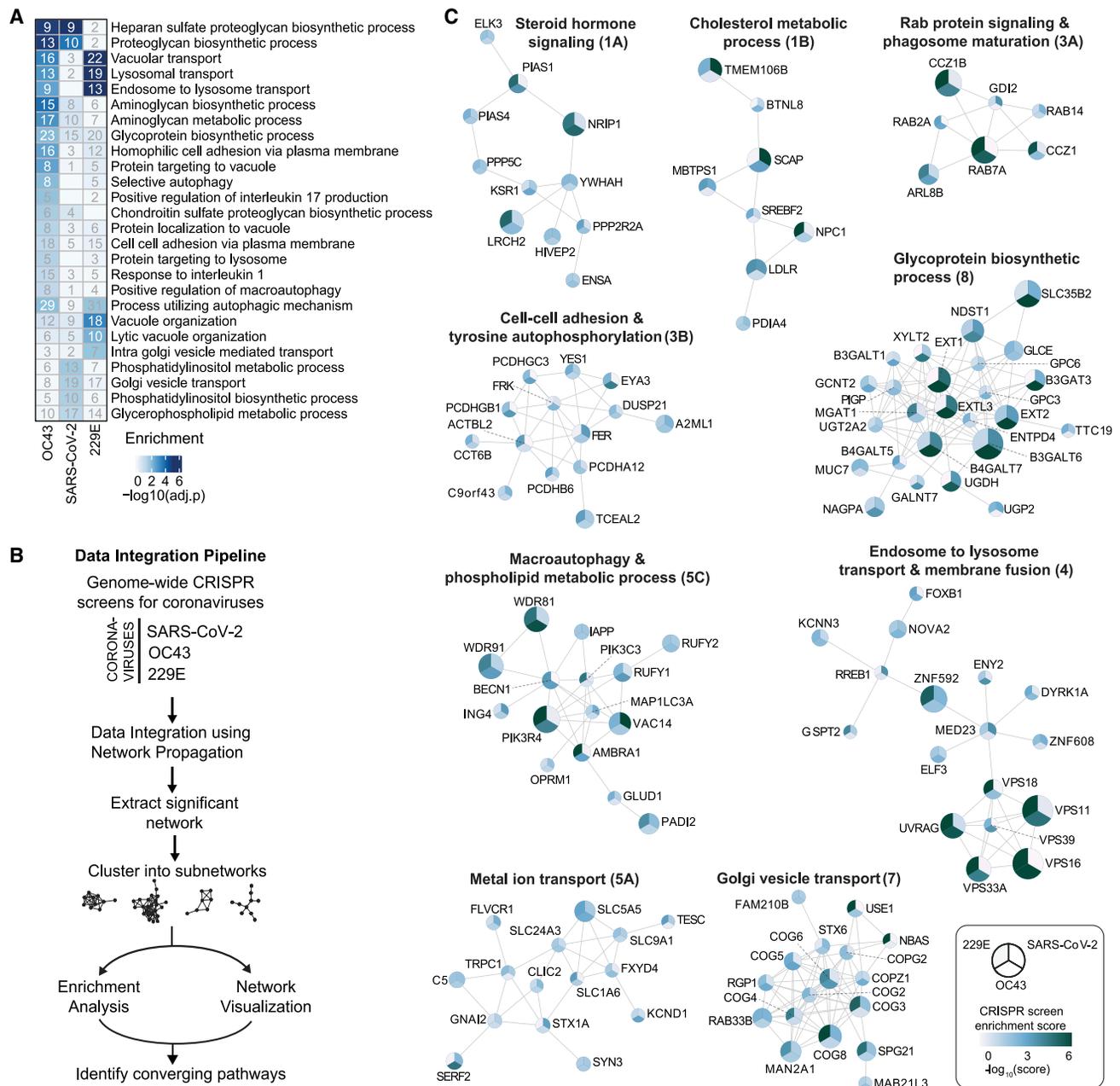


Figure 2. Gene Ontology Analysis and Network Propagation Highlight Pathways and Biological Networks Important for Coronavirus Infection

(A) Gene Ontology (GO) enrichment analysis was performed on significant hits from the individual CRISPR screens (MaGEEK enrichment score ≤ 0.005). p values were calculated by hypergeometric test and a false discovery rate was used to account for multiple hypothesis testing. The top GO terms of each screen were selected for visualization. A complete list of significant GO terms can be found in [Table S2](#).

(B) Data integration pipeline for network propagation of identified host factor genes. Unthresholded CRISPR screen enrichment scores served as initial gene labels for network propagation using Pathway Commons. Separately propagated networks were integrated gene-wise (via multiplication) to identify biological networks that are shared between all three datasets. Genes found to be significant in the propagation were extracted, clustered into smaller subnetworks, and annotated using GO enrichment analysis (see [STAR Methods](#)).

(C) Selected biological subnetwork clusters from network propagation. Cluster title indicates the most significant biological function(s) for each cluster. Circle size represents p value from network propagation permutation test (see [STAR Methods](#) and [Table S3](#)). The original enrichment score of a gene in each CRISPR screen is indicated by color scale within the circle. The entire set of identified clusters is displayed in [Figure S3A](#). (#) is the cluster number, which refers to the GO enrichment analysis of biological processes in [Figure S3B](#) and [Table S2](#).

in the SARS-CoV-2 screen (Figure S2A). This complex catalyzes the conversion of phosphatidylinositol-3-phosphate to phosphatidylinositol-3,5-bisphosphate, which is localized to late endosomes (Shisheva, 2012). Interestingly, the CRISPR screens with 229E and OC43 identified the subunits (*PIK3C3*, *UVRAG*, *BECN1*, and *PIK3R4*) of the class III phosphatidylinositol 3-kinase (PI3K) complex, which generates the precursor phosphatidylinositol-3-phosphate in early endosome membranes (Figures 1C, 1D, and S2A) (Bilanges et al., 2019). Taken together, our data highlight different steps of the phosphatidylinositol biosynthetic pathway, which regulates endocytic sorting, endomembrane homeostasis, and autophagy, to be critical for the life cycle of all three and possibly all coronaviruses.

Another group of genes found in all three CRISPR screens is linked to cholesterol metabolism. The SARS-CoV-2-resistant cell population contained multiple KO of genes in the sterol regulatory element-binding protein (SREBP) pathway (*SCAP*, *MBTPS1*, *MBTPS2*) (Figures 1B and S2A) (Brown et al., 2018). *SCAP* is an escort protein for the transport of the transcription factors *SREBF1* and *SREBF2* from the ER to the Golgi in response to low levels of cholesterol. In the Golgi, the *SREBF* proteins are sequentially cleaved by the proteases *MBTPS1* and *MBTPS2*. Subsequently, the transcription factors translocate to the nucleus to activate fatty acid and cholesterol biosynthesis. *SREBF1* and *SREBF2* themselves did not score in the screen, potentially due to their functional redundancy. *LDLR* (low density lipoprotein receptor), important for cholesterol uptake, was enriched in both the SARS-CoV-2 and the 229E screen, while *SCAP* was also enriched in the OC43 screen (Figures S2A and S2B). Additionally, *NPC1* (Niemann-Pick intracellular cholesterol transporter 1), which facilitates export of cholesterol from the endolysosomal compartment, ranked highly in the 229E screen (Figure 1C) (Höglinger et al., 2019). Overall, our data indicate a strong link between intracellular cholesterol levels and infection by all three coronaviruses.

Some genes were found in the OC43 and 229E screens but not in the SARS-CoV-2 screen. For instance, the common cold coronavirus screens showed a strong overlap of genes that are important for endosome and autophagosome maturation (Figures 1C, 1D, and S2B). These include *RAB7A*, components of the HOPS complex (encoded by *VPS11*, *VPS16*, *VPS18*, *VPS33A*), the Ccz1-Mon1 guanosine exchange factor complex (encoded by *CCZ1*, *CCZ1B*, *C18orf8*), genes expressing the WDR81-WDR91 complex, and other genes related to lysosome and autophagosome function (*SPNS1*, *TOLLIP*, *TMEM41B*, *AMBRA1*) (Balderhaar and Ungermann, 2013; Hegedüs et al., 2016; Hoffmann et al., 2020a; Katoh et al., 2004; Fimia et al., 2007; Moretti et al., 2018; Rapiteanu et al., 2016; Rong et al., 2011). We also identified cathepsin L (CTSL) as well as the mannose-6-phosphate receptor (M6PR) and GNPTAB, which are important for proper trafficking of lysosomal enzymes from the trans-Golgi network (Flint et al., 2019; Saftig and Klumperman, 2009). Interestingly, the HOPS complex, cathepsins, GNPTAB, and *SPNS1* were previously linked to Ebola virus entry, implying similar viral entry strategies (Carette et al., 2011; Flint et al., 2019).

The OC43 and 229E screens also uncovered *KEAP1*, the principal negative regulator of *NRF2*, whose activation restores

cellular redox and protein homeostasis (Figures 1C and 1D) (Cuadrado et al., 2019). Activation of the *NRF2* transcriptional program may induce a cellular state that is protective against coronavirus infection. Indeed, *NRF2* agonists seem to elicit an antiviral response as demonstrated in cell culture and were proposed for SARS-CoV-2 treatment (Cuadrado et al., 2020; Olagnier et al., 2020).

In addition to genes that scored in multiple CRISPR screens, we also found genes that were only enriched in one screen. Several genes related to the Golgi apparatus were uncovered only in the 229E screen and may possibly have 229E-specific roles. Among them were *GPR89A* and *GPR89B*, which encode two highly homologous G protein coupled receptors important for Golgi acidification (Maeda et al., 2008), and *NBAS* and *USE1*, which play a role in Golgi-to-ER retrograde transport (Aoki et al., 2009). The exact role of these factors in coronavirus infection—and their specificity to 229E—remain to be determined.

The SARS-CoV-2 screen identified multiple subunits of the exocyst (*EXOC1–8*) (Figures 1B and S2A), an octameric protein complex that facilitates the tethering of secretory vesicles to the plasma membrane prior to SNARE-mediated fusion (Mei and Guo, 2018). This complex could therefore facilitate trafficking of virus particles during entry or egress or regulate surface expression of viral entry factors. The top hit of the SARS-CoV-2 screen was *TMEM106B*, a poorly characterized lysosomal transmembrane protein linked to frontotemporal dementia (Figure 1B) (Lüningschrör et al., 2020). Deletions in *TMEM106B* have been shown to cause defects in lysosome trafficking, impaired acidification, and reduced levels of lysosomal enzymes, but its precise molecular function remains enigmatic (Klein et al., 2017; Lüningschrör et al., 2020). *TMEM106B* KO could thus affect SARS-CoV-2 entry, although it is also possible to protect from virus-induced cell death at other stages of the life cycle.

Overall, the comparative CRISPR screen strategy provides a rich list of shared and distinct candidate host factors for subsequent validation and host-directed inhibition of coronavirus infection.

Network Propagation across Multiple CRISPR Screens Highlights Functional Biological Clusters Important for Coronavirus Infection

To expand upon our manual curated analysis, which highlighted top-scoring genes from each coronavirus screen, we employed a network propagation approach using the entirety of our unthresholded datasets to better understand the functional connections between the genes identified in our screens (Cowen et al., 2017). This approach allowed us to identify molecular networks that emerge from our datasets even if certain gene members fell below our top-scoring threshold. Network propagation is a powerful technique that uses a “guilt-by-association” approach to propagate biological signal within large networks (e.g., Pathway Commons) to identify interconnected neighborhood clusters or pathways. In addition to revealing the functional networks underlying a particular dataset, this approach can be especially useful for identifying converging molecular networks across datasets. Here, we used an integrative network

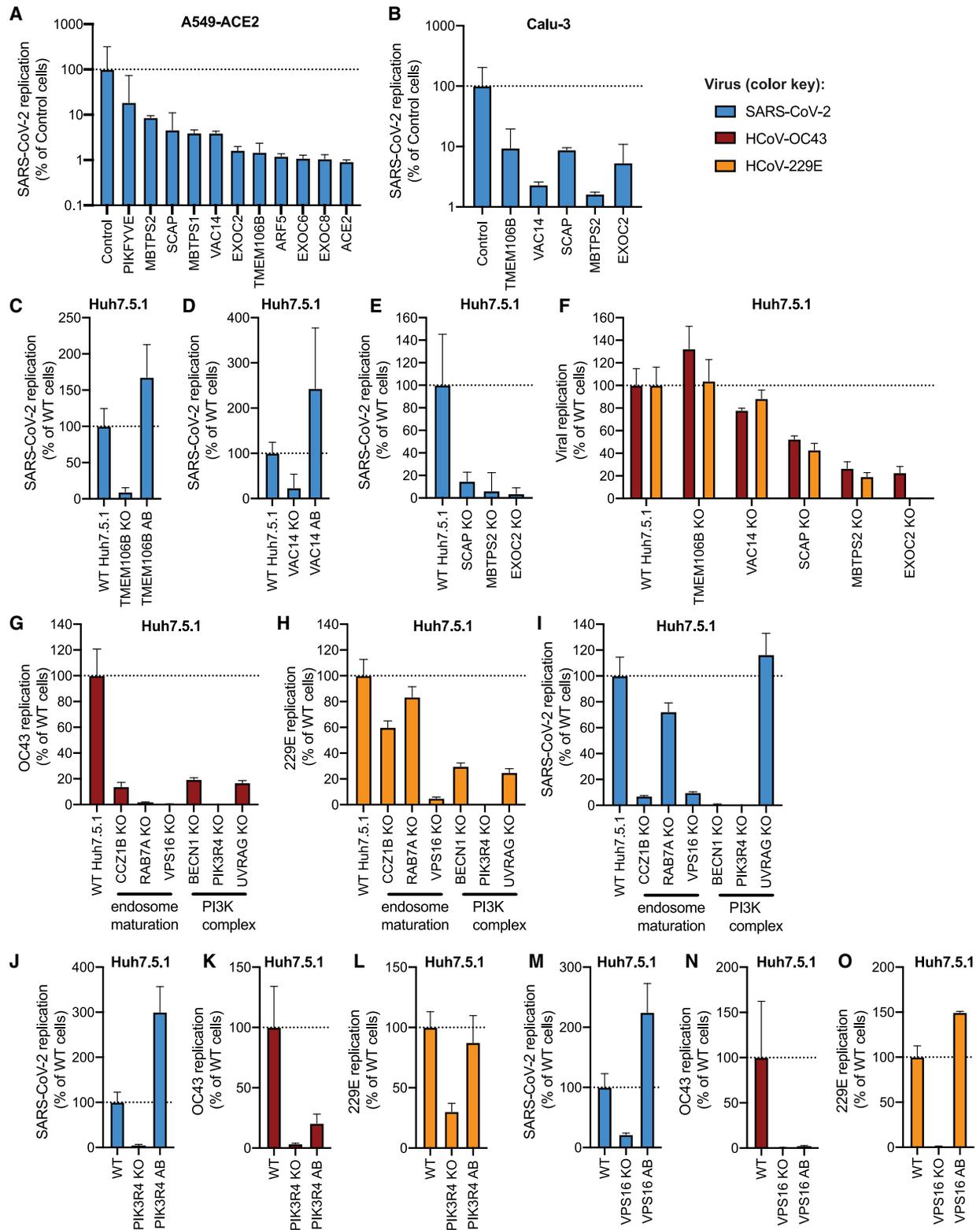


Figure 3. KO of Candidate Host Factor Genes Reduces Coronavirus Infection

(A) Quantitative reverse-transcriptase PCR (RT-qPCR) quantification of intracellular SARS-CoV-2 levels in RNP-edited A549-ACE2 cells. A non-targeting sgRNA was used as control. Cells were infected using MOI = 0.1 and harvested at 72 h post-infection (hpi).

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propagation approach to identify subnetworks and pathways that were common across the three coronavirus screens (Figure 2B). Briefly, we propagated the unthresholded CRISPR screen enrichment scores from each coronavirus screen and utilized a statistical permutation test paired with network clustering methods to extract network neighborhoods implicated across all three coronavirus screens.

Propagations from the three CRISPR screens identified subnetworks most common to all three viruses and independently confirmed the biological processes highlighted as important for coronavirus infection in our previous analysis (Figures 2C, S3A, and S3B; Tables S2 and S3). For instance, we found clusters linked to cholesterol metabolism (containing *SCAP*, *MBTPS1*, *SREBF2*, *LDLR*, and *NPC1*), endosome to lysosome transport (including the HOPS complex components *VPS11*, *VPS16*, *VPS18*, *VPS33A*, and *VPS39*), and glycoprotein biosynthetic processes (containing heparan sulfate biosynthesis genes). Another cluster reflected the critical role of autophagy/ phospholipid metabolism and indicated a functional link between *VAC14* and subunits of the PI3K complex as described above.

Moreover, network propagation also identified previously unappreciated biological functions, such as steroid hormone signaling, cell-cell adhesion, metal ion transport, intra-Golgi vesicle transport, snare complex assembly, Rab protein signal transduction, peroxisomal transport, and mRNA splicing (Figures 2C, S3A, and S3B; Tables S2 and S3). Interestingly, some of these processes were also implicated by recent coronavirus interactome studies (Gordon et al., 2020a; 2020b). We therefore additionally compared our CRISPR screen results with the hits from the SARS-CoV-2 interactome revealing *SCAP*, several Rab proteins, and HOPS complex subunits as functionally relevant for infection as well as interactors with viral proteins (Figure S2C). Altogether, the network propagation and cross-comparison with the protein interaction network highlighted numerous distinct cellular processes that may have critical roles during coronavirus infection.

KO of Candidate Host Factor Genes Reduces Coronavirus Replication

To validate the candidate genes from the SARS-CoV-2 screen, we generated individual KO cells in three cell types. We introduced gene deletions for several top hits in A549 lung epithelial

cells transduced with *ACE2* (A549-*ACE2*) using Cas9 ribonucleoproteins (RNPs), resulting in high indel frequencies (Table S4). SARS-CoV-2 RNA levels were markedly reduced in A549-*ACE2* cells that contained mutations in *ACE2*; ADP Ribosylation Factor 5 (*ARF5*); multiple subunits of the exocyst (*EXOC2*, *EXOC6*, *EXOC8*); the cholesterol homeostasis genes *SCAP*, *MBTPS1*, and *MBTPS2*; the phosphatidylinositol kinase complex genes *PIKFYVE* and *VAC14*; or *TMEM106B* (Figure 3A). Next, we lentivirally introduced Cas9 and sgRNAs against a subset of these genes (*TMEM106B*, *VAC14*, *SCAP*, *MBTPS2*, *EXOC2*) into Calu-3 lung epithelial cells with endogenous *ACE2* levels and also observed reduced viral replication compared to control cells harboring a non-targeting sgRNA (Figure 3B).

Lastly, we generated clonal Huh7.5.1 cells (without *ACE2*-IRES-*TMPRSS2* overexpression) containing frameshift mutations in candidate genes, resulting in loss of protein expression (Figures S4A and S4B). Deletion of *TMEM106B* and *VAC14* decreased SARS-CoV-2 replication, and this effect was reversed by add-back (AB) of respective cDNAs (Figures 3C and 3D and S4B), confirming the role of these two factors in the SARS-CoV-2 life cycle. Similarly, knocking out *SCAP*, *MBTPS2*, or *EXOC2* led to a decrease of SARS-CoV-2 RNA levels (Figure 3E). When we infected the same Huh7.5.1 KO cells with OC43 and 229E, we observed reduced viral replication in *SCAP*, *MBTPS2*, and *EXOC2* KO cells but not in *TMEM106B* KO and only moderately in *VAC14* KO cells (Figure 3F). This suggests that the latter genes are more rate-limiting in SARS-CoV-2 infection.

Next, we probed Huh7.5.1 cells lacking genes involved in endosome maturation or the PI3K complex, which were initially found in the common cold coronavirus screens. We saw reduced viral replication for OC43 and 229E (Figures 3G and 3H). Additionally, we observed increased cell viability in all KO cells relative to WT Huh7.5.1 cells 8 days post infection (dpi) (Figures S4C and S4D), indicating that these genes are important for infection by the common cold viruses and for virus-induced cell death. We then tested whether the hits shared between OC43 and 229E affect SARS-CoV-2. Indeed, SARS-CoV-2 infection was reduced in cells lacking certain endosomal or PI3K genes in the context of Huh7.5.1 without *ACE2*-IRES-*TMPRSS2*, similar to the common cold coronaviruses (Figure 3I). Complementmentation of *PIK3R4* and *VPS16* KO cells with respective cDNAs

(B) RT-qPCR quantification of intracellular SARS-CoV-2 levels in Calu-3 cells lentivirally transduced with Cas9/sgRNA cassettes targeting the indicated genes. A non-targeting sgRNA was used as control. Cells were infected using MOI = 0.1 and harvested at 48 hpi.

(C) RT-qPCR quantification of intracellular SARS-CoV-2 levels in WT Huh7.5.1, *TMEM106B* KO, or *TMEM106B* KO cells with *TMEM106B* cDNA add-back (AB). Cells were infected using MOI = 0.1 and harvested at 24 hpi.

(D) RT-qPCR quantification of intracellular SARS-CoV-2 levels in WT Huh7.5.1, *VAC14* KO, or *VAC14* KO cells with *VAC14* cDNA AB. Cells were infected using MOI = 0.1 and harvested at 24 hpi.

(E) RT-qPCR quantification of intracellular SARS-CoV-2 levels in WT Huh7.5.1, *SCAP* KO, *MBTPS2* KO, or *EXOC2* KO cells. Cells were infected using MOI = 0.1 and harvested at 24 hpi.

(F) RT-qPCR quantification of intracellular OC43 and 229E RNA levels in WT and *TMEM106B*, *VAC14*, *SCAP*, *MBTPS2*, or *EXOC2* KO Huh7.5.1 cells. Cells were infected using MOI = 0.05 (229E) and MOI = 3 (OC43) and harvested at 48 hpi.

(G–I) RT-qPCR quantification of intracellular viral RNA for (G) OC43, (H) 229E, or (I) SARS-CoV-2 in WT Huh7.5.1 cells or cell lines deficient in *CCZ1B*, *RAB7A*, *VPS16*, *BECN1*, *PIK3R4*, or *UVRAG*.

(J–L) RT-qPCR quantification of intracellular viral RNA for (J) SARS-CoV-2, (K) OC43, or (L) 229E in WT, *PIK3R4* KO, or *PIK3R4* KO cells with *PIK3R4* cDNA AB.

(M–O) RT-qPCR quantification of intracellular viral RNA for (M) SARS-CoV-2, (N) OC43, or (O) 229E in WT, *VPS16* KO, or *VPS16* KO cells with *VPS16* cDNA AB. For SARS-CoV-2 infection, viral N gene transcripts were normalized to cellular RNaseP. For OC43 and 229E experiments, viral RNA was normalized to 18S RNA. For all RT-qPCR experiments, results are displayed relative to infection in WT cells, and data represent means ± SEM from three biological samples.

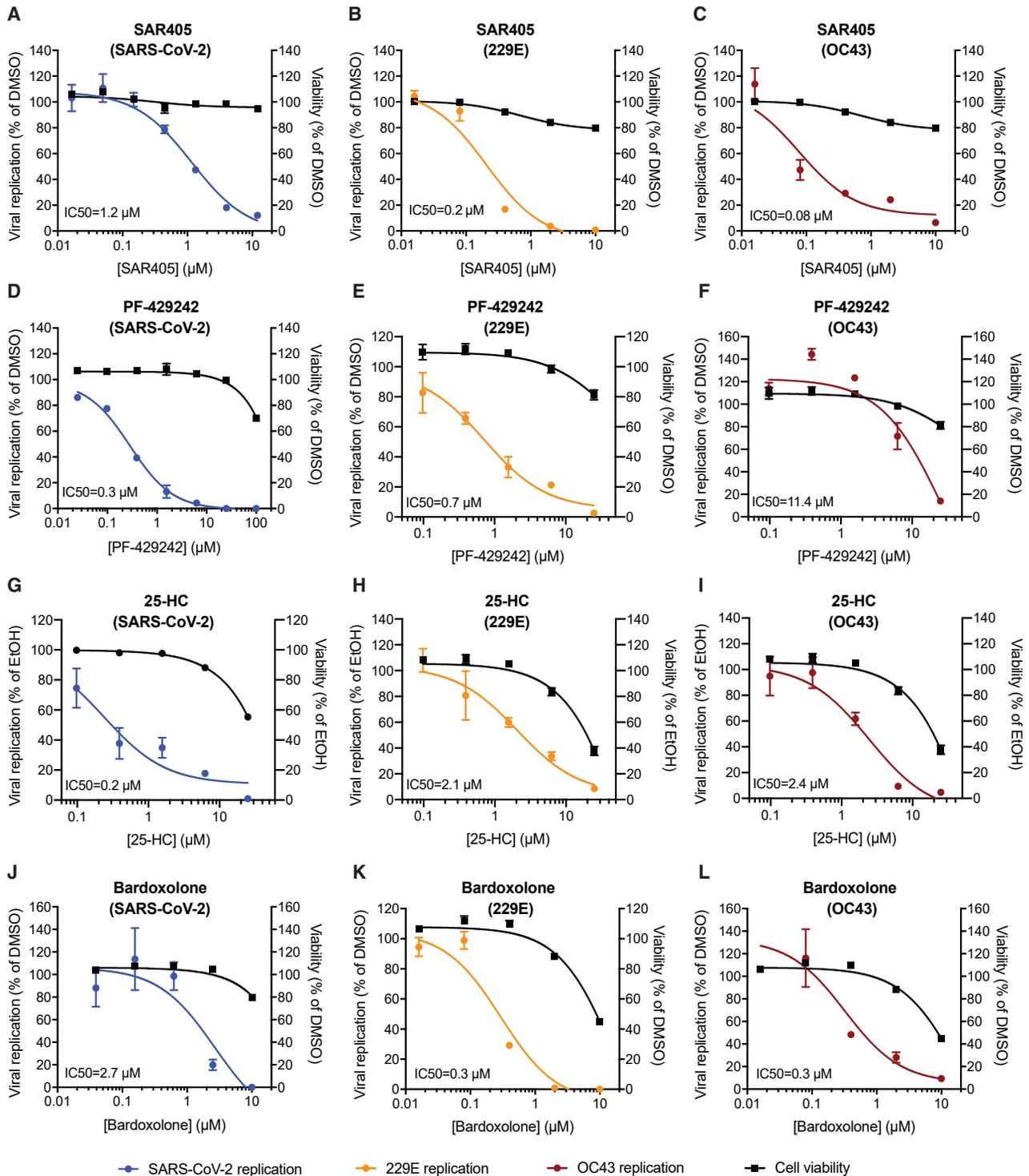


Figure 4. Pharmacological Inhibition of Identified Host Factors Decreases Infection with SARS-CoV-2 and Common Cold Coronaviruses
 (A–C) SAR405 (PI3K inhibitor) dose-response curves for (A) SARS-CoV-2, (B) 229E, and (C) OC43 replication in Huh7.5.1 cells and for cell viability of SAR405-treated cells.
 (D–F) PF-429242 (MBTPS1 inhibitor) dose-response curves for (D) SARS-CoV-2, (E) 229E, and (F) OC43 replication in Huh7.5.1 cells and for cell viability of PF-429242 treated cells.
 (G–I) 25-hydroxycholesterol (25-HC) dose-response curves for (G) SARS-CoV-2, (H) 229E, and (I) OC43 replication in Huh7.5.1 cells and for cell viability of 25-HC treated cells.

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restored SARS-CoV-2 and 229E and, to a lesser degree, OC43 replication levels (Figures 3J–3O and S4B). To rule out the possibility that decreased viral replication is not due to severe cellular growth defects, we measured proliferation of RNP-edited A549-ACE2 and clonal Huh7.5.1 KO cells. Apart from SCAP KO cells, we did not observe any notable growth differences compared to WT cells (Figures S4E and S4F).

Together, these experiments confirm that the host factors identified in our screens in Huh7.5.1 cells have functional roles for *Coronaviridae*, which are also relevant in lung epithelial cells. Furthermore, we demonstrated that important aspects of SARS-CoV-2 biology can be revealed by studying the common cold coronaviruses.

Compounds Directed at Host Factors Inhibit Coronavirus Replication

Host factors important for virus infection are potential targets for antiviral therapy. Host-directed therapy is advantageous as it allows pre-existing drugs to be repurposed, may provide broad-spectrum inhibition against multiple viruses, and is generally thought to be more refractory to viral escape mutations than drugs targeting viral factors (Bekerman and Einav, 2015). We therefore explored whether the cellular pathways identified in our screens could serve as targets for therapy against coronavirus infection.

Given the strong dependence of all three coronaviruses on *PIK3R4*, we tested SAR405, a selective and ATP-competitive inhibitor of class III PI3K (PIK3C3) (Ronan et al., 2014). The drug exhibited a dose-dependent effect against all three coronaviruses with low cytotoxicity in Huh7.5.1 cells, which is consistent with the reduced virus replication in *PIK3R4* KO cells and suggests that SAR405 could serve as a pan-coronavirus inhibitor (Figures 4A–4C). Given that VAC14, a PIKfyve complex component, was a strong hit in the SARS-CoV-2 screen, we also tested the PIKfyve inhibitor YM201636 and observed inhibition of SARS-CoV-2 replication (Figure S5A) (Jefferies et al., 2008). Similar antiviral activity was previously demonstrated with apilimod, another PIKfyve inhibitor (Bouhaddou et al., 2020; Kang et al., 2020; Ou et al., 2020).

Furthermore, we tested compounds modulating cholesterol homeostasis as this pathway also appeared important for all three coronaviruses. PF-429242, a reversible, competitive aminopyrrolidineamide inhibitor of MBTPS1 showed strong dose-dependent reduction of SARS-CoV-2, 229E, and, to lesser degree, OC43 replication with cytotoxicity only at high concentration (Figures 4D–4F) (Hawkins et al., 2008). 25-Hydroxycholesterol (25-HC), which promotes ER retention of the SCAP-SREBP complex (Brown et al., 2018), also potently reduced replication of all three coronaviruses (Figures 4G–4I). Fatostatin, which binds to SCAP and inhibits ER-to-Golgi translocation of SREBPs (Kamisuki et al., 2009), moderately reduced SARS-

CoV-2 infection levels at higher doses (Figure S5B). We confirmed on-target activity of the SREBP pathway modulators by measuring reduced expression of SREBP-regulated genes upon drug treatment (Figure S5C).

We also tested Bardoxolone, an activator of the KEAP1-NRF2 complex (Liby and Sporn, 2012), since KEAP1 scored highly in both common cold coronavirus screens. Bardoxolone potently inhibited 229E and OC43 replication and also reduced SARS-CoV-2 RNA levels at slightly higher concentrations (Figures 4J–4L), suggesting potential pan-coronaviral activity.

Finally, we confirmed the inhibitory effects of the different compounds against SARS-CoV-2 replication in Calu-3 cells; viral RNA levels were markedly suppressed without notable cytotoxicity (Figures S5D and S5E). Therefore, our genetic and pharmacological studies provide new targets for potential pan-coronavirus host-directed therapies that may be explored further *in vivo*.

Cellular Cholesterol Is Important for S-Mediated Entry of SARS-CoV-2

Next, we tested whether some of the identified genes affect viral entry. We generated a clonal Huh7.5.1-*ACE2/TMPRSS2* overexpression cell line to facilitate efficient infection with a SARS-CoV-2 S-pseudotyped vesicular stomatitis virus (VSV-SARS-CoV-2-S) expressing GFP, which can be utilized to specifically probe effects on S-mediated entry of SARS-CoV-2. We then introduced Cas9 RNPs and created KO lines for our genes of interest. Editing efficiencies were high and loss of protein was confirmed for *TMEM106B* (Figures 5A; Table S4). As expected, *ACE2* KO drastically reduced infection with VSV-SARS-CoV-2-S (Figure 5B). By contrast, we did not observe a decrease of viral entry in *TMEM106B* and *VAC14* KO cells, suggesting that they do not play a role in S-mediated entry (Figure 5B). We saw reduced uptake of pseudotyped viral particles in all cells with KOs in cholesterol-related genes (*SCAP*, *MBTPS1*, *MBTPS2*) as well as a modest decrease in exocyst deficient cells (Figure 5B). Finally, to examine whether treatment with cholesterol inhibitors also prevents viral entry similar to the genetic perturbations, we pre-treated Huh7.5.1-*ACE2/TMPRSS2* cells with different concentrations of PF-429242 or 25-HC and measured pseudotyped virus infection. Both drugs exhibited a dose-dependent reduction of infection levels (Figures 5C and 5D), suggesting that cellular cholesterol is required for efficient S-mediated entry of SARS-CoV-2.

DISCUSSION

In this study, we performed genome-scale CRISPR KO screens to identify host factors important for SARS-CoV-2, 229E, and OC43. Our data highlight that while the three coronaviruses exploit distinct entry factors, they also depend on a convergent

(J and K) Bardoxolone (KEAP1-NRF2 activator) dose-response curves for (J) SARS-CoV-2, (K) 229E, and (L) OC43 replication in Huh7.5.1 cells and for cell viability of Bardoxolone-treated cells.

For all experiments, compounds were added simultaneously with virus. Viral RNA was quantified after 24 hpi (SARS-CoV-2) or 48 hpi (229E and OC43) using RT-qPCR. SARS-CoV-2 RNA was normalized to RnaseP, and 229E and OC43 RNA was normalized to 18S RNA. Values represent means \pm SEM relative to untreated cells. Cell viability was assessed in parallel in drug-treated, uninfected cells and is displayed as means \pm SEM relative to DMSO or EtOH treated cells. Non-linear curves were fitted with least-squares regression using GraphPad Prism 8 and IC₅₀ was determined. All experiments were performed in three biological replicates.

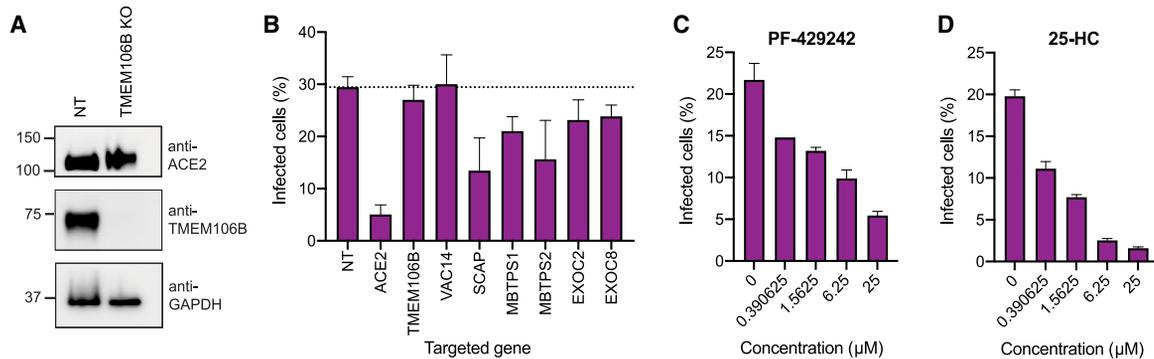


Figure 5. Cholesterol Is Required for S-Mediated Entry of SARS-CoV-2

(A) Western blot of ACE2 and TMEM106B levels from Huh7.5.1-*ACE2/TMPRSS2* cells edited with non-targeting (NT) or *TMEM106B*-targeting RNPs. Lysates were prepared under non-reducing conditions and TMEM106B appears as dimer. GAPDH was used as loading control. Molecular weight markers are indicated on the left.

(B) VSV-SARS-CoV-2-S infection of clonal Huh7.5.1-*ACE2/TMPRSS2* cells edited with RNPs targeting the specified genes. A NT sgRNA was used as control. Cells were harvested at 8 hpi and analyzed for GFP+ cells using flow cytometry. Values represent five biological replicates and are displayed as means \pm SD.

(C) VSV-SARS-CoV-2-S infection of PF-429242-treated cells. Huh7.5.1-*ACE2/TMPRSS2* cells were pretreated with different concentrations of PF-429242 for 2 h and then infected with virus. Cells were analyzed by flow cytometry at 14 hpi and analyzed for GFP+ cells using flow cytometry. Values represent two biological replicates at each concentration and are displayed as means \pm SD.

(D) VSV-SARS-CoV-2-S infection of 25-HC-treated cells. Huh7.5.1-*ACE2/TMPRSS2* cells were pretreated with different concentrations of 25-HC for 2 h and then infected with virus. Cells were analyzed by flow cytometry at 14 hpi. Values represent two biological replicates at each concentration and are displayed as means \pm SD.

set of host pathways, with potential roles for the entire *Coronaviridae* family.

In particular, genes involved in cholesterol homeostasis were enriched in all of our screens and in the network propagation. Two recent SARS-CoV-2 interactome maps have also revealed binding of viral proteins to the cholesterol regulator SCAP (Gordon et al., 2020a; Stukalov et al., 2020); given the essentiality of SCAP for infection, the interacting viral proteins are likely to positively regulate SCAP activity and cholesterol levels. Interestingly, two clinical studies found improved outcomes for coronavirus disease 2019 patients treated with cholesterol reducers statins (Daniels et al., 2020; Zhang et al., 2020). Mechanistically, our genetic and pharmacological experiments showed that SARS-CoV-2 requires cellular cholesterol for efficient entry. This observation is also supported by a recent screen for interferon-stimulated genes that protect from SARS-CoV-2 infection, which identified cholesterol 25-hydroxylase (CH25H) as one of the top hits (Zang et al., 2020). Cholesterol homeostasis has also been linked to viral entry and membrane fusion in the context of bunya- and hantavirus infections, suggesting a pro-viral function across different viral families (Charlton et al., 2019; Kleinfelter et al., 2015; Petersen et al., 2014).

Our screens also uncovered phosphatidylinositol biosynthesis as an important pathway for coronavirus infection. While PIKfyve kinase has previously been implicated through chemical inhibition (Bouhaddou et al., 2020; Kang et al., 2020; Ou et al., 2020), which is consistent with our identification of VAC14, we also found the upstream PI3K complex as a new critical host factor that may exhibit pan-coronavirus function. Due to its involvement in multiple cellular processes including vesicular trafficking and autophagy (Bilanges et al., 2019), it remains to be determined whether coronaviruses hijack the PI3K pathway during entry and/or for the generation of double-membrane vesicles

required for the viral replication/transcription complexes. Our results also inform those of a recent drug repurposing screen that identified \sim 100 compounds that inhibited SARS-CoV-2 replication (Riva et al., 2020); notably, among those were PIKfyve inhibitors, protease inhibitors, and modulators of cholesterol homeostasis. Our functional genomics data therefore suggest that the observed effects of these compounds were possibly due to inhibition of critical host factors.

While this study was under review, several other SARS-CoV-2 CRISPR screen studies were published or deposited as preprints, revealing important aspects of the viral life cycle (Baggen et al., 2020; Daniloski et al., 2020; Schneider et al., 2020; Wei et al., 2020; Zhu et al., 2020). Our screen for SARS-CoV-2 host factors using Huh7.5.1-*ACE2-IRES-TMPRSS2* cells identified the known SARS-CoV-2 entry factors, such as ACE2 and heparan sulfate, supporting its validity. Additional notable candidate host factors are TMEM106B, VAC14, cholesterol regulators, and subunits of the exocyst. Remarkably, the majority of these genes were independently identified in a CRISPR screen using Huh7.5 cells, the parental line of the Huh7.5.1 cells we used in our study, underscoring the reproducibility and importance of these host factors for SARS-CoV-2 infection (Schneider et al., 2020). TMEM106B was additionally found in a third study (Baggen et al., 2020). While the exact molecular function of TMEM106B for SARS-CoV-2 infection remains to be determined, its importance was confirmed in several cell lines (including lung cells) by Baggen et al. (2020) and our study.

By contrast, many of the host factors we found to be essential were missed by the other recently published studies (Daniloski et al., 2020; Wei et al., 2020; Zhu et al., 2020), possibly due to the different chosen experimental systems. Wei et al. (2020) performed genome-wide CRISPR screens in the African green monkey cell line VeroE6. Besides the bona fide entry

factors ACE2 and cathepsin L, the screen largely revealed chromatin modifiers such as HMGB1 and the SWI/SNF chromatin remodeling complex (Wei et al., 2020). The former was shown to regulate transcription of ACE2, thereby indirectly modulating susceptibility to SARS-CoV-2 infection in VeroE6. HMGB1 was not markedly enriched in any of the CRISPR screens conducted in human cells, suggesting that regulation of receptor expression levels may be species- or cell-type-dependent. Daniloski et al. (2020) and Zhu et al. (2020) conducted their screens in A549-ACE2 cells. Both studies identified ACE2, cathepsin L, and genes related to endosome acidification (e.g., subunits of the V-ATPase) or endosomal protein sorting and recycling (RAB7A, retromer complex, commander complex, WASH complex) (Daniloski et al., 2020; Zhu et al., 2020). The latter were shown to be critical for ACE2 cell surface expression and therefore likely to affect viral entry indirectly.

There is emerging evidence that SARS-CoV-2 entry can occur through different “routes,” depending on the level of TMPRSS2 on target cells as well as on mutations in the polybasic S1/S2 site of the viral S protein (Hoffmann et al., 2020b; 2020c; Zhu et al., 2020). The cleavage of SARS-CoV-2 S can occur either at the plasma membrane via TMPRSS2 or in endolysosomes through cathepsins. Sufficient TMPRSS2 levels may thus ablate the requirement for cathepsin and other factors linked to endolysosomal activity, a hypothesis supported by our screen, which was carried out in the context of TMPRSS2 overexpression and did not uncover cathepsins as crucial host factors. By contrast, A549 and VeroE6 cells do not express detectable TMPRSS2 levels, and the virus may thus rely preferentially on cathepsins for entry as screens in these cells indicate (Daniloski et al., 2020; Matsuyama et al., 2020; Wei et al., 2020; Zhu et al., 2020). However, nasal and lung epithelial cells, the natural target cells of SARS-CoV-2, can express high levels of TMPRSS2 (Sungnak et al., 2020). We therefore speculate that the genes identified in our SARS-CoV-2 CRISPR screen using Huh7.5.1-ACE2-IRES-TMPRSS2 cells are physiologically relevant to SARS-CoV-2 infection *in vivo*.

In summary, our study presents a screen for host factors carried out in a TMPRSS2-positive genetic background. It therefore unveils host factors critical for SARS-CoV-2 infection that may be more physiologically relevant than those uncovered so far in other genetic backgrounds. In addition, our comparative screens highlight commonalities and differences between SARS-CoV-2 and the common cold coronaviruses OC43 and 229E. In particular, this comparison led to the identification of the PI3K complex and cholesterol homeostasis as targets to pursue for the development of host-directed, pan-coronaviral therapy.

STAR★METHODS

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Supplemental Information can be found online at <https://doi.org/10.1016/j.cell.2020.12.004>.

ACKNOWLEDGMENTS

This research was funded by grants from the National Institutes of Health (R01AI140186-S and R01AI141970 to J.E.C.; P50AI150476, U19AI135990, U19AI135972, R01AI143292, R01AI120694, P01A1063302, and R01AI122747 to N.J.K.; F32CA239333 to M.B.; and 5DP1DA038043 to M.O.). J.E.C. was also supported by a pilot grant from Stanford ChEM-H Innovative Medicines Accelerator (IMA). M.O. acknowledges support through a gift from the Roddenberry Foundation. N.J.K. also acknowledges support from the Defense Advanced Research Projects Agency (DARPA) (#HR0011-19-2-0020), the Laboratory for Genomics Research (LGR) Excellence in Research Award (ERA) from the Innovative Genomics Institute at UC Berkeley (#133122P), FastGrants COVID19 grant, F. Hoffmann-La Roche, Vir Biotechnology, the Roddenberry Foundation, and gifts from the Ron Conway Family. Funding to A.S.P. was provided by the Chan Zuckerberg Biohub. We would like to thank Dr. Nathan Meyers for laboratory support; Matthew Laurie for help with Bravo liquid handling; Anke Meyer-Franke for help with automated microscopy; Michelle Tan, Angela Detweiler, and Norma Neff for help with sequencing; Dr. Sandra Schmid, Dr. Don Ganem, and Dr. Françoise Chanut for editorial comments; and Dr. Olga Gulyaeva, Sara Sunshine, Dr. Marco Hein, and Dr. Scott Biering for helpful discussions. We also express gratitude to the Biohub lab management and operations team for their support.

AUTHOR CONTRIBUTIONS

R.W., C.R.S., J.K., K.A.T., J.M.H., J.C.-S., J.R.Z., C.M.R., P.F., J.O., L.R., and A.S.P. performed experiments. R.W., C.R.S., J.K., K.A.T., J.M.H., J.C.-S., J.R.Z., C.M.R., and A.S.P. designed experiments. R.W., C.R.S., J.K., M.B., K.A.T., J.M.H., J.C.-S., J.R.Z., and A.S.P. analyzed and visualized data. L.R., B.J., K.W., and A.S. provided BSL-3 laboratory support and training. K.H., A.S., J.E.C., N.J.K., M.O., and A.S.P. supervised the study and provided technical guidance. A.S.P. conceptualized the study and wrote the initial draft of

the manuscript. R.W., C.R.S., M.B., K.A.T., J.M.H., J.C.-S., J.R.Z., J.E.C., N.J.K., and M.O. provided comments and edits on the manuscript.

DECLARATION OF INTERESTS

J.C.-S., J.O., and K.H. are employees of Synthego Corporation. All authors declare no other competing interests.

Received: September 26, 2020

Revised: November 13, 2020

Accepted: December 1, 2020

Published: December 9, 2020

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STAR★METHODS

KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Antibodies		
Mouse Anti-GAPDH	Santa Cruz Biotechnology	Cat#sc-32233; RRID: AB_627679
Goat anti-Rabbit IgG-HRP	Southern Biotech	Cat#4030-05; RRID: AB_2687483
Goat anti-Mouse IgG-HRP	Southern Biotech	Cat#1031-05; RRID: AB_2794307
Goat anti-ACE2 IgG	R&D Systems	Cat#AF933; RRID: AB_355722
Rabbit anti-TMPRSS2 IgG	Abcam	Cat#ab92323; RRID: AB_10585592
Rabbit Anti-Goat IgG-HRP	R&D Systems	Cat#HAF017; RRID: AB_562588
Rabbit Anti-PIK3R4	Novus Biologicals	Cat#NBP1-30463; RRID: AB_2163632
Rabbit Anti-TMEM106B	Atlas Antibodies	Cat#HPA058342; RRID: AB_2683684
Mouse Anti-VAC14 (C-10)	Santa Cruz Biotechnology	Cat#sc-271831; RRID: AB_10709168
Bacterial and Virus Strains		
HCoV-OC43	ATCC	Cat#VR-1558
HCoV-229E	ATCC	Cat#VR-740
SARS-CoV-2 (USA/WA-1/2020 strain)	BEI Resources	Cat#NR-52281
SARS-CoV-2 Reporter Virus Particles	Integral Molecular	Cat#RVP-701
SARS-CoV-2 Spike-Pseudotyped VSV-dG-GFP	This study	N/A
Stbl3 E.coli	Berkeley MacroLabs	N/A
Chemicals, Peptides, and Recombinant Proteins		
Polybrene	Santa Cruz Biotechnology	Cat#SC134220
Puromycin Dihydrochloride	GIBCO	Cat#A1113803
Blasticidin S HCl	GIBCO	Cat#A1113903
Hygromycin B	Mirus Bio	Cat#MIR5930
TrypLE Express	GIBCO	Cat#12604013
SAR405	SelleckChem	Cat#S7682
YM201636	SelleckChem	Cat#S1219
PF-429242 dihydrochloride	Sigma	Cat#SML0667
Fatostatin HBr	SelleckChem	Cat#S8284
Bardoxolone	SelleckChem	Cat#S6647
25-Hydroxycholesterol	Sigma	Cat#H1015
Zeocin	InvivoGen	Cat#ant-zn-1
Critical Commercial Assays		
KAPA HiFi HotStart ReadyMixPCR Kit	Kapa Biosciences	Cat#KK2602
QuickExtract	Lucigen	Cat#QE09050
Power SYBR Cells-to-CT kit	Invitrogen	Cat#44-029-55
NEBuilder HiFi DNA Assembly Master Mix	New England BioLabs	Cat#E2621L
FugeneHD	Promega	Cat#E2311

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REAGENT or RESOURCE	SOURCE	IDENTIFIER
QIAamp DNA Blood Maxi Kit	QIAGEN	Cat#51194
Quick-DNA Midiprep Plus	Zymo	Cat#D4075
QIAquick PCR Purification kit	QIAGEN	Cat#28104
QIAquick Gel Extraction Kit	QIAGEN	Cat#28704
TransIT-X2	Mirus Bio	Cat#MIR6003
DNA/RNA Shield	Zymo	Cat#R1100-250
Quick-DNA/RNA Viral MagBead kit	Zymo	Cat#R2141
Luna Universal Probe One-Step RT-qPCR Kit	NEB	Cat#E3006E
Cell Titer Glo	Promega	Cat#G7570
Gibson Assembly master mix	NEB	Cat#E2611L
JetOptimus	Polyplus	Cat#117-07
QiaAmp virus RNA mini kit	QIAGEN	Cat#52906
SuperScript™ III One-Step RT-PCR System with Platinum™ Taq DNA Polymerase	Invitrogen	Cat#12574026
Deposited Data		
Raw sequencing data for CRISPR KO screens	EMBL-EBI ArrayExpress	E-MTAB-9638
Tables S1, S2, S3, S4, and S5	Mendeley Data	https://dx.doi.org/10.17632/r49yg49ddc
Experimental Models: Cell Lines		
Huh7.5.1	Zhong et al., 2005	N/A
HEK293FT	Thermo Scientific	Cat#R70007
Vero	ATCC	Cat#CCL-81
A549-ACE2	Gift from Olivier Schwartz	N/A
Calu-3	ATCC	Cat#HTB-55
VeroE6	ATCC	Cat#CRL-1586
Oligonucleotides		
Primers for CRISPR screen library amplification, see Table S5	This study	N/A
Primers for cDNA cloning, see Table S5	This study	N/A
sgRNA sequences for clonal Huh7.5.1 KO cell generation, see Table S5	This study	N/A
Primers for genotyping of clonal Huh7.5.1 KO cells, see Table S5	This study	N/A
sgRNA sequences for RNP editing of A549-ACE2 cells, see Table S5	This study	N/A
Primers for genotyping of RNP-edited A549-ACE2 cells, see Table S5	This study	N/A
sgRNA sequences for Calu-3 KO cell generation, see Table S5	This study	N/A
qPCR primer and probe sequences, see Table S5	This study	N/A
Primers for VSVdG-CoV-2-S generation and sequencing, see Table S5	This study	N/A
Recombinant DNA		
lentiCas9-Blast	Sanjana et al., 2014	Addgene Cat#52962
human GeCKO v2 library	Sanjana et al., 2014	Addgene Cat#1000000049
pX458	Ran et al., 2013	Addgene Cat#48138
hACE2	Li et al., 2003	Addgene Cat#1786
TMPRSS2	Edie et al., 2018	Addgene Cat#53887
TMEM106B	Genscript	Cat#OHu17671
VAC14	Lemaire and McPherson, 2006	Addgene Cat#47418

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REAGENT or RESOURCE	SOURCE	IDENTIFIER
plenti-CMV-Puro-DEST	Campeau et al., 2009	Addgene Cat#17452
plenti-CMV-Hygro-DEST	Campeau et al., 2009	Addgene Cat#17454
pCMV-dR8.2 dvpr	Stewart et al., 2003	Addgene Cat#8455
pCMV-VSV-G	Stewart et al., 2003	Addgene Cat#8454
pAdVAntage	Promega	Cat#E1711
pLenti-DsRed_IRES_EGFP	Rousseaux et al., 2016	Addgene Cat#92194
PIK3R4	Johannessen et al., 2010	Addgene Cat#23488
VPS16	Jiang et al., 2014	Addgene Cat#67023
lentiCRISPRv2	Sanjana et al., 2014	Addgene Cat#52961
plenti-CMV-GFP-Zeo	Campeau et al., 2009	Addgene Cat#17449
pCAGEN	Matsuda and Cepko, 2004	Addgene Cat#11160
VSV-eGFP-dG	Beier et al., 2011	Addgene Cat#31842
SARS-CoV2-S codon optimized gBlocks, see Table S5	IDT	N/A

Software and Algorithms

MaGeCK	Li et al., 2014	https://sourceforge.net/p/mageck/wiki/Home
R 3.6.0	R	https://www.r-project.org
FlowJo 10.6.1	FlowJo LLC	N/A
ChemIDoc MP Imaging System	Bio-Rad	N/A
MATLAB R2020a	MathWorks	N/A
Cytoscape 3.8.0	Cytoscape	https://cytoscape.org
GraphPad Prism 8	GraphPad	N/A
Sequencher 5.1	Gene Codes	N/A
CFX Maestro™ Software	Bio-Rad	Cat #12004110

RESOURCE AVAILABILITY**Lead Contact**

Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Andreas S. Puschnik (andreas.puschnik@czbiohub.org).

Materials Availability

All requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact author. Materials will be made available through the authors upon execution of a Material Transfer Agreement.

Data and Code Availability

The accession number for the raw sequencing data of the CRISPR KO screens reported in this paper is EMBL-EBI ArrayExpress: E-MTAB-9638.

EXPERIMENTAL MODEL AND SUBJECT DETAILS**Cell lines**

Huh7.5.1 (gift from Frank Chisari) ([Zhong et al., 2005](#)), HEK293FT (Thermo Scientific), Vero cells (ATCC), VeroE6 (ATCC) and A549-ACE2 cells (gift from Olivier Schwartz) were cultured in DMEM (GIBCO) supplemented with 10% fetal bovine serum (FBS, Omega Scientific), penicillin/streptomycin (GIBCO), non-essential amino acids (GIBCO) and L-glutamine (GIBCO) at 37C and 5% CO₂. Calu-3 cells (ATCC) were cultured in DMEM/F12 (GIBCO) supplemented with 10% FBS (Omega Scientific), penicillin/streptomycin (GIBCO), non-essential amino acids (GIBCO) and L-glutamine (GIBCO) at 37C and 5% CO₂. Huh7.5.1 and 293FT cell lines were tested negative for mycoplasma contamination.

Virus stocks

OC43 was obtained from ATCC (VR-1558) and propagated in Huh7.5.1 cells at 33C. 229E was obtained from ATCC (VR-740) and propagated in Huh7.5.1 cells at 33C. SARS-CoV-2 (USA/WA-1/2020 strain) was obtained through BEI Resources (NR-52281) and

propagated in Vero cells at 37C. Supernatants were collected when cytopathic effect was apparent, filtered and stored at -80°C . Viral titers were determined by standard plaque assay using either Huh7.5.1 cells (OC43 and 229E) or Vero cells (SARS-CoV-2). Briefly, serial 10-fold dilutions of virus stocks were used to infect cells in 6-well plates for 1 h and an overlay of DMEM media containing 1.2% Avicel RC-591 was added. Cells were incubated for 3-4 days, followed by fixation with 10% formaldehyde, staining with crystal violet and plaque counting. Additionally, SARS-CoV-2 stock was sequence-verified by next-generation sequencing. All experiments with OC43 and 229E were performed in a biosafety level 2 laboratory and all experiments involving SARS-CoV-2 were performed in a biosafety level 3 laboratory.

METHOD DETAILS

Plasmids, cloning and lentivirus production

The following cDNA sequence containing plasmids were obtained: *hACE2* (Addgene, #1786, gift from Hyeryun Choe) (Li et al., 2003), *TMPRSS2* (Addgene, #53887, gift from Roger Reeves) (Edie et al., 2018), *TMEM106B* (Genscript, OHu17671), *VAC14* (Addgene, #47418, gift from Peter McPherson) (Lemaire and McPherson, 2006), *PIK3R4* (Addgene, #23488, gift from William Hahn & David Root) (Johannessen et al., 2010) and *VPS16* (Addgene, #67023, gift from Noboru Mizushima) (Jiang et al., 2014).

Individual cDNAs were cloned into EcoRV-cut plenti-CMV-Puro-DEST (Addgene, #17452, gift from Eric Campeau & Paul Kaufman) (Campeau et al., 2009) (*TMEM106B*, *VAC14*, *PIK3R4*, *VPS16*) or plenti-CMV-Hygro-DEST (Addgene, #17454, gift from Eric Campeau & Paul Kaufman) (Campeau et al., 2009) (*hACE2*, *TMPRSS2*) using NEBuilder HiFi DNA Assembly Master Mix (NEB). To generate the plenti-CMV-*ACE2*-IRES-*TMPRSS2* construct, *ACE2*, EMCV IRES (derived from pLenti-DsRed_IRES_EGFP (Addgene, #92194, gift from Huda Zoghbi)) (Rousseaux et al., 2016), and *TMPRSS2* were individually amplified with addition of overlapping sequences and the three fragments were assembled using NEBuilder HiFi DNA Assembly Master Mix. To generate plenti-*TMPRSS2*-TwinStrep, *TMPRSS2* was inserted into a plenti-CMV-GFP-Zeo vector (Addgene, # 17449, gift from Eric Campeau & Paul Kaufman) (Campeau et al., 2009) via digestion with BamHI and SalI followed by assembly using the Gibson Assembly master mix (NEB). All primer sequences for cloning can be found in Table S5.

Lentivirus was produced in HEK293FT by co-transfection of cDNA containing lentiviral plasmid together with pCMV-dR8.2 dvpr (Addgene, #8455, gift from Bob Weinberg) (Stewart et al., 2003), pCMV-VSV-G (Addgene, #8454, gift from Bob Weinberg) (Stewart et al., 2003) and pAdvantage (Promega) using FugeneHD (Promega). Supernatants were collected 48 h post-transfection, filtered and added to recipient cells in presence of Polybrene (SCBT). Transduced cells were subsequently selected using Puromycin or Hygromycin for 5-7 days.

Genome-wide CRISPR screens

Huh7.5.1-Cas9 cells were generated by lentiviral transduction with lentiCas9-blast (Addgene, #52962, gift from Feng Zhang) (Sanjana et al., 2014) and subsequently selected with blasticidin for 7 days. A portion of Huh7.5.1-Cas9 cells were additionally transduced with lentivirus containing *ACE2*-IRES-*TMPRSS2*-hygro. To generate CRISPR KO libraries, a total of 240 million Huh7.5.1-Cas9-blast or Huh7.5.1-Cas9-blast+*ACE2*-IRES-*TMPRSS2*-hygro cells were transduced with lentivirus of the human GeCKO v2 library (Addgene, #100000049, gift from Feng Zhang) (Sanjana et al., 2014) at a moi of 0.4 and subsequently selected using puromycin and expanded for 7 days. A total of 60 million mutagenized cells for each GeCKO sublibrary (A and B) were collected for genomic DNA extraction to assess the sgRNA representation of the starting population at day 7 post-transduction. In order to assess the sgRNA representation in the lentiviral supernatant used for transduction at day 0, we isolated lentiviral genomes using the DirectZol kit (Zymo), reverse-transcribed the purified RNA and amplified the sgRNA sequences as described below.

For the SARS-CoV-2 CRISPR host factor screen, 100 million cells of Huh7.5.1-Cas9-blast+*ACE2*-IRES-*TMPRSS2*-hygro GeCKO library cells were infected with SARS-CoV-2 at a multiplicity of infection (moi) of 0.01. Virus-induced cell death was apparent after 2-3 days and surviving cells were collected 12 dpi. The screen was performed once.

For the 229E and OC43 CRISPR screens, 100 million cells (per screen) of Huh7.5.1-Cas9-blast GeCKO library cells were infected with 229E and OC43 at moi of 0.05 and 3, respectively. Cells were incubated at 33C to increase CPE, which was apparent after 3-4 days. Surviving cells were collected after 10 days for 229E and 14 days for OC43. Each screen was performed in two replicates. For all CRISPR screens, genomic DNA (gDNA) was extracted using either QIAamp DNA Blood Maxi Kit (QIAGEN) or Quick-DNA Midiprep Plus (Zymo). The sgRNA expression cassettes were amplified from gDNA in a two-step nested PCR using KAPA HiFi HotStart ReadyMixPCR Kit (Kapa Biosystems). For PCR1, 40 reactions (for control samples) and 10-16 reactions (for virus selected samples) containing 4 μg gDNA were set up and amplified for 16 cycles. Reactions were pooled, mixed and 200 μL were cleaned up using QIAquick PCR Purification kit (QIAGEN). For PCR2, 3 reactions containing 5 μL PCR1 product were amplified for 12 cycles using indexed primers. PCR products were gel purified using QIAquick Gel Extraction Kit (QIAGEN) and sequenced on an Illumina NextSeq 500 using a custom sequencing primer. Primers sequences are listed in Table S5.

Demultiplexed FASTQ files were aligned to a reference table containing sgRNA sequences and abundance of each sgRNA was determined for each starting and selected cell population. Guide count tables were further processed using MaGECK with default "norm-method" to determine positive enrichment scores for each gene (Li et al., 2014). For 229E and OC43, two biological screen replicates were used as input, and for SARS-CoV-2, one biological screen replicate was used. The gene ontology enrichment of the

individual screens was run on genes with MaGEEK positive score ≤ 0.005 using the GO Biological Processes of the Molecular Signatures Database (MSigDB).

Network propagation

We performed network propagation analysis for the three virus CRISPR screens using the Pathway Commons network (Cerami et al., 2011). Specifically, we used a heat-diffusion kernel analogous to random walk with restart (RWR, also known as insulated diffusion and personalized PageRank) which better captures the local topology of the interaction network compared to a general heat diffusion process. The process is captured by the steady-state solution as follows:

$$P_{SS} = \alpha(I - (1 - \alpha)W)^{-1}P_0$$

where P_{SS} represents the vector of propagated values at steady-state, P_0 is the initial labeling (genes of interest from molecular studies), W is the normalized version of the adjacency matrix of the underlying network (in this implementation $W = AD^{-1}$, where A is the unnormalized adjacency matrix, and D is the diagonal degree matrix of the network), I is the identity matrix, and α denotes the restart probability (here, $\alpha = 0.2$), which is the probability of returning to the previously visited node, thus controlling the spread through the network.

We performed three independent propagations, one for each CRISPR dataset (i.e., each virus). After propagation, each propagated network was integrated by multiplying gene-wise. Such an operation is used to create a gene list ranked to prioritize genes with high scores from all propagated datasets. To control for nodes with high degree (i.e., many connections), which due to their heightened connectivity are biased to receive higher propagation scores, we conducted a permutation test. Specifically, we simulated random propagations by shuffling the positive scores to random genes, repeating this 20,000 times per CRISPR screen. Next, we calculated an empirical p value by calculating the fraction of random propagation runs greater than or equal to the true propagation run for each gene.

The network was created by extracting a subnetwork from the same Pathway Commons network corresponding to genes possessing a significant p value ($p \leq 0.01$) from the propagation ($n = 378$). Of these, interconnected genes were visualized using Cytoscape ($n = 284$). The resulting network was clustered into subnetworks using the GLayer Cytoscape plugin (Su et al., 2010). Three large clusters (1, 3, and 5) were further clustered using GLayer into additional subclusters (denoted with letters), resulting in a total of 25 subnetwork clusters (see Figure S3A and Table S3). Lastly, Gene Ontology (GO) enrichment analysis (biological process) was performed for each of the 25 resulting subclusters to identify biological processes and pathways associated with each subcluster.

Generation of clonal Huh7.5.1 KO cell lines

sgRNA sequences against gene targets were designed using the GPP sgRNA Designer (<https://portals.broadinstitute.org/gpp/public/analysis-tools/sgrna-design>). DNA oligos (IDT) containing sgRNA sequences were annealed and ligated into pX458 (Addgene, #48138, gift from Feng Zhang) (Ran et al., 2013). Cells were transfected with pX458 constructs using Mirus TransIT-X2 (Mirus Bio) and two days later GFP positive cells were single-cell sorted into 96-well plates using a Sony SH800 cell sorter. For genotyping, genomic DNA was isolated from obtained clones using DNA QuickExtract (Lucigen), the sgRNA-targeted sites PCR amplified and the products Sanger-sequenced. Obtained sequences were compared to reference sequences and clones containing a frameshift indel or *de novo* stop codon were selected. A list of all used sgRNA sequences and genotyping primers can be found in Table S5.

To isolate a clonal Huh7.5.1-ACE2/TMPRSS2 cell line, polyclonal Huh7.5.1-ACE2/TMPRSS2 were diluted and plated in 96-well plates. Single colonies were grown up and clones were screened for high expression of ACE2 and TMPRSS2 by western blot.

Generation of RNP edited A549-ACE2 and Huh7.5.1-ACE2/TMPRSS2 cells

sgRNAs were designed according to Synthego's multi-guide gene knockout. Briefly, two or three sgRNAs are bioinformatically designed to work in a cooperative manner to generate small, knockout-causing, fragment deletions in early exons. These fragment deletions are larger than standard indels generated from single guides. The genomic repair patterns from a multi-guide approach are highly predictable based on the guide-spacing and design constraints to limit off-targets, resulting in a higher probability protein knockout phenotype.

RNA oligonucleotides were chemically synthesized on Synthego solid-phase synthesis platform, using CPG solid support containing a universal linker. 5-Benzylthio-1H-tetrazole (BTT, 0.25 M solution in acetonitrile) was used for coupling, (3-((Dimethylamino)methylidene)amino)-3H-1,2,4-dithiazole-3-thione (DDTT, 0.1 M solution in pyridine) was used for thiolation, dichloroacetic acid (DCA, 3% solution in toluene) for used for detritylation. Modified sgRNA were chemically synthesized to contain 2'-O-methyl analogs and 3' phosphorothioate nucleotide interlinkages in the terminal three nucleotides at both 5' and 3' ends of the RNA molecule. After synthesis, oligonucleotides were subject to series of deprotection steps, followed by purification by solid phase extraction (SPE). Purified oligonucleotides were analyzed by ESI-MS.

To induce gene knockout in A549-ACE2 cells, 5 pmol Streptococcus Pyogenes NLS-Sp.Cas9-NLS (SpCas9) nuclease (Aldevron) was combined with 15 pmol total synthetic sgRNA (5 pmol each sgRNA) (Synthego) to form ribonucleoproteins (RNPs) in 20 μ L total volume with SE. Buffer (Lonza). To induce knockouts in Huh7.5.1-ACE2/TMPRSS2 cells, 30 pmol total synthetic sgRNA was mixed

with 10 pmol Cas9 in 20 μ L total volume SE buffer. The RNP assembly reaction was mixed by pipetting up and down and incubated at room temperature for 10 min.

All cells were dissociated into single cells using TrypLE Express (GIBCO), as described above, resuspended in culture media and counted. For A549-ACE2 transfections, 100,000 cells per reaction were used while for Huh7.5.1-ACE2/TMPRSS2 200,000 cells per reaction were used. Cells were pelleted by centrifugation at 200 $\times g$ for 5 min. Following centrifugation, cells were resuspended in transfection buffer according to cell type. 5 μ L of cell solution was added to preformed RNP solution and gently mixed. Nucleofections were performed on a Lonza HT 96-well nucleofector system using program CM-120 and CM-104 for A549-ACE2 and Huh7.5.1-ACE2/TMPRSS2, respectively. All transfections were performed in Lonza SE buffer. Immediately following nucleofection, each reaction was divided evenly between two wells of a tissue-culture treated 96-well plate containing 100 μ L normal culture media. Two days post-nucleofection, DNA was extracted from using DNA QuickExtract (Lucigen). Amplicons for indel analysis were generated by PCR amplification. PCR products were cleaned-up and analyzed by sanger sequencing. Sanger data files and sgRNA target sequences were input into Inference of CRISPR Edits (ICE) analysis (<https://ice.synthego.com>) to determine editing efficiency and to quantify generated indels (Hsiau et al., 2019). A list of all used sgRNA sequences and genotyping primers can be found in Table S5.

Generation of polyclonal Calu-3 KO cell lines

DNA oligos (IDT) containing sgRNA sequences (see Table S5) were annealed and ligated into lentiCRISPRv2 (Addgene, #52961, gift from Feng Zhang) (Sanjana et al., 2014). Lentivirus for each individual construct was produced as described above. Calu-3 cells were co-transduced with two lentiviruses encoding separate sgRNAs per gene or with a non-targeting sgRNA encoding lentivirus in presence of polybrene. Transduced Calu-3 cells were selected with puromycin (2 μ g/mL) for 9 days prior to infection experiments.

RT-qPCR infection assays

Cells were plated in 96-well plates and infected the next day with virus: OC43 (moi = 3), 229E (moi = 0.05), SARS-CoV-2 (moi = 0.1). For infection with HCoV-229E, cells were harvested 48 hpi, lysates were reverse transcribed and quantitative PCR was performed on a Bio-Rad CFX96 Touch system using the Power SYBR Cells-to-CT kit (Invitrogen) according to the manufacturer's instructions. 229E and OC43 RNA levels were quantified with virus-specific primer sets and viral RNA levels were normalized to cellular 18S levels.

For SARS-CoV-2 infections, Huh7.5.1, Calu-3 and A549-ACE2 cells were harvested after 24, 48 and 72 h, respectively, using 200 μ L DNA/RNA Shield (Zymo) to inactivate virus prior to export from the BSL3 laboratory. Samples were extracted using the Quick-DNA/RNA Viral MagBead kit (Zymo) on a Bravo automated liquid handling platform (Agilent). Briefly, the Bravo RNA extraction protocol consists of: 1) 180 μ L sample transfer from 2mL deep well to a 1mL deep well plate containing Proteinase K; 2) addition of Zymo Viral DNA/RNA Buffer for sample lysis; 3) Addition of Zymo MagBeads; 4) 10 min mixing and shaking of samples with lysis buffer and MagBeads; 5) incubation of the mixture on a 96 well ring magnet to collect the beads to a ring at the bottom of the deep well plate; 6) aspiration of the supernatant and dispensing into a 2mL deep well waste plate; 7) addition of wash buffers 1 with mixing; 8) incubation on the 96 well ring magnet; 9) aspiration. Steps 7-9 are repeated for wash buffer 2 and two rounds of 100% ethanol. 10) incubation on the magnet for 20 min to fully evaporate residual 100% ethanol from the beads; 11) Elution with nuclease-free water.

For RT-qPCR, separate reactions were performed for the quantification of SARS-CoV-2 N and E gene transcripts as well as cellular RNaseP for normalization using the Luna Universal Probe One-Step RT-qPCR Kit (NEB) on a Bio-Rad CFX384 Touch system. N and E gene transcripts showed high concordance and N gene levels normalized to RNaseP were displayed in figures. All qPCR primer/probe sequences are listed in Table S5.

Western blots

Cells were lysed using Laemmli SDS sample buffer containing 5% beta-mercaptoethanol and boiled at 95C for 10min with the exception of lysates for TMEM106B immunoblotting. In this case, cells were lysed in RIPA buffer on ice for 15min, then mixed with Laemmli under non-reducing conditions and without boiling. All lysates were separated by SDS-PAGE on pre-cast Bio-Rad 4%–15% polyacrylamide gels in Bio-Rad Mini-Protean electrophoresis system. Proteins were transferred onto PVDF membranes using Bio-Rad Trans-Blot Turbo transfer system. PVDF membranes were blocked with PBS buffer containing 0.1% Tween-20 and 5% non-fat milk. Blocked membranes were incubated with primary antibody diluted in blocking buffer and incubated overnight at 4C on a shaker. Primary antibodies were detected by incubating membranes with 1:5000 dilution of HRP-conjugated (Southern Biotech) secondary anti-mouse and anti-rabbit antibodies for 1 h at room temperature. Blots were visualized using a ChemiDoc MP Imaging System (Bio-Rad). The following primary antibodies and their dilutions were used in this study: GAPDH (SCBT, sc-32233) at 1:2000, ACE2 (R&D Systems, AF933) at 1:1000, TMPRSS2 (Abcam, ab92323) at 1:1000, TMEM106B (Sigma, HPA058342) at 1:2500, VAC14 (SCBT, sc-271831) at 1:2500, PIK3R4 (Novus Biologicals, NBP1-30463) at 1:2500.

Lentiviral pseudo-typed virus infection

Cells were plated in 96-well plates and infected with 30 μ L of SARS-CoV-2 Reporter Virus Particles (Integral Molecular, RVP-701) per well. After 48–72 h, infection rates were measured according the GFP levels using a Cytoflex flow cytometer (Beckman Coulter Life Sciences).

Generation of SARS-CoV-2-S pseudotyped Vesicular stomatitis virus (VSV-SARS-CoV-2-S)

SARS-2-S (based on Wuhan-Hu-1 isolate, GenBank: MN908947.3) was generated using codon optimized gBlock fragments (IDT) spanning genome fragments from 18851-19820, 19771-20740, 20692-21595, 21544-22338, and 22289-22745 (see [Table S5](#)), assembled by Gibson Assembly. Two mutation (K1269A and H1271A) to remove a prospective ER retention domain) based on data from SARS-CoV1 ([McBride et al., 2007](#)) were introduced by PCR. This gene was assembled into VSV-eGFP-dG (Addgene, #31842, gift from Connie Cepko) ([Beier et al., 2011](#)) in frame with the G coding sequence between MluI and NotI to generate VSV-eGFP-CoV2-S(AA). Helper plasmids for rescue were generated by amplification of genes from VSV-eGFP-dG and cloning by restriction digestion and ligation into pCAGEN (Addgene, # 11160, gift from Connie Cepko) ([Matsuda and Cepko, 2004](#)) to generate pCAGEN-VSV-N, pCAGEN-VSV-P, and pCAGEN-VSV-L. To rescue the VSVdG-CoV2-S(AA), 293FT cells were co-cultured with Huh7.5.1 cells at a ratio of 1:2 in a 6-well plate to be 80%–90% confluent the next day. Cells were transfected using JetOptimus (Polyplus) with pCAGGS-T7 (200ng), pCAGEN-CoV2-N (300ng), pCAGEN-CoV2-P (500ng), pCAGEN-CoV2-L (200ng), pCMV-VSV-G (800ng), and VSV-eGFP-CoV2-S(AA) (650ng). Cells were trypsinized and passed to a 10cm plate at 4 days post-transfection. At 10 days post-transfection, syncytia formation was seen and at 11 days post-transfection most of the cells had strong green fluorescence and supernatant was collected and frozen at -80°C . Huh7.5.1 cells were infected with supernatant and passaged 6 times every 3-4 days. Passage 6 supernatant was collected and a plaque assay was performed using VeroE6-TMPRSS2 cells. At day 4, plaques were isolated and grown on VeroE6-TMPRSS2- cells. Stock virus used for experiments was generated by infecting VeroE6 cells at 34°C for 3 days and collecting supernatant. Clarified supernatant was supplemented with sucrose phosphate and frozen at -80°C . Viruses were titrated on VeroE6-TMPRSS2 cells. To sequence the S region of the virus, RNA was isolated using the QiaAmp viral RNA mini kit (QIAGEN). The S regions was amplified using SuperScript III One-Step RT-PCR System with Platinum Taq DNA Polymerase (Invitrogen). Mutations in S were detected with a 27nt (9aa) deletion at the C terminus (1274STOP) and a partial mutation A372T (~50%) in the ectodomain. Similar adaptive mutations were found in previously published VSVdG-CoV2-S ([Dieterle et al., 2020](#)).

Flow cytometry analysis of VSV-SARS-CoV-2-S infected cells

Cells plated in 96-well plates were spin-infected with VSV-SARS-CoV-2-S (800 g, 60min, 34°C) and subsequently cultured at 37°C for 7-14 hpi. For analysis of VSV-SARS-CoV-2-S infection rates, cells were trypsinized, and analyzed using a Cytoflex S flow cytometer (Beckman Coulter). Approximately 5,000 cells were recorded and gated based on FSC/SSC, FSC-H/FSC-A (singlets) and FITC (eGFP) using FlowJo 10.

Compounds

The following compounds were used in this study: SAR405 (SelleckChem, S7682), YM201636 (SelleckChem, S1219), PF-429242 dihydrochloride (Sigma, SML0667), 25-Hydroxycholesterol (Sigma, H1015), Bardoxolone (SelleckChem, S6647) and Fatostatin HBr (SelleckChem, S8284). 25-Hydroxycholesterol was resuspended in 100% ethanol and all other compounds were resuspended in DMSO. All compounds were stored at -20°C until use.

Cell viability and growth assays

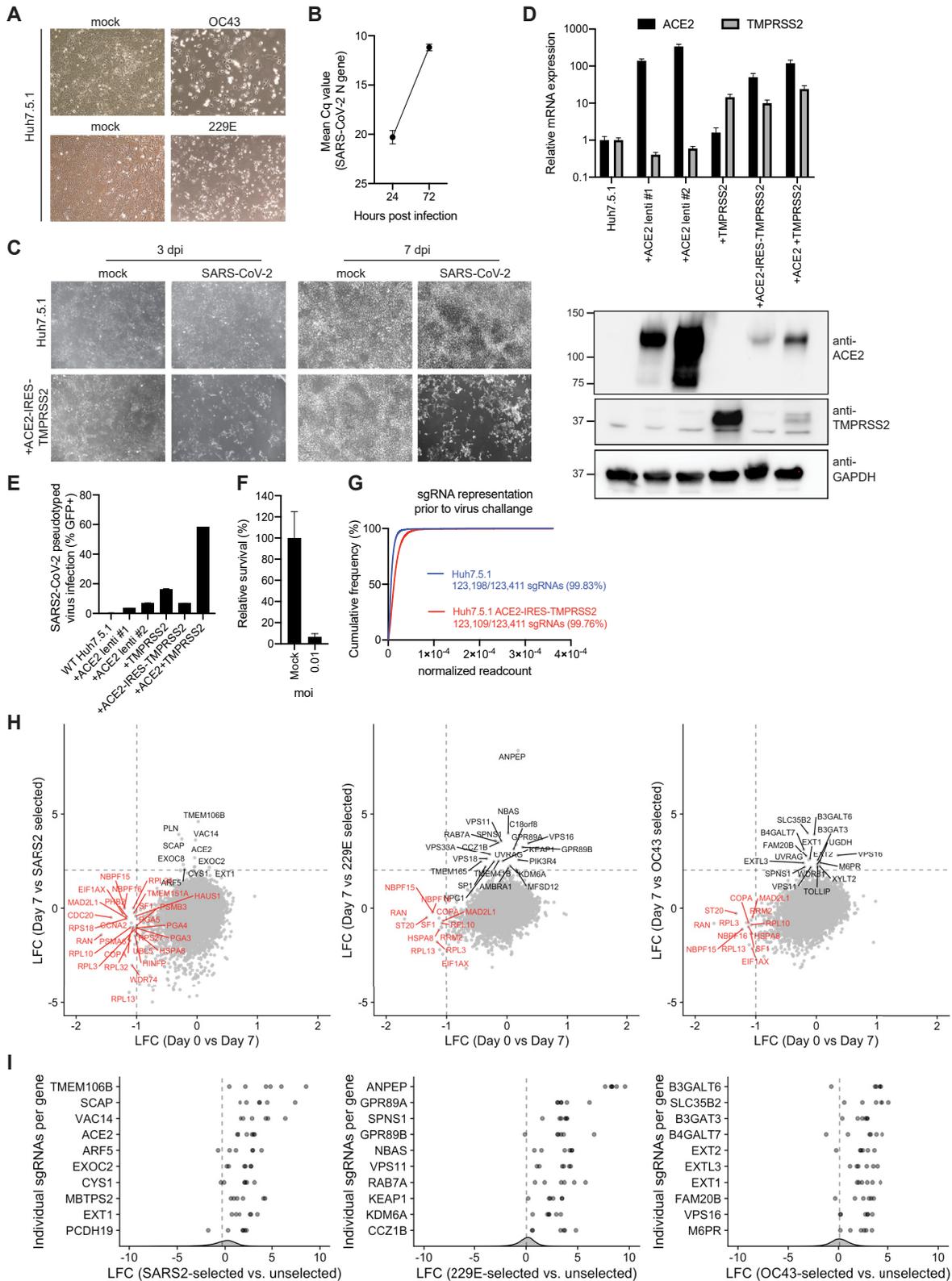
Huh7.5.1 or Calu-3 cells were treated with compounds at the same concentrations and durations as in infection assays. Cell viability was measured using Cell Titer Glo (Promega) by mixing cells in $40\ \mu\text{l}$ media with $40\ \mu\text{l}$ assay buffer and reading the luminescence signal on Envision 2105 plate reader (Perkin Elmer). To assess cell growth for WT and KO Huh7.5.1 cells, cells were plated in 96-well plates and Cell Titer Glo assay was performed daily for three consecutive days. To assess cell growth for RNP-edited A549-ACE2 cells, proliferation was determined by confluence of knockout pools using a Celigo Imaging Cytometer (Celigo) with built in 'Confluence' image analysis pipeline. Each well was independently imaged using brightfield illumination, autoexposure and autofocus with a $40\ \mu\text{m}$ focus offset to increase contrast. Analysis was performed using standard settings except for an intensity threshold of 8. To measure the number of surviving cells upon SARS-CoV-2 challenge, cells were plated in a 96-well black plates with glass bottom and infected with $\text{moi} = 0.01$. Cells were fixed with 4% paraformaldehyde followed by PBS washes. Nuclei were counted after staining with Hoechst 33258. Images were taken at the Gladstone Institutes Assay Development and Drug Discovery Core facility on a Molecular Devices ImageXpress confocal microscope using a 10X objective. Nuclear fluorescence was measured and counted by MetaXpress software using a multi-wavelength cell scoring module.

QUANTIFICATION AND STATISTICAL ANALYSIS

For CRISPR screens, the enrichment scores, p values and false-discovery rates were determined using the MaGeCK algorithm ([Li et al., 2014](#)). For the GO analysis, p values of hypergeometric tests were determined using the Cluster Profiler enricher function in R and adjusted with "fdr" correction method. For viral infection, drug treatment, and cell growth experiments biological replicates are defined as independent treatments and measurements from cells separately plated in and harvested from multiple wells. Replicates are displayed as mean \pm SEM or mean \pm SD as specified in the figure legends. Mean \pm SEM for RT-qPCR data was determined using

CFX Maestro Software (Bio-Rad) and then visualized in GraphPad Prism 8. Mean \pm SEM or mean \pm SD for remaining data was calculated and visualized using GraphPad Prism 8. Dose-response curves for drug treatments were generated by applying a non-linear curve fit with least-squares regression and default parameters using GraphPad Prism 8. No additional statistical tests were performed. No methods were used to determine sample size estimation or whether the data met assumptions of the statistical approaches. For all experiments, the statistical details can be found in the figure legends.

Supplemental Figures



(legend on next page)

Figure S1. Optimization of Phenotypic Selection of Coronavirus-Infected Huh7.5.1 Cells and Quality Control Metrics for CRISPR Screens, Related to Figure 1

- (A) Light microscopy images of WT Huh7.5.1 infected with OC43 (7 dpi) and 229E (4 dpi).
- (B) Quantification of SARS-CoV-2 RNA in WT Huh7.5.1 cells at 24 and 72 hpi by RT-qPCR. Cq values represent mean \pm SEM from 3 biological replicates.
- (C) Light microscopy images of SARS-CoV-2 infected WT Huh7.5.1 cells or Huh7.5.1 cells expressing *ACE2-IRES-TMPRSS2* at 3 and 7 dpi.
- (D) Quantification of *ACE2* and *TMPRSS2* expression in WT and lentivirally transduced Huh7.5.1 cells by RT-qPCR and western blot. mRNA levels are displayed as means \pm SEM from two independent sample collections and are relative to expression in WT cells. Anti-*ACE2* and anti-*TMPRSS2* antibodies were used to detect protein levels in WT and overexpression cells. GAPDH was used as loading control. Molecular weight markers are indicated on the left.
- (E) Quantification of infection with pseudotyped lentivirus bearing SARS-CoV-2 spike and expressing GFP by flow cytometry. Values are from two biological samples and are displayed as means \pm s.d.
- (F) Quantification of cell survival by measuring cell number of mock or SARS-CoV-2 infected Huh7.5.1-*ACE2-IRES-TMPRSS2* cells (moi = 0.01) at 3 dpi. Values are from two independent wells and are displayed as means \pm s.d.
- (G) sgRNA representation and distribution in the genome-wide CRISPR KO libraries at day 7 post-transduction (prior to coronavirus infection). Reads for each sgRNA were normalized to the total number of reads.
- (H) Gene-level log fold changes (LFCs) between the lentiviral CRISPR library transduced into target cells at day 0 and the KO library cell population at day 7 post-transduction (x axis) versus gene-level LFCs between the KO library cell population at day 7 post-transduction (prior to virus infection) and after phenotypic selection by coronavirus infection (y axis). Gene knockouts showing growth defects in absence of virus challenge are highlighted in red.
- (I) LFCs for the individual sgRNAs for the top 10 scoring genes from each CRISPR screen between the starting cell populations and the virus-selected cell populations. Overall sgRNA distribution is shown at the bottom of the graph and dotted line indicates mean LFC of all sgRNAs.

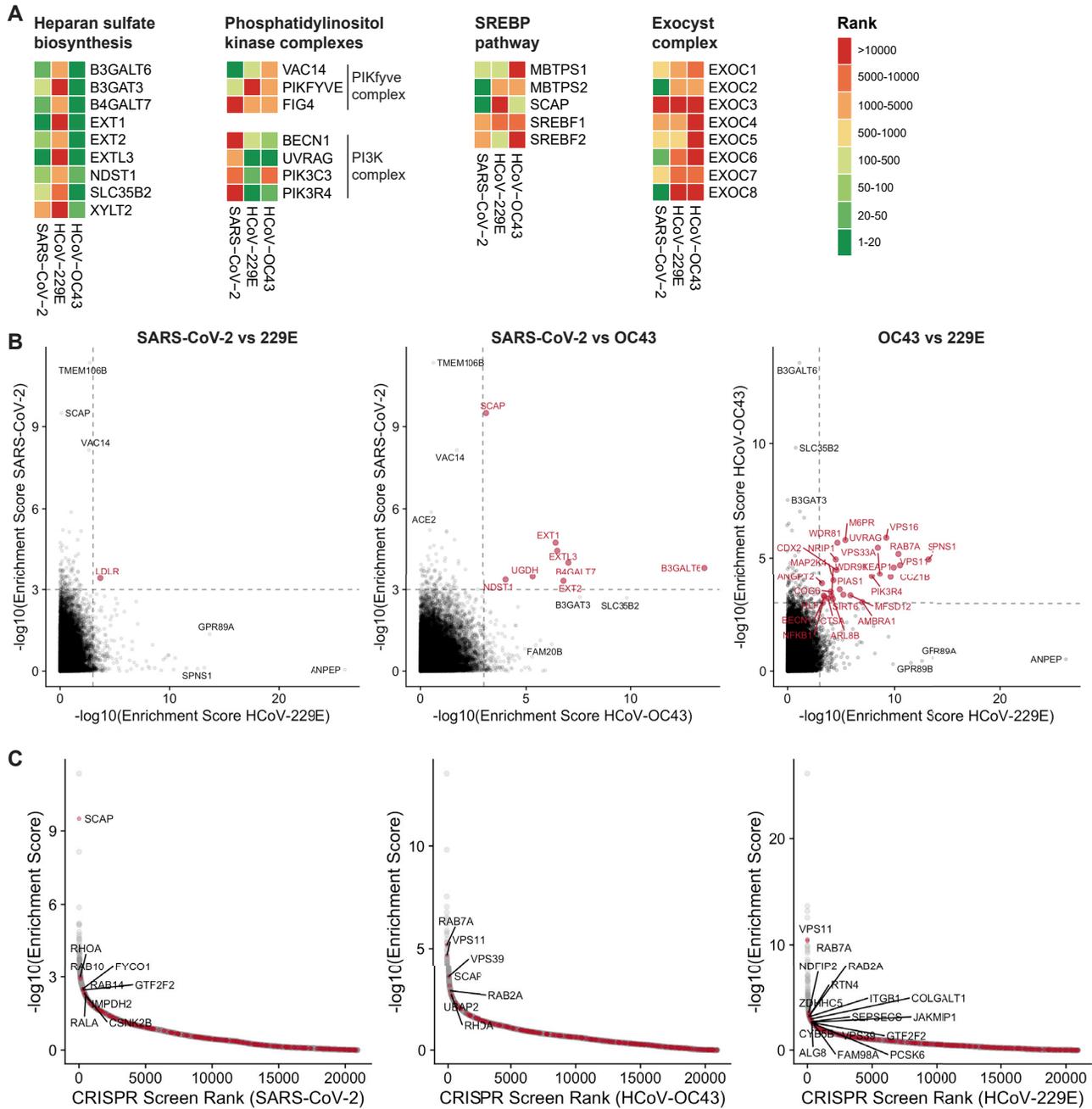


Figure S2. Comparison of CRISPR Screens Reveals Common and Distinct Host Factors across SARS-CoV-2, 229E, and OC43, Related to Figure 1

(A) CRISPR screen ranking of genes (according to MaGECK enrichment scores in Table S1) clustered in specific cellular pathway or complexes across the three CRISPR screens.

(B) Pairwise comparisons of gene enrichments between CRISPR screens. Dotted lines indicate $-\log_{10}(\text{Enrichment score}) = 3$. Genes that scored above the threshold in both screens are highlighted in red.

(C) Representation of the 332 high-confidence SARS-CoV-2 protein-protein interactome hits from (Gordon et al., 2020a) (highlighted in red) within the ranked CRISPR screen data for SARS-CoV-2, OC43 and 229E infection. Gene labels are added for interactome hits that scored in the top 500 of the CRISPR screens.

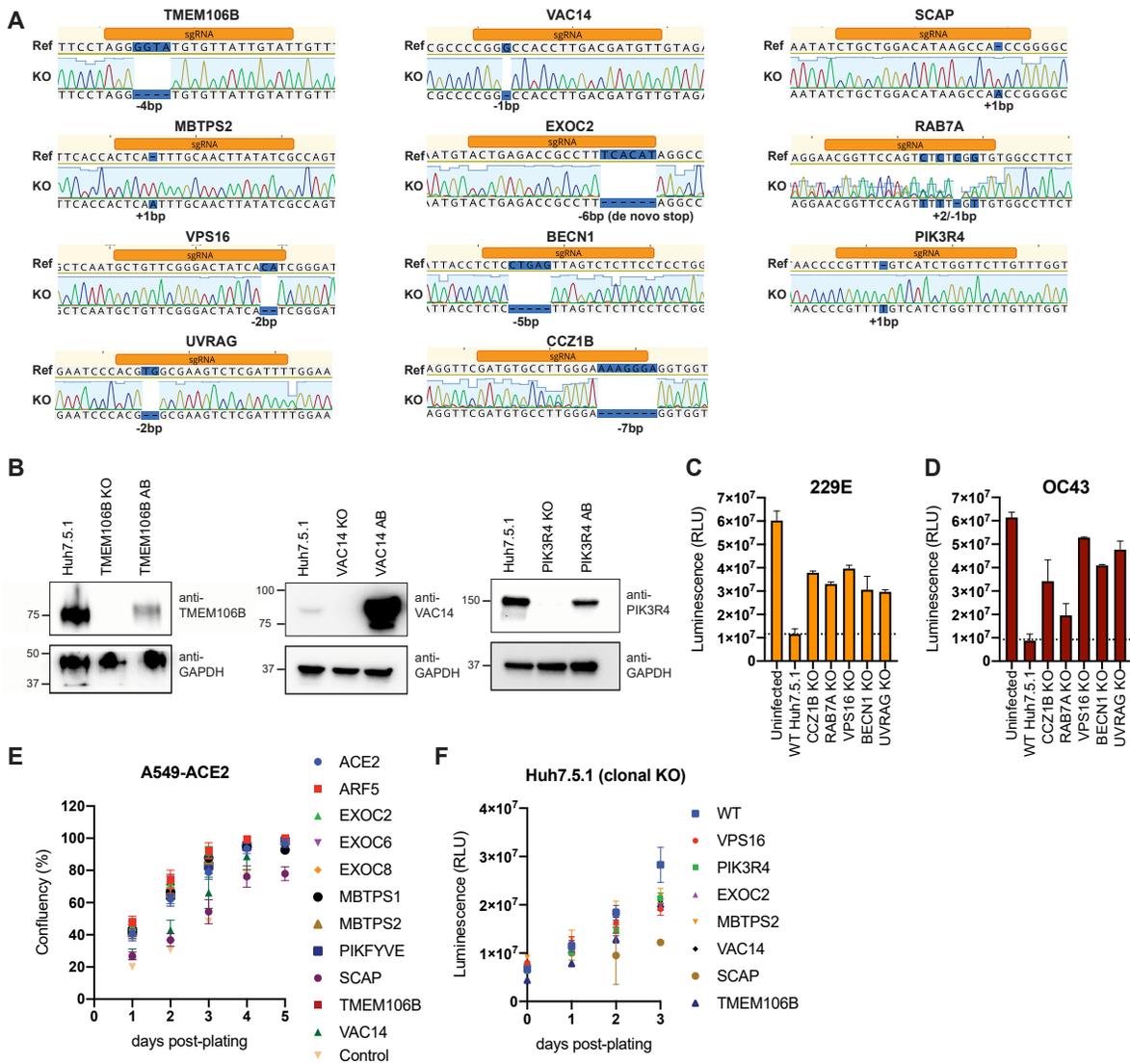


Figure S4. Characterization of Gene-Edited Cells, Related to Figure 3

(A) Genotyping of clonal Huh7.5.1. Targeted loci were PCR-amplified, Sanger-sequenced and aligned to WT reference sequence. Frameshifts are highlighted in blue.

(B) Western blot analysis of WT, KO and KO cells with respective cDNA add-backs (AB) for TMEM106B, VAC14 and PIK3R4. Lysates to probe for TMEM106B were prepared under non-reducing conditions and bands appear as dimers. GAPDH was used as loading control.

(C) Cell viability measurement of 229E infected WT and KO Huh7.5.1 cells. Cells were infected with 229E (moi = 0.05) and viability was determined 8 dpi using Cell Titer Glo. Values are displayed as means \pm SD from three biological samples.

(D) Cell viability measurement of OC43 infected WT and KO Huh7.5.1 cells. Cells were infected with OC43 (moi = 3) and viability was determined 8 dpi using Cell Titer Glo. Values are displayed as means \pm SD from two biological samples.

(E) Analysis of cell proliferation of RNP-edited A549-ACE2 cells. Cells were plated in 96-wells and confluency was measured daily using an automated microscope. Values are displayed as means \pm SD from four separate wells per cell line.

(F) Analysis of cell proliferation of WT and clonal KO Huh7.5.1 cells. Cells were plated in 96-wells and cell proliferation was measured daily using Cell Titer Glo. Values are displayed as means \pm SD from three separate wells per cell line per time point.

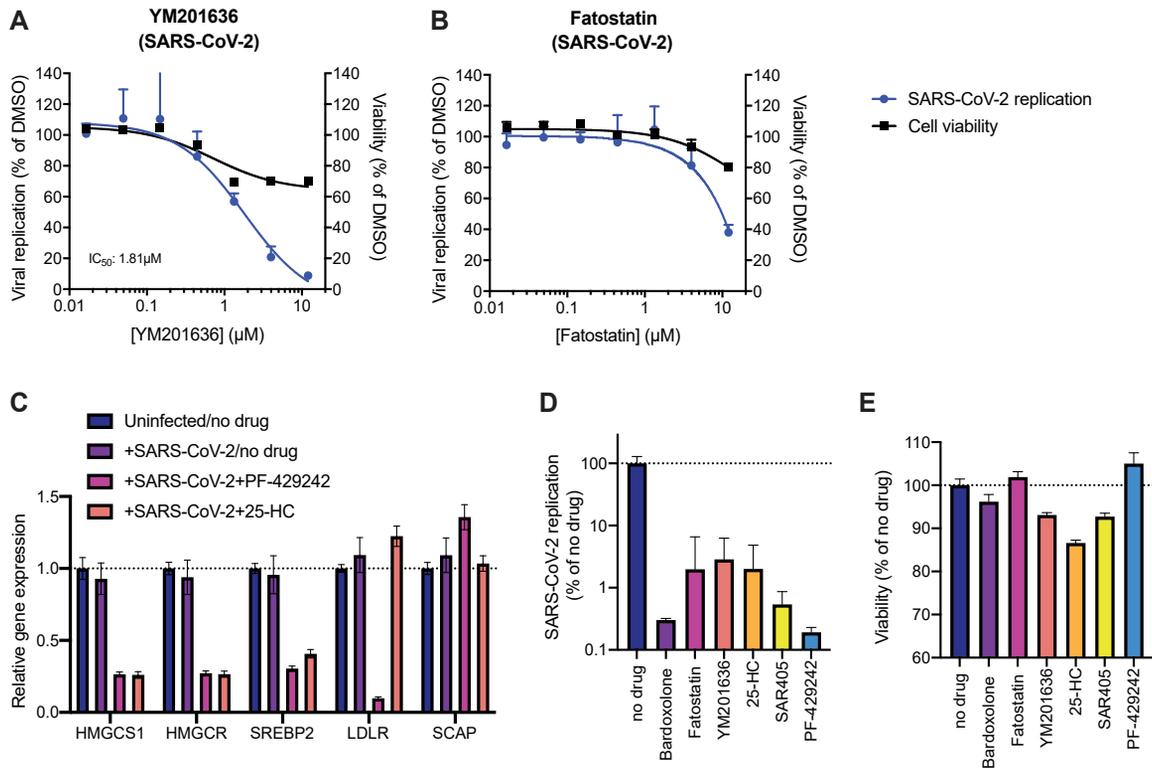


Figure S5. Pharmacological Inhibition of Host Factors in Huh7.5.1 and Calu-3 cells, and Validation of On-Target Activity of SREBP Pathway Inhibitors, Related to Figure 4

(A and B) Dose-response curves of the effect of (A) YM201636 and (B) Fatostatatin on SARS-CoV-2 replication in Huh7.5.1 cells and on cell viability of drug treated cells. Viral RNA was quantified after 24 hpi using RT-qPCR and normalized to RnaseP. Values represent means \pm SEM relative to DMSO treated cells. Non-linear curves were fitted with least-squares regression using GraphPad Prism 8 and IC_{50} was determined. All experiments were performed with 3 biological replicates. (C) Gene expression analysis of the SREBP-regulated cholesterol biosynthesis genes 3-Hydroxy-3-Methylglutaryl-CoA Synthase 1 (HMGCS1) and HMG-CoA reductase (HMGCR) as well as SREBP2, LDLR and SCAP in uninfected/no drug, infected/no drug and infected/drug-treated conditions (25 μ M PF-429242 and 6.25 μ M 25-HC) in Huh7.5.1 cells at 24 h post-infection/treatment. mRNA levels are displayed as means \pm SEM from three biological replicates and are relative to expression in uninfected/no drug cells. (D) RT-qPCR quantification of intracellular SARS-CoV-2 levels in drug-treated Calu-3 cells. Cells were infected using moi = 0.1, treated with 5 μ M at time of infection and harvested at 24 hpi. Values represent means \pm SEM from three biological replicates and are relative to the no drug (DMSO treated) condition. (E) Cell viability of drug-treated Calu-3 cells 24 h after addition of compounds using Cell Titer Glo. Values are displayed as means \pm SD from three biological replicates.