The Omic Insights on Unfolding Saga of COVID-19

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The year 2019 has seen an emergence of the novel coronavirus named severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) causing coronavirus disease of 2019 (COVID-19). Since the onset of the pandemic, biological and interdisciplinary research is being carried out across the world at a rapid pace to beat the pandemic. There is an increased need to comprehensively understand various aspects of the virus from detection to treatment options including drugs and vaccines for effective global management of the disease. In this review, we summarize the salient findings pertaining to SARS-CoV-2 biology, including symptoms, hosts, epidemiology, SARS-CoV-2 genome, and its emerging variants, viral diagnostics, host-pathogen interactions, alternative antiviral strategies and application of machine learning heuristics and artificial intelligence for effective management of COVID-19 and future pandemics.

Keywords: SARS-CoV-2, COVID-19, ORFs, machine learning, co-morbidities

ORIGIN, TAXONOMY, AND HOSTS OF CORONAVIRUSES

Coronaviruses (CoVs) are single-stranded RNA viruses of size around 65-125 nm in diameter. Due to the presence of crown-like spike structure on the viral outer surface, they were named Coronaviruses (1). The CoVs are known to cause respiratory and gastrointestinal tract infections in humans, poultry, and animals (2, 3). These are a large group of viruses that belong to the order Nidovirales, family Coronaviridae, and subfamily Orthocoronavirinae, which in turn is divided into four genera: Alphacoronavirus (α-CoV), Betacoronavirus (β-CoV), Gammacoronavirus (γ-CoV) and Deltacoronavirus (δ-CoV). These viruses are known to cause severe contagious respiratory illnesses in humans, poultry and animals. The SARS-CoV-2 (2019-nCoV), a member of β-CoV genus, has recently emerged and caused the COVID-19 pandemic.

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and Deltacoronavirus (δ-CoV) (4). Among seven humans CoVs identified to date including SARS-CoV-2, two of them belong to α-CoV (HCoV-NL63 and HCoV-229E) and the remaining five belong to β-CoV (HKU1, HCoV-OC43, SARS-CoV, MERS-CoV and SARS-CoV-2) (5, 6).

Coronaviruses are known for their ability to rapidly mutate, effectively cross the species barriers, and adapt to novel host environments (7). Out of the four genera, α-CoV and β-CoV are known to infect only mammals, while γ-CoV and δ-CoV primarily infect birds, with some reports indicating infections in mammals (8). Several studies have shown that bats, rodents, and avian species are natural reservoirs of diverse CoVs (9–12). For example, bats (Rhinolophus spp.) were identified as reservoirs of more than 30 CoVs including SARS-CoV (1, 13, 14). Currently, SARS-CoV-2 has been speculated to be transmitted to humans from bats through an unknown intermediate, which still needs to be conclusively proven (15). It is also possible that humans might have contracted an avirulent strain or a strain with lesser virulence directly or indirectly and then the virus might have undergone virulence-enhancing mutations resulting in human-to-human transmission (3). Whatever may be the causes for the origin of SARS-CoV-2, it remains to be proven with more supporting data.

Phylogenetic studies of SARS-CoV-2 revealed 79% nucleotide homology with SARS-CoV (16, 17) and 89% and 96% homologies with the two other SARS-like CoVs isolated from Chinese horseshoe bats Rhinolophus sinicus and Rhinolophus affinis, respectively (16, 18). However, these two SARS-like CoVs differ significantly in their receptor-binding domains. Upon comparison, SARS-like CoVs isolated from Malayan pangolins (Manis javanica) exhibited 85-92% nucleotide homology and stronger similarity in receptor binding domain with SARS-CoV-2 (19). Based on these findings, pangolins have also been considered as possible hosts in the emergence of SARS-CoV-2 (19). Besides pangolins, multiple species of wild or domestic animals like camels, mink, may also carry SARS-CoV-2 (8, 17, 20). Whether or not the suspected hosts are naturally infected by SARS-CoV-2 from humans remains to be proven.

**Diseased Phenotypes Associated with SARS-CoV-2**

The SARS-CoV-2 infection causes multiple disease phenotypes such as pulmonary dysfunction, hematological alterations, inflammation, electrolyte imbalance, coagulation dysfunction, liver and kidney dysfunctions, cardiac muscle injuries (21). It has been surmised that due to coagulation dysfunctions, COVID-19 patients are at increased risk of venous and arterial thromboembolism (TE) and consequential mortality. These findings highlight the need to implement thromboprophylaxis protocols, while treating COVID-19 patients (22). However, more symptoms are still being discovered, some of which appear to be rare. Due to the diverse symptoms, it has been a challenging task to diagnose and manage the disease on time (23). Moreover, the impact of comorbidities (e.g., cardiomypathies, hypertension, diabetes, etc.) on SARS-CoV-2 infection and disease progression makes the disease management even more challenging (24). Typically, symptomatic individuals with high body temperature pose a greater risk for transmitting the virus to others. However, such symptomatic individuals can be easily identified and isolated. On the other hand, the asymptomatic individuals may continue to remain unidentified through the regular screening procedures, thus jeopardizing the efforts to minimize viral transmission through identification and isolation of the virus-carrying individuals (25). Therefore, the existing precarious situation demands the identification and deployment of reliable serological markers to enable the identification of asymptomatic individuals (26). Application of susceptible-exposed-infectious-removed (SEIR) models to understand the COVID-19 epidemiology has estimated the R0 value of 2.03 for SARS-CoV-2, highlighting the importance of factors like hygiene, social distancing, and wearing PPE in reducing human-to-human and environment-to-human transmission of the virus (27). A recent meta-analysis by Heneghan et al. (28) indicated that firm conclusions cannot be drawn in the absence of recoverable viral culture samples of SARS-CoV-2. On the contrary, Greenhalgh et al. discuss reasons with supporting evidence to argue in the support of airborne transmission of SARS-CoV-2 (29). However, this is beyond the scope of this review as we limit the dissensions.

Over the past year, several studies have identified the presence of SARS-CoV-2 RNA in anal/rectal swabs and stool specimens of COVID-19 patients, even after the clearance of the virus in the upper respiratory tract (14, 30–34). With SARS-CoV-2 angiotensin-converting enzyme 2 receptor (ACE2) reported to be highly expressed in gastrointestinal epithelial cells (35, 36), it is suggested that the virus can actively infect and replicate in the gastrointestinal (GI) tract and thus has critical implications to the disease management, transmission, and infection control. In the past, symptoms such as diarrhea, nausea, vomiting and abdominal pain have been observed in patients infected with other coronaviruses such as SARS and MERS (37–39), indicating that the presence of the virus in the GI tract may be a common feature of the CoV infections. These studies collectively highlight the need for screening multiple clinical specimens from a single patient other than nasopharyngeal swabs, such as lung and tracheal aspirate, blood, pleural fluid, and fecal samples (40). Although different clinical specimens are of particular interest, whether or not this is done during the course of treatment of patients to ensure full recovery and no viral shedding is a subject of debate (41). Some evidence shows that SARS-CoV-2 can be vertically transmitted to the fetus or neonates from the infected mothers (42).

**SARS-CoV-2 Genome and Its Variants**

The SARS-CoV-2 carries the largest genome size of ~ 29.7 kb, which shares similarities with the genomes of other β-CoVs that have caused many epidemics in the past (43–50) (Figure 1). The SARS-CoV-2 consists of at least 16 non-structural and 4 structural
proteins (51). The list of the genes encoded by SARS-CoV-2 genome and their known/predicted functions in the virus and the host is given in Table 1. After entering the host cell, the positive (sense) strand of viral RNA undergoes translation to synthesize non-structural proteins (nsps) from two protein-coding genes ORF1a and ORF1b (Figure 1). The CoV genome consists of six open reading frames (ORFs) of which the first ORF (ORF1a) encompasses about 2/3rd of the genome and produces polypeptide 1a, which is further cleaved into 11 nsps. Due to ribosomal frameshift occurring upstream of ORF1a stop codon, translation of ORF1b yields another polypeptide called ORF1ab, which is further cleaved into 16 nsps. Cleavage of ORF1a and ORF1ab polypeptides is mediated by the virus-encoded proteases nsp3 and nsp5, which harbor papain-like domain and 3C-like domain, respectively. In addition, diverse forms of CoVs encode structural and accessory proteins for example orf3a/b protein, translated from the sub-genomic part of CoVs (52). Apart from the accessory proteins that have been found to play an important role in the viral-host interactions, several viral structural and accessory proteins, and a number of host proteins have been shown to interact with the viral RNA (74). Examples of host proteins that interact with the viral RNA include poly-A-binding protein, mitochondrial aconitase, pyrimidine-binding protein, and nuclear ribonucleoprotein which were known to be shown for SARS-CoV (75) and it is anticipated that that a similar interaction could be seen in SARS-CoV-2. However, this study is in infancy and beyond the scope of this review.

Genome studies revealed that while SARS-CoV-2, SARS-CoV, and MERS-CoV share many similarities, they have multiple differences in their genomic and phenotypic structure which influence their pathogenesis (76). The RNA polymerases of most of the RNA viruses either lack or have a poor proof-reading activity (77). As a consequence, single-stranded RNA viruses mutate at a faster rate than DNA viruses, and as a result, genetic variants emerged as quasispecies (78). For instance, it was estimated that SARS-CoV can mutate its genome at the rate of $0.80 \times 10^{-3}$ nucleotide substitutions per site per year which is similar to other RNA viruses (79). It is therefore anticipated that mutations at such rates allow the viruses to evolve faster, enabling them to escape host immune surveillance, develop resistance to drugs, vaccines and switch hosts. Moreover, the rapid rate of mutations could also increase the frequency of false negatives during nucleic acid-based viral diagnostics. Gustine and Jones have highlighted the role of a dysregulated innate immune response associated with hyperinflammatory syndrome in severe COVID-19 patients (80).

Several researchers have identified mutations in the SARS-CoV-2 genome with mutations identified in the SARS-CoV-2 genome that cause variants to become hotspots. Oster et al. have reviewed the trends in impending mutational hotspots ever since the covid infection rate has drastically been accounted for in various patients (81). Pachetti et al. identified eight novel recurrent mutations of SARS-CoV-2 in addition to 5 previously identified hotspots. Of the novel mutation hotspots, one was in the RdRp (RNA dependent RNA polymerase) gene involved in proof-reading machinery. This mutation was associated with a higher number of point mutations in Europe than viral genomes from Asia. The authors speculated that observed RdRp mutation could result in an enhanced viral replication, influencing mortality rates (56). analyzed 220 genome sequences from the GISAID database (www.gisaid.org) derived from patients infected by SARS-CoV-2 worldwide from December 2019 to mid-March 2020. The SARS-CoV-2 genome sequence available from the GenBank database was used as the reference in their study. They identified eight novel recurrent mutations of SARS-CoV-2, in addition to previously identified 5 hotspots. Of these 13 hotspots, 5 were predominantly present in the European isolates, and 3 were found exclusively in the North American isolates. Among the 13 hotspots, 6 were not observed in Asian isolates. It is assumed that the non-synonymous mutation (proline to leucine) in the RdRp gene could be affecting its proof-reading ability presumably by disrupting its interaction with the other protein cofactors such as the Exon domain of nsp14, nsp7, or nsp8, further alter the mutation rate of the virus (56). Further, they speculate that the observed RdRp mutation could result in an enhanced viral replication, influencing mortality rates. Several
| SL No. | ORF/Protein Name | Type of protein | Gene size (in bp) | Role of the protein in viral replication and assembly | Role of the protein in host-pathogen interactions | The features that are unique to SARS-CoV-2 if any | Reference |
|-------|-----------------|-----------------|------------------|---------------------------------------------------|-------------------------------------------------|-------------------------------------------------|----------|
| 1     | ORF1a (codes for 16 nsps) | Non-structural | 13218            | Associated with gene expression/ regulation, proteases involved in cleaving viral polyproteins, membrane rearrangement, RNA polymerase activities, proteins involved in viral replication (helicases, methyltransferases, exonucleases, etc.) | Involved in repression of host gene expression, disruption of host cell responses, dysregulation of autophagy. | NA (52)                                           |          |
| 2     | S (Spike protein) | Structural | 3822             | Helps in entry to host cells                      | Binds with ACE2 to gain entry into human cells. One of the most immunogenic viral antigens. | A furin cleavage site. A key protein being targeted for vaccine development. It carries several non-synonymous mutations in the RBD region and some in the hinge region. Collectively several mutations are predicted to enhance binding of S protein with hACE2. | (63–55) |
| 3     | E (Envelope protein) | Structural | 228              | Participates in viral assembly, budding, envelope formation and pathogenesis | Interacts with several host cell proteins such as PALS1 disrupting tight junctions of epithelial cells and promotes viral spread. Also affects host cellular activities by interfering with endoplasmic reticulum (ER), Golgi and ER-Golgi intermediate compartment | Carries several non-synonymous mutations which could play a role in enhanced viral pathogenesis; e.g., The changes resulted in Ser (56), Phe (57), Arg (58) and the C-terminal end (DLLV:72-75) are speculated to improve E protein interaction with tight junction-associated PALS1 which could play a critical role in SARS-CoV-2 pathogenesis and viral spread. | (59–62) |
| 4     | M (Membrane protein) | Structural | 669              | Role in cell attachment and entry, viral particle assembly, and budding | Interacts with host cell proteins. Inhibits the production of type I interferon by blocking the formation of TRAF3,TANK,TBK1/IKKepsilon complex | Carries several non-synonymous mutations which could play a role in viral pathogenesis. | (63)    |
| 5     | N (Nucleocapsid) | Structural | 1260             | Protects the genomic RNA of the virus, interacts with the M protein during virion assembly and helps in viral transcription and assembly and budding. | Highly immunogenic, recognized as antigen in hosts. Associates with the host ER-Golgi complex. Modulates host cell cycle by regulating cyclin and cyclin-dependent kinase activities resulting in cell cycle arrest in S phase. Interacts with host translation elongation factor 1α (EF1α), suppressing host mRNA translation. Interferes with interferon type I production and signaling. Antagonizes host antiviral RNAi responses. | Carries multiple non-synonymous mutations. Some of these mutations might create a unique potential RNA binding pocket. | (64–66) |
| 6     | ORF6 | Accessory | 196              | Role in viral pathogenesis. | Localizes at the nuclear pore complex and inhibits nuclear translocation of STAT1, antagonizing IFN-I signaling. Interacts with host cell proteins. | Not known yet | (67, 68) |
| 7     | ORF7a | Accessory | 366              | Not known yet, although it is under selective pressure with a possible role in host-switching. | Interacts with host cell proteins and speculated to facilitate viral growth and replication. It is primarily localized to Golgi apparatus and also found on host cell surface. It interacts with Bcl-XL protein and induces apoptosis via caspase-dependent pathway. Inhibits apoptotic mechanisms by inhibiting glycosylation of host protein BST-2 (also known as CD317) | Not known yet | (69, 70) |
| 8     | ORF7b | Accessory | 132              | Not known yet | Interacts with host cell proteins and speculated to facilitate viral growth and replication. Localized to Golgi apparatus. Possesses leucine zipper motif with a | Not known yet | (71) |

(Continued)
polymerase inhibitors are currently being tested in clinical studies targeting the RdRp protein of the virus. Some of these drugs have a predicted binding site in the SARS-CoV-2 RdRp hydrophobic cleft, which is adjacent to the identified mutation at the 14408 positions. Henceforth, it is possible that the observed mutation might also impart drug resistance to the virus, however, the proposed hypothesis needs to be experimentally proven.

As algebraic topology-based machine learning models were introduced to evaluate the SARS-CoV-2 spike glycoprotein (S protein) and host ACE2 receptor binding free changes, a number of mutations were identified (44). From the cluster analysis and the transmission dynamics, it is assumed that future SARS-CoV-2 mutations tend to have higher chances to mutate into significantly more infectious COVID-19 strains than the original one from Wuhan. Given the fact that the “infectivity-strengthening” mutations spread faster than “infectivity-weakening” mutations, the study concluded that the proportion of asymptomatic cases have drastically increased despite impeding cases in South Korea (82). In another study, phylogenetic analysis of ~1,400 SARS-CoV-2 genomes isolated from India yielded 7 clusters, of which one was unique to India. This unique cluster (Clade IA3i) included three variants; C6312A, C13730T, and C28311T, which resulted in amino acid changes T2016K (orf1a), A97V (RdRp) or A88V (orf1b) and P13L (N protein), respectively (83). These changes are hypothesized to enhance the virulence and/or infectivity of the virus. The mutation A97V in the RdRp protein is located in its NiRAN domain, suggested to be relevant in RNA binding and nucleotidylation activity (84). Mutations have also been identified in other viral proteins with potential functional consequences (57, 85, 86). However, the impact of all these mutations on the functions of the respective proteins and their consequences on viral pathogenesis needs to be experimentally tested. Among the recently identified variants of SARS-CoV-2, the one carrying D614G mutation in the spike protein of the virus has emerged as the most prevalent variant in the global pandemic, possibly due to its greater fitness advantage (87). This variant was found to be more infectious resulting in a higher viral titer in patients. In addition to viral variants, a recent genome-wide association study (GWAS) in the UK identified eight human genetic variants consisting of a combination of alleles at multiple loci that are predicted to increase the risk of mortality among COVID-19 patients (88). Lately, some of the SARS-CoV-2 variants with mutations in the S protein are behind the surge in the second wave of SARS-CoV-2 infections in many countries including India. Among the three sub lineages of B.1.1.7, namely B.1.617.1, B.1.617.2, and B.1.617.3, the variant named B.1.617.1.2 has been found to rapidly spread in many countries including India. Recently, B.1.617.1.2 was classified by WHO as a ‘variant of concern’ based on evidence showing higher transmission rates and reduced neutralization by antibodies obtained from the convalescent serum of infected or vaccinated individuals (89). Similarly, many other variants are being identified globally and being monitored for their epidemiology.

VARIANTS OF INTEREST/CONCERN

Several variants have been identified globally, which appear to spread more quickly, potentially increasing COVID-19 infections. Based on the factors, including the severity of the virus and their ability to spread, four variants viz. B.1.1.7, B.1.351, P.1 and B.1.617.2, also known as alpha, beta, gamma and delta, respectively, have been characterized as the variants of concern (Table 2). An alpha variant, identified initially in the United Kingdom and delta variant, first identified in India, is outspread with a much faster rate than beta and gamma variants, first determined in South Africa and Japan/Brazil, respectively. Hence, alpha and delta variants may potentially cause more sickness and increase the number of deaths globally. On the other hand, treatment with monoclonal antibodies is less effective against beta, gamma, and delta variants, while treatment for alpha variants is known to be effective (101). These variants have different alterations in the spike protein leading to increased susceptibility, virulence and transmission that may affect viral replication and host immune response. More recently, a novel South African variant C.1.2 was identified which would escape antibody response. BNT162b2 (Pfizer/BioNTech) and mRNA-1273 (Moderna) use a formulated vaccine which is used to elicit potential response against the aforementioned SARS-CoV-2 variants thereby combating rapid diagnosis (102).

HOST-PATHOGEN INTERACTIONS, CO-MORBIDITIES AND IMMUNE RESPONSE

The infection starts with the binding of virus elements to the host cell surface receptors, followed by viral entry and multiplication.
Moreover, the binding of virus to the host receptor is primarily required for viral transmission to other host species as well (103). Most of the human CoVs (HCoVs) have been ascertained to recognize protein peptidases as their receptors except HCoV-OC43 and HKU1 which utilize sugar molecules for cellular attachment (104). For example, the HCoV-229E binds to human aminopeptidase N (105), while MERS-CoV binds to human dipeptidyl peptidase 4 (58). On the other hand, SARS-CoV and HCoV-NL63 interact with ACE2 for viral entry into the host (106). In CoVs, the passage of viral entry into the host is mediated by the spike (S) glycoprotein, situated at the viral surface 71. The S protein is cleaved by human proteases into S1 and S2 subunits, which are involved in receptor identification and cell membrane arrangement, respectively (53). The N-terminal and the C-terminal domains (NTD and CTD) of the S1 subunit play an important role in the functioning of receptor-binding domains (RBD) in SARS-CoVs and MERS-CoVs (58, 107). The crystal structures of HCoV-NL63 and SARS-CoV RBD interactions with human ACE2 (hACE2) receptors are already known (107, 108). The composite crystal structure of interaction between S1 CTD of SARS-CoV-2 and hACE2 receptor has revealed that most of the binding residues of SARS-CoV-2 in hACE2 show similarity with SARS-CoV binding sites (90). Furthermore, the crystal structures of trimeric S protein of SARS-CoV-2 published recently with buried and exposed RBD regions have also been found to be consistent with structural characteristics of S proteins in MERS-CoV and SARS-CoV (91). While receptor recognition allows us to identify hCoV pathogenic determinants, the ACE-2 Receptor recognition is an important determinant of hCoVs infection and pathogenesis. Comparable to SARS-CoV RBD, it was assumed that SARS-CoV-2 RBD is less potent and exposed given the spike proteins’ switching between lying down and standing up positions (109). The former buried positions were in turn larger and so the masking regions are favored by immune evasion of spike proteins’ through ACE-2. In summary, SARS-CoV-2 has diffident buried and exposed surfaces affecting the chemistry of pathogenic determinants besides host protease activation.

Furthermore, the newly evolved delta mutations in SARS-CoV-2 may impact disease severity and become immunocompromised. As it is known that the variant replication is manifold when compared to its predecessor variants, whether or not vaccinated people have the highest chance to skip the infection and transmission is under evaluation (110). This could be due to neutralizing antibodies that might have evaded the infection. These delta variants host multiple mutations in the S1 subunit, including the RBD that seem to have concurrent epitope tags. Therefore, the knowledge of the crystal structure of interactions between host and viral proteins will not only allow repurposing of the existing drugs but also the discovery of new antiviral agents. As a prelude to this, we have developed a bona fide network of HCoV-host interactome networks which could be used to identify key putative candidate interacting pairs responsible for the viral pathogenesis (Figure 2). Among HCoVs, different viral proteins are being used for viral entry. For example, β-CoVs use their S protein for cell binding and entry. SARS-CoV binds to ACE2, MERS-CoV utilizes dipeptidyl peptidase 4 (DPP4) of the host. Recent modelling of the structure of SARS-CoV-2 S protein predicts that it can bind to both human DPP4 and hACE2 (112).

The diabetic patients appear to be highly vulnerable to SARS-CoV-2 infection. Given the administration of angiotensin-directed medications for diabetics, a new treatment regimen is being suggested for COVID-19 patients with diabetes (113, 114). Lately, diabetic patients have shown an alarming increase in a post-covid complication called mucormycosis, which is a highly invasive opportunistic fungal infection affecting several vital organs of the body including, the brain, eyes, ear, nose, throat and mouth (115). Mucormycosis is caused by a group of fungi called Mucormycetes (also popularly known as black fungus) and the infection has become one of the factors involved in increasing COVID-19-associated morbidity and mortality (116). The use of steroids to reduce inflammation in COVID-19 patients leads to a further increase in blood sugar levels and reduction in immunity, further increasing the susceptibility to opportunistic black fungus infections (115). In addition to diabetes, other factors which further enhance sensitivity to infection are smoking, age, and obesity (117). Similarly, hospital-acquired nosocomial infections pose additional challenges in treating COVID-19 patients, underscoring the
need for early diagnosis of these opportunistic pathogens. Pulmonary dysfunction, asthma, and bronchitis due to air pollution have also been reported to increase the chances of SARS-CoV-2-associated morbidity and mortality (118). In this context, mathematical modeling and artificial intelligence can serve as valuable tools in predicting the impact of various environmental variables and comorbid conditions on the progression of SARS-CoV-2 infection and vice versa (119). Given the multifaceted involvement of ACE-2 in SARS-CoV-2 biology and its role in comorbid conditions, there is a need to understand the association of ACE-2 expression with patient fatality rate.

Over the last year, multiple studies reported an association between the ABO blood group and COVID-19 (120–124). All these studies concur that individuals with blood group A exhibit a higher risk of SARS-CoV-2 infection, morbidity and mortality. On the other hand, individuals with blood group O exhibit a lower risk for the same parameters. In vitro studies by Guillen et al. (54) demonstrated inhibition of adhesion of SARS-CoV-expressing cells to ACE2-expressing cells by anti-A antibodies, which might explain why individuals with blood group A showed higher susceptibility to COVID-19 infection. However, these findings need to be further validated before blood groups can be used as prognostic markers.

Lower levels of certain vitamins such as vitamin D, A, and K also appear to influence SARS-CoV-2 infection and disease progression. Given the multifarious roles of these vitamins in the maintenance of mucosal membrane barriers, innate and adaptive immunity, maintenance of blood pressure and blood glucose levels, integrity and functioning of skeletal and non-skeletal tissues among other functions, their deficiency is expected to be a potential risk for SARS-CoV-2 infection and disease severity (125–131).

**DOES SARS-CoV-2 HIJACK MITOCHONDRIA TO INDUCE INFECTIONS?**

Mitochondria have been known to be involved in inducing innate immune responses primarily against viral attacks (132). Upon viral infection, damage to mitochondrial membrane results in leakage of the mitochondrial DNA into the cytosol. In addition to the viral genome, the presence of mitochondrial genome in the cytosol is sensed by cytosolic surveillance systems that recognize these cytosolic DNA called Danger Associated Molecular Patterns (DAMPs) (133). Recognition of DNA by cytosolic DNA receptors triggers immune response and inflammation leading to the recruitment of macrophages and dendritic cells. Hence, any alteration with the mitochondrial membrane during infection may lead to accelerated immune response and explain the observed clinical symptoms during COVID-19. The ACE2 receptor and TMPRSS2, a transmembrane serine protease, both used by hCoVs to enter host cells, can alter mitochondrial function, which might enable the virus to hijack mitochondria to its advantage in facilitating its spread to the neighboring cells. We have earlier shown that mutations in the SARS-CoV-2 may manipulate mitochondria even as ACE2 is regulated by its
inherent mitochondrial function (132). Moreover, the 5’ and 3’ UTR regions of the viral transcript have been found to have mitochondria localization signals (51). Several ORFs like ORF9b, ORF3b, ORF7a, and ORF8b of the SARS-CoV are also shown to be localized in the host mitochondria. These sequences have high similarity with those found in SARS-CoV-2, indicating that it is highly likely that SARS-CoV-2 transcripts may possess the ability to localize in host mitochondria too. Several SARS-CoV proteins have been known to interact with host mitochondrial proteins and yet, the knowledge remains limited regarding the cellular significance of these interactions. CoVs have been known to reside in ER-derived double membrane vesicles to avert host immune responses and therefore CoVs might have been adopted to reside in mitochondria-derived vesicles for similar purposes. These observations suggest that mitochondrial hijacking may be an essential mechanism in SARS-CoV-2 infection and therefore, drugs that selectively restore mitochondrial function and promote its biogenesis may prove to be effective anti-inflammatory agents in the treatment of COVID-19. Infection of host cells by SARS-CoV-2 induces a strong immune response which could be linked to the ability of the virus to use the host organelles such as endoplasmic reticulum (ER) for its replication. These observations further emphasize the need to understand the crosstalk between the viral proteins and the proteins of mitochondria and ER and its influence on the formation of mitochondria-derived double-vesicles (MDV) and mitochondrial antiviral-signaling proteins (MAVS), which induce apoptosis. Studies are underway to know whether or not the non-structural proteins (nsps) are an integral part of this mechanism (51). While it is also not clear how the RNA from the virus enters the mitochondria in human cells, it is hypothesized that it may interact with ACE-2 receptors in regulating mitochondrial function. Higher levels of ACE-2 have been shown to restore impaired mitochondrial function (134). As SARS-CoV-2 infection leads to mitochondrial hijacking, it negatively impacts cellular bioenergetics leading to asphyxiation, further causing fatalities. It will be interesting to know how the mutations in mitochondrial genomes in humans might contribute to diverse responses to SARS-CoV-2 infections, akin to the GWAS study conducted in the UK which identified a set of alleles associated with increased risk of mortality among COVID-19 patients (88). An epilog to this, we have also recently hypothesized how SARS-CoV-2 transgressing non-coding RNAs esp IncRNAs of the host may allow us to understand the known unknown regions of the viral genome (110).

**DISEASE MANAGEMENT OF COVID-19: POTENTIAL TREATMENT OPTIONS AND REPURPOSING THE EXISTING DRUGS FOR COVID-19 TREATMENT**

Since the onset of COVID-19, several attempts have been made to identify or develop new antiviral agents or to repurpose existing drugs to antagonize the virus. Among the antiparasitic agents, hydroxychloroquine (HCQ), chloroquine, and ivermectin were extensively tested to repurpose them against SARS-CoV-2. While some studies showed promising results, others were inconclusive (135). Several antiviral compounds that are known to act against viruses including CoVs have been explored to repurpose them against SARS-CoV-2. Among them, some of them with the most promising outcomes include, Remdesivir (GS-5734), Favipiravir, Lopinavir, and Ritonavir. Remdesivir (GS-5734), an analog of adenosine, is a broad-spectrum antiviral agent that gets incorporated into nascent RNA, resulting in premature termination of RNA synthesis (136–138). Favipiravir is another FDA-approved drug for the influenza virus that showed antiviral activity against SARS-CoV-2 via the inhibition of viral RNA polymerase (139). The HIV protease inhibitors Lopinavir and Ritonavir have been under clinical focus for their known roles in inhibiting 3C-like proteases [3CL<sup>PRO</sup> a cysteine protease that hydrolyses the Viral proteins (hCoVs)] of CoVs with which SARS-CoV-2 shares up to 96% sequence identity (140). However, recent clinical trials failed to show any significant benefits of these anti-HIV drugs against SARS-CoV-2 (141).

Additionally, some of the herbal medicines are being used or evaluated to treat COVID-19 based on findings from clinical trials or *in vitro* studies. For example, the traditional Chinese medicine made up of Qingfei Paidu Decoction (QFPD) accelerated the recovery from COVID-19 symptoms and reduced the mortality rates (142–144). Earlier, QFPD had also been shown to be effective against SARS-CoV (145). Therefore, QFPD is currently being used as one of the adjunct treatments against COVID-19 in China. Similarly, tryptanthrin, a compound isolated from the leaf of the Chinese herb, *Strobilanthes cusia*, has been explored as another treatment option since it displayed an antiviral activity against human coronavirus NL63 in a cell-type independent manner *in vitro* (146). In addition, several active phytoconstituents obtained from medicinal plant species such as *Curcuma longa* (turmeric), *Withania somnifera* (Ashwagandha), *Tinospora cordifolia* (Giloy), and *Ocimum sanctum* (Tulsi) have been subjected to molecular docking studies to identify compounds with a potential to interact with and inhibit SARS-CoV-2 proteins (147–149). Some of these compounds have shown promising results and are being pursued further.

Various computational tools have been employed to rapidly identify potential new drugs and the existing drugs for treatment of COVID-19 (150). Artificial intelligence (AI) has been deployed for predicting the structure of SARS-CoV-2 proteins which will help in identifying new drugs besides repurposing the existing drugs to treat the virus. For example, Beck et al. (151) developed a deep learning-based pretrained drug-interaction model called molecular transformer-drug target interaction (MT-DTI) to shortlist commercially available drugs for their potential to target SARS-CoV-2 viral proteins. Their findings predicted that Atazanavir, an anti-HIV drug to possess the highest inhibitory potency. Their study also predicted other drugs including Remdesivir, Efavirenz, Ritonavir, and Dolutegravir to have anti-SARS-CoV-2.
Molecular docking studies have been extensively used to identify molecules that can bind to the SARS-CoV-2 machinery and inhibit its replication (152). Docking studies of nigelleidine and hederin from *Nigella sativa* with SARS-CoV-2 main protease called 3CL\(^{pro}\) (M\(^{pro}\)), showed improved docking score for ligand binding free energies compared to Chloroquine, HCQ and Favipiravir. Therefore, these drugs have been provisionally considered as potential therapeutic agents for treating SARS-CoV-2 (153). In another study, a chemographic analysis of anti-CoV structure-activity information from a public database (ChEMBL) containing a vast pool of 800 million organic compounds, about 380 potential anti-CoV agents were identified, which needs to be experimentally tested and validated for their antiviral activity against SARS-CoV-2 (154).

Elifyk (155) built a model for the viral RdRp to test its binding affinity to some of the clinically approved drugs and drug candidates by carrying out molecular modeling, docking, and molecular dynamics simulations for the viral protein RNA-dependent RNA polymerase (RdRp). In addition to Sofosbuvir, Ribavirin, Galidesivir, Remdesivir, Favipiravir, Cefuroxime, Tenofovir, and Hydroxychloroquine showing effectiveness, new derivatives were shown to have promising results for the attachment to the SARS-CoV-2 RdRp. Recently, the crystal structure of SARS-CoV-2 3CL\(^{pro}\) (Liu et al., 10.2210/pdb6LU7/pdb) was used to screen several approved drugs or drugs in clinical trials via virtual docking (156). The findings from this study predicted several promising drugs to inhibit the 3CL\(^{pro}\). The list includes Carfilzomib (a proteasome inhibitor being used as an anticancer drug), Eravacycline (a florocycline-a synthetic analog of tetracycline), Valrubicin (an analog of doxorubicin which is an inhibitor of nucleic acid metabolism, being used to treat bladder cancer), Lopinavir (HIV-1 protease inhibitor), Elbasvir (anti Hepatitis C viral drug, which targets nsp 5A), and Streptomycin (a known antibiotic that inhibits bacterial protein synthesis). In a similar docking study, along with HIV protease inhibitors (Lopinavir, Asunaprevir, Indivivad, and Ritonavir), new molecules including Methisazone (an antiviral drug that inhibits mRNA and protein synthesis in proviruses), CGP42112A (an angiotensin AT2 receptor agonist), and ABT450 (Paritaprevir: an antiviral drug that inhibits nsp 3-4A serine protease of HCV) were predicted to bind and inhibit 3CL\(^{pro}\) of SARS-CoV-2 (157).

Furthermore, synergistic studies carried out on Lopinavir, Oseltamivir, and Ritonavir showed that when used together these drugs exhibited greater binding affinity and inhibition of the viral protease proteins than when used alone (158). In another docking study, ~1.3 billion compounds from the ZINC15 database were docked against the active site of the SARS-CoV-2 3CL\(^{pro}\) using the Deep Docking (DD) platform, which provides a fast prediction of docking scores (159). The authors identified the top 1000 potential ligands for SARS-CoV-2 3CL\(^{pro}\). In a similar study, the potential drugs from the ZINC15 database were screened for their binding affinity for S protein and 3CL\(^{pro}\) of SARS-CoV-2. The findings from this study identified Zanamivir (an anti-influenza drug), Indinavir and Saquinavir (anti-HIV drugs), Remdesivir (anti-SARS-CoV and an anti-ebola virus drug) as compounds with high binding affinities for 3CL\(^{pro}\). In addition, flavin adenine dinucleotide (FAD) adeflavin, coenzyme A, tiludronate, and Dpnh (NADH) were predicted to bind the S protein with high affinity (160). Recently, 2 deoxy glucose (2DG), an anticancer drug, has been approved for emergency use in India as an adjunct therapy to treat COVID-19. 2DG inhibits host glycolytic pathway, anti-inflammatory action and interacts with viral proteins (161, 162). An exhaustive list of repurposed drugs targeting various stages of virus life cycle and their current status of clinical trials has been listed in Almasi and Mohammadipanah (163).

## MACHINE LEARNING HEURISTICS AND ARTIFICIAL INTELLIGENCE FOR COVID-19 MANAGEMENT

The artificial intelligence (AI) and machine learning (ML) paradigms have offered effective tools and algorithms to combat COVID-19 pandemic. AI is being successfully applied for disease cluster identification, monitoring of COVID-19 patients, in determining mortality risk, disease diagnosis and management, contact tracing through geotagging, resource allocation, facilitating training of health care personnel, data management, and in predicting future pandemic outbreaks and the disease trend (164–166). The power of AI-ML in viral diagnostics and the management of COVID-19 have been summarized in various reviews (167–170) (Table 3). Clinically, computed tomography (CT), positron emission tomography–CT (PET/CT), lung ultrasound, and magnetic resonance imaging (MRI) are being used in COVID-19 diagnosis. The AI can supplement medical imaging-based COVID-19 diagnosis particularly reducing the diagnosis time (167, 206). Application of deep learning to X-ray and CT scan imaging has resulted in detection of COVID-19 with high accuracy, sensitivity, and specificity (207, 208). Such applications also effectively differentiated symptoms due to COVID-19 from bacterial pneumonia. In another novel study, AI was applied to predict the outcome of the RT-PCR-based diagnosis of COVID-19 on the basis of 16 simple parameters derived from complete blood profile (205).

Randhawa et al. (209) identified an intrinsic SARS-CoV-2 virus genomic signature in combination with a machine learning-based alignment-free approach for a fast, scalable, and highly accurate classification of whole SARS-CoV-2 genomes. They coupled supervised machine learning with digital signal processing (MLDSP) for genome analyses. Moreover, the authors claimed highly accurate real-time taxonomic classification of SARS-CoV-2 genomes simply based on raw DNA sequence, without any requirement of specialized biological knowledge or training or gene/genome annotations. Their method is extremely rapid; for example, analysis of a data set consisting of 5538 unique viral genomes with a total of ~62 Mb was carried out within a few minutes with high classification accuracy. Other applications of ML and AI in protein structure prediction,
TABLE 3 | Summary of diagnostic methods used to detect SARS-CoV-2 (171–204).

| Name of the method | Salient features/advantages | Disadvantages | Time taken for detection from the time of sample collection | Feasible for pooled testing? | References |
|---------------------|-----------------------------|---------------|-------------------------------------------------------------|-----------------------------|-------------|
| 1. Detection of RNA | Gold standard method for screening and diagnosis in the early phase of infection. Advantages include automation, high-throughput analysis and relatively reliability. Also determines relatively viral load. | Higher occurrence of false positives and false negatives, requires thermocyclers, laboratory set up and expertise to carryout the test and the analysis. Lack of symptoms in positive individuals; Highly vulnerable for errors due to cross contamination during sample collection, processing and while performing the test, High chance of laboratory error during sampling Need of skilled personnel | ~ 4-6 hours | Yes | (32, 176, 188, 205) |
| RT-LAMP | Performed using isothermal amplification. Advantages: It does not require specialized laboratory equipment (e.g. thermocyclers). Can be performed at a wide range of pH and temperature. Does not require thermocyclers, faster test results, easy to use, cost-effective, sensitivity comparable to RT-PCR Colorimetric visualization of results; Non-processed samples can be assayed. | Requires more number of primers and thereby increases chances of primer dimer formation contributing to false positives. For the same reason, primer designing is challenging. Multiplexing could be problematic. Less versatile than PCR | <1 h | Yes | (172) |
| RT-RPA | Performed using isothermal amplification. Advantages: It does not require specialized laboratory equipment (e.g. thermocyclers). Can be performed at a wider range of temperatures. Does not require thermocyclers, faster test results, easy to use, cost-effective, sensitivity comparable to RT-PCR Colorimetric visualization of results; Non-processed samples can be assayed. | Primer and probe design for RPA are less established; Less sensitive than RT-PCR and RT-LAMP. Requires higher concentrations of dNTPs. | <1h | Yes | (198) |
| RNA NASBA | Employs reverse transcription followed by amplification of RNA by T7 RNA polymerase followed by detection of the amplified RNA using fluorescent molecular beacon DNA probe. It is an isothermal reaction (41°C) and has faster amplification kinetics compared to RT-PCR and RT-LAMP; Does not require thermocyclers. Compatible for multiplexing and high throughput analysis. | Low temperature of the reaction conditions increases the chances of non-specific primer interactions. Except one, NASBA enzymes are heat-labile, requiring the addition of these enzymes after the melting step. Since the primers used are not incorporated in the amplicon and therefore labeled primers can’t be used for detection. Multi-step detection, protocol optimization is challenging. Cas13a depends on intact in vitro-synthesized RNA and therefore prone to challenges associated with RNA degradation. | 90 minutes | Yes | (179, 185) |
| SHERLOCK | Viral RNA is reverse transcribed first to produce cDNA following which fluorescently-labeled single-stranded DNA (ssDNA) reported probes are indiscriminately cleaved either through FnCas9- or Cas12a-sgRNA complex. Alternatively synthesized cDNA can be used for in vitro transcription and the RNA thus produced will activate nuclease activity of Cas13a, resulting similar cleavage of fluorescently-labeled ssDNA reported probes or Cas12based. All components of SHERLOCK can be freeze-dried; Highly sensitive and specific. Capable of detecting single target RNA/DNA molecule. Ameable for multiplexing and is one of the rapid nucleic acid detection method. | It takes weeks or months to produce high-titer antibodies and usually they are not as sensitive and specific as nucleic acid-based approaches. Often, confirmation of the negative results by | ~ 40-90 minutes | ? | (186) |
| 2. Detection of viral antigen | Antibodies specific to viral antigens are used to detect the virus. One of the most rapid methods, easy-to-perform and interpret, requiring no specialized equipment or expertise. Most suitable for point-of-care diagnostics. | It takes weeks or months to produce high-titer antibodies and usually they are not as sensitive and specific as nucleic acid-based approaches. Often, confirmation of the negative results by | ~15 minutes | No | (195) |

(Continued)
identification of potential drugs using molecular docking studies, reverse vaccinology, automating the data collection and transmission using cyber physical systems (CPS) from the current and futuristic diagnostic devices (e.g., lab-on-chip) are described in previous sections.

CONCLUSIONS

COVID-19 undoubtedly has turned out to be one of the most destructive pandemics in recent history having a negative impact on all aspects of human life. The repetitive global resurgence of apparently more infectious strains of SARS-CoV-2 has made the pandemic unrelenting. We have attempted to summarize the various critical findings pertaining to COVID-19 biology from detection to treatment. Given the fatic paradigm, there is a need for the scientific community to apply Thoughts-Action-Debate (TAD) applying Trikarna shuddhi, a Sanskrit adage of learning as we say "ome" to prepare for future pandemics.

AUTHOR CONTRIBUTIONS

PSu and PBK conceptualized the idea for the review. The authors with + sign contributed equally, performed the literature search, analyzed cited references, and wrote the original article. PSu, ORB, PBK, AKS, HKP, KKS, GC critically revised the article. All authors contributed to the article and approved the submitted version.

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SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fimmu.2021.724914/full#supplementary-material
REFERENCES

1. Shereen MA, Khan S, Kazmi A, Bashir N, Siddique R. COVID-19 Infection: Origin, Transmission, and Characteristics of Human Coronaviruses. J Adv Res (2020) 24:91–8. doi: 10.1016/j.jare.2020.03.005

2. Xie M, Chen Q. Insight Into 2019 Novel Coronavirus - An Updated Interim Review and Lessons From SARS-CoV and MERS-CoV. Int J Infect Dis (2020) 94:119–24. doi: 10.1016/j.ijid.2020.03.071

3. Zhang G, Li B, Yoo D, Qin T, Zhang X, Jia Y, et al. Animal Coronaviruses and SARS-CoV-2. Transbound Emerg Dis (2021) 68(3):1097–110. doi: 10.1111/tbed.13579

4. Gabuttii G, d’Ancheria E, Sandri F, Savio M, Stefanadi A. Coronavirus: Update Related to the Current Outbreak of COVID-19. Infect Dis Ther (2020) 9(2):241–53. doi: 10.1007/s42261-020-00395-5

5. Ciotti M, Ciccozzi M, Territoni A, Jiang WC, Wang CB, Bernardini S. The COVID-19 Pandemic. Crit Rev Clin Lab Sci (2021) 57(6):365–88. doi: 10.1080/10408363.2021.1783198

6. Helmy YA, Fawzy M, Elasawad A, Sobieh A, Kenney SP, Shetaha AA. The COVID-19 Pandemic: A Comprehensive Review of Taxonomy, Genetics, Epidemiology, Diagnosis, Treatment, and Control. J Clin Med (2020) 9(4):1225. doi: 10.3390/jcm9041225

7. Dhama K, Patel SK, Sharun K, Pathak M, Tiwari R, Yatoo MI, et al. SARS-CoV-2 Jumping the Species Barrier: Zoonotic Lessons From SARS, MERS and Recent Advances to Combat This Pandemic Virus. Travel Med Infect Dis (2020) 37:101830. doi: 10.1016/j.tmaid.2020.101830

8. Woo PCY, Lau SKP, Lam CSF, Lau CCY, Tsang AKL, Lau JHN, et al. Recent Advances to Combat This Pandemic Virus. Travel Med Infect Dis (2020) 9(2):1225. doi: 10.1016/j.tmaid.2020.02.005

9. Vijaykrishna D, Smith GJD, Zhang JX, Peiris JSM, Chen H, Guan Y. A Novel Coronavirus Causing Severe Pneumonia in Human: A Descriptive Study. Chin Med J (Engl) (2020) 133(9):1015–24. doi: 10.1097/CMJ.0000000000007222

10. Rabi FA, Al Zoubi MS, Kasasbeh GA, Salameh DM, Al-Nasser AD. SARS-CoV-2 and Coronavirus Disease 2019: What Have We Learned With the Immunopathogenesis? Adv Rheumatol (2021) 68(3):1097–110. doi: 10.1111/tbed.13579

11. Vijaykrishna D, Smith GJD, Zhang JX, Peiris JSM, Chen H, Guan Y. A Novel Coronavirus Causing Severe Pneumonia in Human: A Descriptive Study. Chin Med J (Engl) (2020) 133(9):1015–24. doi: 10.1097/CMJ.0000000000007222
Originating in Wuhan, China. *Microbes Infect* (2020) 22(2):74–9. doi: 10.1016/j.micinf.2020.01.003

87. Korber B, Fischer WD, Granhall S, Yoon H, Theiler J, Abfalterer W, et al. Tracking Changes in SARS-CoV-2 Spike: Evidence That D614G Increases Infectivity of the COVID-19 Virus. *Cell* (2020) 182:812–27. doi: 10.1016/j.cell.2020.06.043

88. Hu J, Li C, Wang S, Li T, Zhang H. Genetic Variants are Identified to Increase Risk of COVID-19 Related Mortality From UK Biobank Data. *medRxiv* (2020) 15(1):10. doi: 10.1101/2020.05.22.2006761

89. Vaidyanathan G. Coronavirus Variants Are Spreading in India -What Scientists Know So Far. *Nature* (2021) 593(7859):321–2. doi: 10.1038/d41586-021-01274-7

90. Wang Q, Zhang Y, Wu L, Niu S, Song C, Zhang Z, et al. Structural and Functional Basis of SARS-CoV-2 Entry by Using Human Ace2. *Cell* (2020) 181(4):894–904. doi: 10.1016/j.cell.2020.03.045

91. Walls AC, Park Y-J, Tortorici MA, Wall A, McGuire AT, Veesler D. Structure, Function, and Antigenticity of the SARS-CoV-2 Spike Glycoprotein. *Cell* (2020) 181(2):281–292.e6. doi: 10.1016/j.cell.2020.02.058

92. Wu J, Yuan X, Wang B, Gu R, Li W, Xiang X, et al. Severe Acute Respiratory Syndrome Coronavirus 2: From Gene Structure to Pathogenic Mechanisms and Potential Therapy. *Front Microbiol* (2020) 11:1576. doi: 10.3389/fmicb.2020.01576

93. Yoshimoto FK. The Proteins of Severe Acute Respiratory Syndrome Coronavirus. *Springer Science & Business Media* (2016). doi: 10.1007/978-3-319-42887-8

94. Korber B, Fischer WM, Gnanakaran S, Yoon H, Theiler J, Abfalterer W, et al. Tracking Changes in SARS-CoV-2 Spike: Evidence That D614G Increases Infectivity of the COVID-19 Virus. *Cell* (2020) 182:812–27. doi: 10.1016/j.cell.2020.06.043

95. Li F. Receptor Recognition Mechanisms of Coronaviruses: A Decade of Structural Studies. *J Virol* (2015) 89(4):1954–64. doi: 10.1128/jvi.02615-14
128. MacLaughlin J, Holick MF. Aging Decreases the Capacity of Human Skin to Produce Vitamin D3. J Clin Invest (1985) 76(4):1536–8. doi: 10.1172/JCI12134
129. Martineau AR, Forouhi NG. Vitamin D for COVID-19: A Case to Answer? Lancet Diabetes Endocrinol (2020) 8(9):735–6. doi: 10.1016/S2213-8587(20)30268-0
130. Priel B, Treiber G, Pieber TR, Amrein K. Vitamin D and Immune Function. Nutrients (2013) 5(7):2502–21. doi: 10.3390/nu5072502
131. Zhang D, Peng C, Zhao H, Xia Y, Zhang D, Dong H, et al. Induction of Antiviral Immune Response by Vitamin D. J Cell Physiol (2020) 235(11):22586–7. doi: 10.1111/jcpl.00224.2020
132. Roh JS, Sohn DH. Damage-Associated Molecular Patterns in Infectious Diseases. Immunome Res (2018) 14:184. doi: 10.1101/in.2018.18.127
133. Shi TT, Yang FY, Liu C, Cao L, Lu J, Zhang XL, et al. Angiotensin-Converting Enzyme 2 Regulates Mitochondrial Function in Pancreatic β-Cells. Biomed Res Int (2018) 495(1):860–6. doi: 10.1016/j.bri.2017.11.053
134. Rakedzon S, Khoury Y, Rozenberg G, Neuberger A. Hydroxychloroquine and Chloroquine Inhibit SARS-CoV-2. Biochemistry (2020) 60(5):1648–61. doi: 10.1016/j.acsbior.2020.05.098
135. Singh KK, Chaubey G, Chen JY, Suravajhala P. Decoding SARS-CoV-2. J Biomol Struct Dyn (2020) 11(3):e0025. doi: 10.5041/RMMJ.10416
136. Martineau AR, Forouhi NG. Vitamin D for COVID-19: A Case to Answer? J Clin Invest (2020) 130(6):3277–86. doi: 10.1172/jci112134
137. Shanmugarajan D, Prabitha P, Kumar BRP, Suresh B. Curcumin to Inhibit Binding of Spike Glycoprotein to ACE2 Receptors: Computational Modelling, Simulations, and ADMET Studies to Explore Curcuminoids Against Novel SARS-CoV-2 Targets. RSC Adv (2020) 10(52):31385–99. doi: 10.1039/D0RA03167D
138. Lozinsky TV, Vlase L, Machalaba D, Suravajhala P, Garg N, et al. Targeting COVID-19 (SARS-CoV-2) Main Protease Through Active Phytochemicals of Ayurvedic Medicinal Plants - Withania Somnifera (Ashwagandha), Tinospora Cordifolia (Giloy) and Ocimium Sanctum (Tulsi) - A Molecular Docking Study. J Biomol Struct Dyn (2020) 1–14. doi: 10.1080/07391102.2020.1810778
139. Baig MH, Ahmad K, Roy S, Ashraf JM, Adil M, Siddiqui MH, et al. Computer Aided Drug Design: Success and Limitations. Curr Pharm Des (2020) 26:527–81. doi: 10.1016/j.cpd.2020.05.050
140. Beck BR, Shin B, Choi Y, Park S, Kang K. Predicting Commercially Available Antiviral Drugs That may Act on the Novel Coronavirus (SARS-CoV-2) Through a Drug-Target Interaction Deep Learning Model. Comput Struct Biotechnol J (2020) 18:784–90. doi: 10.1016/j.csbj.2020.03.025
141. Yu R, Chen L, Lan R, Shen R, Li P. Computational Screening of Antagonists Against the SARS-CoV-2 (COVID-19) Coronavirus by Molecular Docking. Int J Antimicrob Agents (2020) 56(2):106012. doi: 10.1016/j.ijantimicag.2020.106012
142. Bouchentouf S, Missoum N. Identification of Compounds From Nigella Sativa as New Potential Inhibitors of 2019 Novel Coronavirus (COVID-19). Mol Docking Study (2020). doi: 10.29944/preprints202004.0079v1
143. Horvath D, Orlov A, Osoledkin DJ, Ishmukhametov AA, Marcou G, Varnek A. A Chemographic Audit of Anti-Coronavirus Structure-Activity Information From Public Databases (ChemBL). Mol Inform (2020) 39(12):e2000080. doi: 10.1002/minf.202000080
144. Elifyk AA. SARS-CoV-2 RNA Dependent RNA Polymerase (RdRp) Targeting: An in Silico Perspective. J Biomol Struct Dyn (2021) 39(9):3204–12. doi: 10.1080/07391102.2020.1761882
145. Wang J. Fast Identification of Possible Drug Treatment of Coronavirus Disease-19 (COVID-19) Through Computational Drug Repurposing Study. J Chem Inf Model (2020) 60(6):3277–86. doi: 10.1021/acs.jcim.0c00179
146. Shah B, Modi P, Sagar SR. In Silico Studies on Therapeutic Agents for COVID-19: Drug Repurposing Approach. Life Sci (2020) 252:117652. doi: 10.1016/j.lfs.2020.117652
147. Muralidharan N, Sakhivel R, Velmurugan D, Gromiha MM. Computational Studies of Drug Repurposing and Synergism of Piroxicam, Olsentamivir and Ritonavir Binding With SARS-CoV-2 Protease Against COVID-19. J Biomol Struct Dyn (2021) 39(7):2673–8. doi: 10.1080/07391102.2020.1752802
148. Ton AT, Gentile F, Hsing M, Ban F, Cherkasov A. Rapid Identification of Potential Inhibitors of SARS-CoV-2 Main Protease by Deep Docking of 1.3 Billion Compounds. Mol Inform (2020) 39(8):2000028. doi: 10.1002/minf.202000028
149. Hall DCf, Ji H-F. A Search for Medications to Treat COVID-19 via in Silico Molecular Docking Models of the SARS-CoV-2 Spike Glycoprotein and 3CL Protease. Travel Med Infect Dis (2020) 35:101646. doi: 10.1016/j.tmaid.2020.101646
150. Choi SY, Heo MJ, Lee C, Choi YM, An IS, Bae S, et al. 2-Deoxy-D-Glucose Ameliorates Animal Models of Dermatitis. Biomolecules (2020) 10(4):20. doi: 10.3390/biom1004020
151. Verma A, Adhikary A, Woloschak G, Dwarakanath BS, Papineni RVL. A Combinatorial Approach of a Polypharmaceutical Adjuvant 2-Deoxy-D-Glucose With Low Dose Radiation Therapy to Quell the Cytokine Storm in COVID-19 Management. Int J Radiat Biol (2020) 96(11):1323–8. doi: 10.1080/09553102.2020.1818865
152. Almasi F, Mohammadipanah F. Hypothetical Targets and Plausible Drugs of Coronavirus Infection Caused by SARS-CoV-2. Transbound Emerg Dis (2021) 68(2):318–32. doi: 10.1111/tbed.13734
153. Santosh KC. AI-Driven Tools for Coronavirus Outbreak: Need of Active Learning and Cross-Population Train/Test Models on Multitudinal/ Multimodal Data. J Med Syst (2020) 44(5):1–5. doi: 10.1007/s10916-020-01562-1
154. Maghdid HS, Ghafour KZ. A Smartphone Enabled Approach to Manage COVID-19 Lockdown and Economic Crisis. SN Comput Sci (2020) 1(5):271. doi: 10.1007/s42979-020-00290-0
Capacity. *Transfus Clin Biol* (2021) 28(1):51–4. doi: 10.1016/j.tracl.2020.10.008

205. Soares F, Villavicencio A, José Anzanello M, Fogliatto FS, Idiart MAP, Stevenson M. A Novel High Specificity COVID-19 Screening Method Based on Simple Blood Exams and Artificial Intelligence. *medRxiv* (2020) 2020-4. doi: 10.1101/2020.04.10.20061036

206. Dong D, Tang Z, Wang S, et al. The Role of Imaging in the Detection and Management of COVID-19: A Review. *IEEE Rev BioMed Eng* (2021). doi: 10.1109/RBME.2020.2990959

207. Li L, Qin L, Xu Z, Yin Y, Wang X, Kong B, et al. Using Artificial Intelligence to Detect COVID-19 and Community-Acquired Pneumonia Based on Pulmonary CT: Evaluation of the Diagnostic Accuracy. *Radiology* (2020) 296:E65–71. doi: 10.1148/radiol.2020200905

208. Apostolopoulos ID, Mpesiana TA. Covid-19: Automatic Detection From X-Ray Images Utilizing Transfer Learning With Convolutional Neural Networks. *Phys Eng Sci Med* (2020) 43(2):635–40. doi: 10.1007/s13246-020-00865-4

209. Randhawa GS, Soltysiak MPM, El Roz H, de Souza CPE, Hill KA, Kari L. Machine Learning Using Intrinsic Genomic Signatures for Rapid Classification of Novel Pathogens: COVID-19 Case Study. *PloS One* (2021) 16(1):e0246465. doi: 10.1371/journal.pone.0246465

**Conflict of Interest:** RP was employed by Genomix CARL Pvt. Ltd.

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