



Epigenetics at the Intersection of COVID-19 Risk and Environmental Chemical Exposures

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Abstract

Purpose of Review Several environmental contaminants have been implicated as contributors to COVID-19 susceptibility and severity. Immunomodulation and epigenetic regulation have been hypothesized as mediators of this relationship, but the precise underlying molecular mechanisms are not well-characterized. This review examines the evidence for epigenetic modification at the intersection of COVID-19 and environmental chemical exposures.

Recent Findings Numerous environmental contaminants including air pollutants, toxic metal(loid)s, per- and polyfluorinated substances, and endocrine disrupting chemicals are hypothesized to increase susceptibility to the SARS-CoV-2 virus and the risk of severe COVID-19, but few studies currently exist. Drawing on evidence that many environmental chemicals alter the epigenetic regulation of key immunity genes and pathways, we discuss how exposures likely perturb host antiviral responses. Specific mechanisms vary by contaminant but include general immunomodulation as well as regulation of viral entry and recognition, inflammation, and immunologic memory pathways, among others.

Summary Associations between environmental contaminants and COVID-19 are likely mediated, in part, by epigenetic regulation of key immune pathways involved in the host response to SARS-CoV-2.

Keywords Environmental chemicals · Infectious disease · Immune system · COVID-19 · Epigenetics

Introduction

The novel coronavirus SARS-CoV-2 has infected hundreds of millions of individuals worldwide, causing coronavirus disease 2019 (COVID-19) to become a global pandemic. In early 2020, epidemiologic research aimed at identifying COVID-19 risk factors began to occur at a rapid pace. Since that time, non-pharmaceutical interventions and vaccines

have been recognized as key to slowing transmission [1, 2]. However, despite these measures, new cases and deaths have continued to accrue. While still evolving, the current understanding of contributors to COVID-19 severity includes aging, obesity, hypertension, chronic inflammation, and other clinical factors [3–5]. Additionally, there is increasing evidence suggesting that environmental chemicals play a role. For example, data from England show air pollution exposures may be a risk factor, with nitrogen oxide (NO_x) and particulate matter (PM) levels associated with 3–12% more COVID-19 cases, and NO_x levels associated with 3% more deaths [6••]. Precisely how environmental chemical exposures affect human susceptibility to COVID-19 and the course of infection remains uncertain, but undoubtedly involve numerous immune pathways.

The fact that environmental factors can influence the immune system is well-established. The discipline of immunotoxicology dates to the early 1970s [7] and has repeatedly demonstrated that many environmental chemicals stimulate and/or suppress innate, humoral, and/or cell-mediated immune responses [8]. Yet, the clinical sequelae of such immunotoxicity are complex and considerable gaps remain

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in the knowledge of interactions between pathogens, immune responses, and environmental exposures. Prior to the current pandemic, a workshop held by the National Academies of Sciences, Engineering, and Medicine emphasized the need for transdisciplinary and translational research to address such gaps, especially molecular mechanisms [9]. Disentangling the molecular pathways by which environmental chemical exposures increase susceptibility to or exacerbate infectious diseases is paramount to identifying causal factors and facilitating interventions that prevent or reduce morbidity and mortality.

The aim of this review is to examine the evidence linking environmental chemical exposures with viral infections (including COVID-19) and to highlight immune system pathways that may be under epigenetic control as potential intermediates. Of note, the studies compiled here do not encompass indirect pathways through which exposures to environmental chemicals increase the risk for chronic diseases that predispose individuals to severe COVID-19, as the evidence that certain environmental chemicals are endocrine disruptors [10] and/or carcinogenic [11] is beyond the scope of the current review.

Summary of Immune Pathways Involved in COVID-19 Infection, Progression, and Vaccination

SARS-CoV-2 can lead to dysregulation of the innate (non-specific) and adaptive (specific) arms of the immune systems, subverting natural defense mechanisms and resulting in severe disease [12••, 13••]. A complex inflammatory response is a hallmark of COVID-19 hospitalization and death [14–16]. Although immunopathology is not the focus of this article, a basic summary of the relevant immune pathways involved in COVID-19 is critical to understand how environmental chemical exposures and epigenetic perturbations may contribute.

SARS-CoV-2 Entry to the Cell

The angiotensin converting enzyme 2 (ACE2) is a part of the renin-angiotensin system and is a major entry point for the SARS-CoV-2 virus [17, 18, 19••, 20]. ACE2 is highly expressed in the lung and binds to the spike protein on the SARS-CoV-2 virus, creating a biological vulnerability to infection [17, 18, 19••]. Higher levels of ACE2 expression are correlated with greater susceptibility to SARS-CoV-2 infection and viral loads [15]. Following attachment to the ACE2 receptor, the host protein transmembrane serine protease 2 (TMPRSS2) activates the spike protein of SARS-CoV-2, facilitating membrane fusion that allows the virus to spread in lung tissue [20]. As such, greater

TMPRSS2 expression has also been associated with severe COVID-19 [21].

Innate and Adaptive Immune Responses Following Infection

Following infection, pattern recognition receptors (PRRs), including toll-like receptors (TLRs), play a critical role in the early innate immune response [12••, 22]. TLRs recognize pathogens and trigger the release of interferon (IFN) proteins that “interfere” with viral replication [12••]. This pathway is initially delayed and diminished by SARS-CoV-2, which is unusually effective at reducing IFN production [13••]. The initial innate immune response via IFNs can profoundly impact the course of the disease: a stronger response can limit viral replication and quickly activate the adaptive immune system, whereas a weaker response can allow for rapid viral replication, delayed recruitment of the adaptive immune system, and hyperinflammation [13••, 22]. When adequate signaling occurs after infection to activate the adaptive immune system, B cells, CD4+ T cells, and CD8+ T cells are recruited to aid in controlling disease progression [13••]. Early recruitment typically results in a mild or asymptomatic case that does not necessitate hospitalization [13••]. Variation in the strength of both the innate and adaptive immune responses, therefore, contributes to the disparate outcomes observed following infection [13••].

Cytokine Alterations and Inflammatory Cell Death

Severe COVID-19 often involves a “cytokine storm,” an overproduction of pro-inflammatory proteins that leads to excessive systemic inflammation [12••]. The flood of pro-inflammatory cytokines primarily includes IFNs, interleukins (ILs), and tumor necrosis factor alpha (TNF- α) [12••, 23]. It is proposed that the underlying cause of cytokine overproduction is a weak or delayed adaptive immune response, which forces the body to “catch up” in fighting the infection [13••]. SARS-CoV-2 initiates the cytokine storm via the combination of tumor necrosis factor (TNF)- α and IFN- γ , resulting in the coordination of three distinct cell death pathways: pyroptosis, apoptosis, and necroptosis, together called PANoptosis [12••, 24]. PANoptosis induces further cytokine production, exacerbating the hyperinflammatory response and, in some cases, initiating a runaway cycle that can cause respiratory failure, exhaustion, and death [12••]. These findings highlight the complexity of the inflammatory response to SARS-CoV-2, demonstrating the vast dysregulation possible [15].

Changes in Immune Cell Composition

In addition to producing systemic inflammation, COVID-19 is associated with altered immune cell composition. The innate and the adaptive arms of the immune system are composed of distinct leukocyte subtypes. Cells of the innate immune system include granulocytes, monocytes, macrophages, and natural killer cells, among others, whereas cells of the adaptive immune system include B and T lymphocytes [25]. In severe cases of COVID-19, increased neutrophil and decreased lymphocyte counts are often observed, suggesting disruption of the immune cell milieu as an additional contributor to critical symptoms and death [14–16, 26–28].

Immunologic Memory

Following infection or vaccination, the adaptive immune system drives the induction of immunologic memory via B and T lymphocytes [13••]. The B cells secrete immunoglobulin M (IgM), G (IgG), and A (IgA) antibodies that neutralize the virus or viral infected cells [29], while the T cells support antibody production in addition to killing infected cells [30]. B and T cell responses and the longevity of resulting antibodies and immune memory can vary significantly between individuals [13••].

Epigenetic Perturbations of Immune Pathways by Environmental Contaminant Exposures

Genetics are one potential driver of susceptibility to SARS-CoV-2 infection. In a 2021 genome-wide association meta-analysis consisting of nearly 50,000 participants from across the globe, 13 loci were identified as being associated with SARS-CoV-2 infection, critical illness, or hospitalization due to COVID-19 [31]. By contrast, two recent epigenome-wide association studies (EWASs) revealed methylation levels at over 13,000 5'-C-phosphate-G-3' (CpG) sites that were associated with infection status and 44 CpG sites that were associated with hospitalization requiring respiratory support [32••, 33••, 34], suggesting that epigenetic mechanisms also contribute to the immune responses to SARS-CoV-2. Epigenetic mechanisms modify gene expression without changing the underlying DNA sequence [34] and, in addition to DNA methylation at CpG sites, include modifications to histones (proteins in the cell nucleus that DNA is wrapped around) and non-coding microRNA (miRNA) [34]. Although each of these mechanisms is critical to regulating gene expression, histone modifications are difficult to characterize at the population-level and therefore are not frequently studied, whereas measuring DNA

methylation and miRNA is feasible and increasingly being performed to better understand systems biology. Herein, we will focus on research involving DNA methylation and miRNA as potential intermediates linking classes of environmental chemicals with COVID-19 susceptibility and severity (Fig. 1).

Air Pollution

Air pollution is one of the most well-studied environmental contaminants in relation to COVID-19, partially because of wide data availability and well-known effects on the immune and respiratory systems. Air pollution is a general term that can include fine particulate matter—often categorized by diameter size as less than 2.5 μM ($\text{PM}_{2.5}$) or less than 10 μM (PM_{10})—as well as nitrogen oxide (NO_x), ozone (O_3), polycyclic aromatic hydrocarbons (PAHs), volatile organic compounds (VOCs), sulfur oxides (SO_x), and other contaminants. Epidemiological studies have established broad links between air pollutants and COVID-19 infections and deaths, particularly for PM and NO_x [6••, 35–39]. Mechanistically, air pollution may alter COVID-19 susceptibility partially through epigenetic modification of immune system pathways.

As described above, it has been established that the SARS-CoV-2 virus utilizes the ACE2 receptor and TMPRSS2 to enter and infect cells, with greater expression of ACE2 and TMPRSS2 associated with increased infection and viral load [15, 19••, 20, 21]. ACE2 and TMPRSS2 expressions have been shown to increase following air pollutant exposure, specifically PM [19••, 40]. Additionally, ACE2 and TMPRSS2 are genes known to be regulated by DNA methylation, histone modification, and miRNAs, indicating that an individual's epigenome may relate to ACE2 and TMPRSS2 expression [19••, 41, 42]. Recently, a study investigating methylation levels of ACE2 in nasal cells found differences between sex, race/ethnicity, and biological aging, with study authors indicating that nasal exposures to airborne environmental contaminants may be partially responsible for the observed changes [43•]. Nasal cells are exposed to air pollutants known to alter methylation signatures, some of which may be relevant to COVID-19 susceptibility [43•, 44]. While no known study has performed a targeted analysis on ACE2 and TMPRSS2 epigenetic changes following air pollution, EWASs and tangential evidence indicate that this connection may be possible [43•, 44].

Air pollutants are also known to alter many of the immune pathways involved in COVID-19 development after infection, partially explaining the associations observed between exposure and COVID-19 severity. A few specific pathways and key genes are worthy of further discussion: inflammation, TLRs, IFNs, and forkhead box P3 (FOX P3). Exposure to air pollutants is associated with the generation

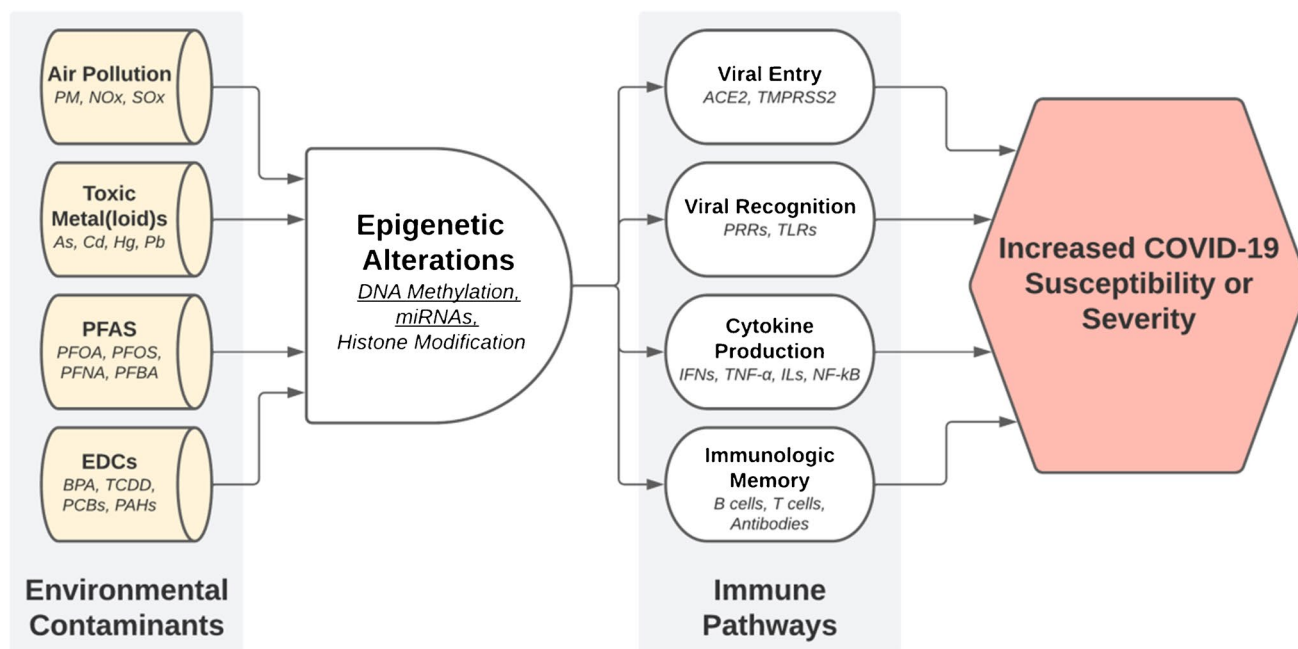


Fig. 1 Visual framework for how associations between environmental contaminants and COVID-19 may be mediated by epigenetic regulation of immune pathways, with a specific focus on DNA

methylation and microRNAs. Abbreviations: PFAS=per- and poly-fluorinated substances; EDCs=endocrine disrupting chemicals; miRNAs=microRNAs

of reactive oxygen species (ROS) and pulmonary inflammation, resulting in adverse health effects such as asthma and decreased lung function [45, 46]. Chronic exposure to air pollutants results in degradation of multiple body systems, including the respiratory and immune systems that are largely involved in COVID-19 response [47, 48]. This inflammatory response is partially mediated by TLRs, a key portion of the physiological response to SARS-CoV-2 [12••, 13••, 49]. Exposure to PM has been associated with altered methylation levels of TLR genes, potentially altering the expression of these important immune receptors [50, 51]. Disruption of some TLRs predispose individuals to severe COVID-19, highlighting the need for further investigation of epigenetic regulation as a potential mechanism. In addition to inflammation and TLRs, air pollutants interact with IFNs, which are also known to play a large role in recruiting an effective immune response to COVID-19. Exposure to air pollution has been shown to increase methylation of *IFN-γ*, a gene involved in combatting viral replication and triggering inflammation [52, 53]. Although *IFN-γ* (type II) is not as robustly associated with COVID-19 development as type I and III IFNs, these findings nevertheless present a possibility for changes relevant to COVID-19 risk [12••]. Finally, ambient air pollution is known impair the function of regulatory T cells via hypermethylation of the *FOXP3* gene. Regulatory T cells function to suppress immune response, and impairment of this process may make hyperinflammation more likely, a hallmark of severe COVID-19 [54].

Lastly, emerging evidence shows that greater air pollutant exposure is associated with lower titers of neutralizing antibodies to the SARS-CoV-2 virus following vaccination [55]. Similar associations were observed with other vaccines, and it is suggested that air-pollution-induced chronic inflammation may mediate associations with vaccine efficacy [55, 56]. We propose that epigenetics may play a role in this, regulating the increased inflammatory and decreased antibody responses.

Toxic Metal(loid)s

Arsenic (As), cadmium (Cd), mercury (Hg), and lead (Pb) are considered among the most significant potential threats to human health due to their toxicity and ubiquity [57]. As a result of both natural and anthropogenic processes, toxic metals and metalloids are widespread throughout the environment and are present in the air, water, soil, and food supply. For most individuals, exposures occur via ingestion of contaminated foods and drinking water, but exposure can also stem from cigarette smoke, industrial emissions, and certain occupations [58].

Lead is among the most well-studied toxic metal with respect to immunological effects following chronic exposures. Numerous epidemiologic studies have reported associations with increased susceptibility to infections [59, 60] and inflammation [61, 62], as well as altered humoral [63] and altered cell-mediated immunity [64–67]. Recently, there

has been evidence to suggest that greater exposures to lead increase the risk for severe COVID-19, with severe cases excreting more lead in their urine relative to mild-to-moderate cases [68•]. One potential mechanism underlying lead-associated COVID-19 severity is differential methylation of runt-related (RUNX) transcription factor genes. In a 2015 study of children aged 3 months to 5 years from Detroit, blood lead levels were found to correlate with differential methylation of *RUNX1* and *RUNX3* [69]. These genes are essential for hematopoiesis (the process of blood cell formation), especially the development of B and T cells involved in the adaptive immune response [70]. Divergent B and T cell responses to SARS-CoV-2 have been hypothesized to be a key contributor to infection severity, as patients requiring intensive care unit (ICU) admission often exhibit an impaired CD4+ T cell response coupled with elevated antibody titers as compared to patients with more mild disease [71]. COVID-19 patients requiring ICU care are also more likely to be male [72], raising questions about sex-based differences in molecular pathways linking environmental exposures, epigenetics, and immune responses to SARS-CoV-2. Interestingly, the effects of lead exposure on methylation of RUNX genes may be sex-specific, with an inverse association observed for *RUNX1* in males and a positive association observed for *RUNX3* in females [69]. Future studies examining the role of toxic metal exposures in relation to COVID-19 severity should consider biologic sex as a potential modifying factor.

Other research points to the metalloid inorganic arsenic as a potent immunotoxicant with relevance for COVID-19. While studies have not yet investigated how arsenic is specifically related to SARS-CoV-2 infections, studies have linked higher exposures with other respiratory infections [73, 74, 75••]. Exposures that occur while in utero appear to be particularly important. In humans, prenatal arsenic exposures are associated with an increased risk of developing respiratory infections during the first year of life [73, 74]. In animals, the effects of prenatal arsenic exposures persist into adulthood, as evidenced by a 2020 study of mice exposed to arsenic in utero and later infected with the influenza A virus as adults [75••]. Compared to control mice, the arsenic exposed mice had greater lung damage and inflammation [75••]. Interestingly, the investigators noted that the exposed mice were *not* more likely to become infected with the influenza A virus [75••], and therefore reason that earlier epidemiologic studies may have been capturing respiratory infections that were more symptomatic [73, 74]. They propose that prenatal arsenic exposures influence the course of infectious disease progression, rather than susceptibility to infection per se. In support of this premise, the 2020 in vivo study additionally demonstrated that the hyperinflammatory response to the influenza A virus manifested with dysregulation of innate immune function of monocyte-derived

macrophages, neutrophils, natural killer cells, and alveolar macrophages [75••]. This distinct phenotype is consistent with observational research showing epigenetic effects of prenatal arsenic exposure in human populations. As a specific example, profiling of cord blood from newborns prenatally exposed to arsenic via maternal ingestion of contaminated drinking water in Gómez Palacio, Mexico, revealed increased expression of 12 miRNAs with known roles in inflammatory response [76]. Of the 12 altered miRNAs, nine were predicted to target 66 mRNAs involved in TLR, nuclear factor kappa B (NF- κ B), and IFN signaling pathways [76]. Within the context of COVID-19, alterations of such pathways are associated with a poorer prognosis, characterized by hospitalization and death [77]. Research is needed to determine if altered miRNA expression is a mechanism interlinking toxic metal exposures with COVID-19 severity and whether there are important windows of susceptibility.

The toxic metal cadmium has also been hypothesized to contribute to COVID-19 outcomes. Cadmium is a major constituent of tobacco smoke and smokers have a markedly increased risk of hospital admission and death from COVID-19 [78, 79]. Although cadmium exposure has not yet been investigated as a mediator of associations between smoking and COVID-19 outcomes, there are data linking cadmium to other relevant endpoints. A 2020 analysis of the National Health and Nutrition Examination Survey (NHANES) participants aged 45 and older found that greater cadmium exposures, as measured in urine and blood, were prospectively associated greater mortality from influenza and pneumonia [80]. Mechanistically, cadmium exposure can modify DNA methylation signatures in whole blood and alter miRNA expression in peripheral blood leukocytes as well as serum [81–83]. Of particular interest is a 2021 study in which men occupationally exposed to cadmium were found to have threefold higher expression of miR-221, which was correlated with higher proportions of T helper 17 (Th17) cells and serum IL-17 levels [83]. Th17 cells are a distinct subset of T helper cells that produce the highly pro-inflammatory cytokine IL-17 [84]. Recently, the IL-17 signaling pathway has been shown to become highly activated by SARS-CoV-2 [85], prompting calls to consider it as a possible target for the treatment of COVID-19 [86]. If substantiated by longitudinal data, the data presented here suggest that reducing cadmium exposure and/or epigenetic perturbations could be additional targets for improving COVID-19 outcomes.

Finally, there is evidence that mercury is toxic to humans with wide-ranging effects on the immune system. Methylmercury is the predominant mercury compound encountered in the environment and ingestion of contaminated seafood is the most common route and source of exposure [87]. In an epidemiologic study of fish consumers from the Amazonian region of Brazil, greater methylmercury exposures

were associated with higher levels of pro-inflammatory (IL-6, IL-17, and IFN- γ) and anti-inflammatory (IL-4) serum cytokines [88]. That methylmercury was positively associated with both pro- and anti-inflammatory cytokines supports the notion that exposures induce broad immunotoxic effects. Suppression of the developing immune system appears to be one such consequence of prenatal mercury exposure, as evidenced by data from the New Hampshire Birth Cohort Study showing greater maternal mercury exposures during pregnancy from fish consumption (reflecting methylmercury) and having dental amalgams (reflecting elemental mercury) were associated with elevated risks of respiratory infections in infants [89]. In another analysis of New Hampshire Birth Cohort Study data, prenatal mercury exposures were associated with differential DNA methylation signatures in umbilical cord blood that were related to shifts in leukocyte composition [90]. Specifically, cord blood DNA methylation measurements were used to infer leukocyte proportions and greater prenatal mercury exposures were found to correlate with lower estimated proportions of monocytes [90]. Monocytes are a type of leukocyte responsible for identifying and destroying pathogens and eliminating infected cells and individuals with persistently low numbers of monocytes (“monocytopenia”) are at increased risk of developing severe COVID-19 [91]. Whether the pleiotropic effects of mercury are relevant to the development and progression of COVID-19 remains to be studied, but warrants consideration given the ubiquity of mercury in the environment.

Per- and Polyfluorinated Substances (PFAS)

PFAS refer to a group of > 4000 toxic chemicals used in a variety of manufacturing processes, many of which have become environmental contaminants [92]. Within the broad class of PFAS, there are numerous chemicals, including perfluorooctanoic acid (PFOA), perfluorooctane sulfonate (PFOS), perfluorononanoate (PFNA), perfluorodecanoate (PFDA), perfluorobutanoic acid (PFBA), perfluorohexane sulfonate (PFHxS), and “alternatives” such as GenX [92–94]. PFAS are known to accumulate within the body and lead to a variety of outcomes, including immunosuppression, reduced vaccine response, and epigenetic changes [95, 96••]. Recent research has also shown associations between PFAS exposure and COVID-19 severity and mortality [97••, 98]. In particular, elevated plasma concentrations of PFBA have been associated with severe COVID-19 (odds ratio 2.10 [95% CI, 1.02, 4.33]) and strongly associated with ICU admission or death (odds ratio 5.18 [95% CI, 1.29, 20.72]), with effects similarly observed both men and women [97••].

In relation to modifying viral entry, PFAS are suspected to increase *ACE2* and *TMPRSS2* expression through

hypomethylation, leading to increased vulnerability to the SARS-CoV-2 virus [95]. Animal studies support this hypothesis: researchers have observed downregulation of DNA methylation regulators (*DNA methyltransferases* and *Ten Eleven Translocation (TET) enzymes*) and upregulated expression of *ACE2* and *TMPRSS2* in mice following PFOA exposure, in addition to differential methylation in the *TMPRSS2* gene promoter [95].

PFAS are also known to alter innate and adaptive immune function, with most studies suggesting suppressive effects [99–103]. For instance, in mouse models, PFAS exposures have been shown to decrease IgM antibody production and levels, a comprehensive measure of general immune response [104, 105]. Other research has associated PFAS with perturbations of T cells [106, 107], B cells [105], macrophages [103], and neutrophils [103], along with atrophy of the thymus and spleen [102]. Alteration of these immune functions may have implications for COVID-19 progression, as delayed or suppressed immune responses are hypothesized to influence disease severity [13••]. However, existing research examining immunosuppression prior to infection has found no significant association with the onset of critical COVID-19 symptoms [108, 109]. Nevertheless, previous studies have been limited due to small sample sizes [108, 109], and PFAS-associated immunosuppression may still predispose an individual to more severe COVID-19 outcomes. In addition to immune suppression, PFAS have been associated with dysregulation of inflammatory responses and chronic inflammation in humans, pathways known to play a role in COVID-19 development [101, 110]. Specific outcomes and pathways vary by study type (rodent, cell culture, epidemiological, etc.), but have included peroxisome proliferator-activated receptor alpha (PPAR- α), NF- κ B, IFNs, and various cytokines [101].

It is plausible that some of the immunomodulatory effects associated with PFAS may be under epigenetic regulation. In a 2021 study of firefighters, exposures to PFOA, PFOS, PFNA, PFDA, and other PFAS were associated with changes in DNA methylation for a number of genes associated with immune function [96••]. In particular, PFNA was associated with differential methylation of the *Schlafen* family member 12 (*SLFN12*) and *IL-32* genes that are upregulated during viral infection and T cell activation [111, 112], while PFDA was associated with differential methylation of dual specificity phosphatase 19 (*DUSP19*) and glycerol-3-phosphate dehydrogenase 2 (*GPD2*), two genes involved in regulating inflammatory response [96••, 113, 114]. Other research has shown hypermethylation following PFOS exposures of the genes ring finger protein 39 (*RNF39*) and major histocompatibility complex, class II, DQ beta 1 (*HLA-DQB1*), both associated with autoimmune conditions [115, 116]. Taken together, these studies provide evidence that PFAS may alter COVID-19 risk via similar epigenetically-regulated immune

pathways; further research is necessary to investigate this relationship.

Finally, PFAS are associated with decrease effectiveness of various vaccines, including tetanus [117, 118], diphtheria [118, 119], measles [120], rubella [121], and influenza [122], particularly when immunized following PFAS exposures in early life. Because of this, concerns have been raised that PFAS may reduce COVID-19 vaccine effectiveness, potentially increasing susceptibility to breakthrough infections or temporally shortening the duration of protection. Although no known research has explored the intersection of PFAS, vaccine effectiveness, and epigenetic alterations, the epigenetic immune modifications previously discussed may provide mechanistic insights into the decreased antibody response observed after vaccination.

Other Endocrine Disrupting Chemicals (EDCs)

The broad class of EDCs represent contaminants that alter normative hormone function in the body, resulting in vast complications. In addition to metals and PFAS (each discussed above), EDCs include bisphenol A (BPA), 2,3,7,8-tetrachlorodibenzo-p-dioxin (TCDD), flame retardants, pesticides, phthalates, polychlorinated and polybrominated biphenyls (PCBs and PBBs), polycyclic aromatic hydrocarbons (PAHs), dichlorodiphenyltrichloroethane (DDT), and hundreds more [123]. Not surprisingly, EDC exposure has been suggested to increase COVID-19 risk through a variety of immune pathways [124••, 125, 126]; this section will consider a few examples, but there are hundreds of EDCs that could be discussed [127].

The entry of SARS-CoV-2 into the body depends, at least in part, on the expression of *ACE2* and *TMPRSS2*. Altered expression of these genes following EDC exposure, specifically BPA, has been observed in some, but not all studies [19••, 126, 128]. While more research is necessary to determine a consistent association, complex epigenetic regulation may be involved in altering expression based on known epigenetic involvement with *ACE2/TMPRSS2* [41] and EDCs [127].

EDCs are also known to suppress the immune system, potentially conferring COVID-19 risk. TCDD, for example, is known as a potent immunosuppressant, altering the aryl hydrocarbon receptor [129] and resulting in dysregulated T cell differentiation [130•]. TCDD-associated epigenetic regulation of *FOXP3* and *IL-17* is understood as a part of this immunosuppressive pathway, altering the master regulator of regulatory T cells [130•, 131]. As previously discussed, a weak initial immune response to the SARS-CoV-2 virus may predispose an individual to a more severe course of disease.

EDCs additionally dysregulate numerous facets of the immune system, including T cells, natural killer cells, dendritic cells, macrophages, and neutrophils [127, 132,

133]. For example, BPA has been shown to interact with cell signaling pathways, dysregulating the innate and adaptive immune system by altering chemokine/cytokine levels (observed in COVID-19 patients), inducing inflammation and related inflammatory diseases [126, 133, 134], and altering the function of numerous immune cells [133]. TCDD has shown similar dysregulation of adaptive immune responses, altering T cell function and differentiation [129]. These selected examples are not unique; other EDCs have demonstrated similar effects that alter immune function [135, 136]. Immunomodulation by BPA, TCDD, and other EDCs may exacerbate COVID-19 immune dysregulation, increasing susceptibility for severe disease.

Epigenetic dysregulation is a proposed mechanism by which EDCs may lead to biological effects, both from directly interacting with the epigenome and from perturbing hormonal pathways that alter the epigenome [127]. EDC-associated epigenetic changes in DNA methylation levels, miRNAs, and histone acetylation have been observed related to the immune system for TCDD [137], BPA [138], DDT [138], PCBs [139], PBBs [140], nonylphenol [141], and 4-octylphenol [141], with many EDCs understudied. Some of these epigenetic changes have been linked to transgenerational health effects, increasing the complexity and importance of EDC exposure [142]. We suggest the examination of epigenetically-regulated immune pathways as a recommendation for future study investigating EDC exposure and COVID-19 susceptibility.

Potential Implications and Further Study

While direct evidence that environmental chemicals contribute to the current pandemic is still sparse, it is clear that exposures to such chemicals may impact host susceptibility to SARS-CoV-2 and the clinical course of COVID-19. Given the breadth of chemicals in the environment and their known impacts on human health, there are several ways to move forward. Most broadly, there is a need for continued public and private environmental cleanup efforts to reduce human exposures to toxic chemicals, mitigating some of the effects detailed above. In relation to COVID-19, there is a need to weigh environmental contaminant exposures as risk factors and to prioritize the following research:

- 1) Quantify the direct impacts of exposures to air pollutants, toxic metal(loid)s, per- and polyfluorinated substances, other endocrine disrupting chemicals, and their mixtures on COVID-19 susceptibility and severity.
- 2) Understand the specific epigenetic mechanisms and immune pathways linking environmental chemical exposures and adverse COVID-19 outcomes, especially whether any are reversible.

- 3) Identify susceptible widows of exposure and sensitive sub-groups, including assessments of early life exposures and differences in exposure-outcome associations by biological sex.
- 4) Discover and validate minimally-invasive biomarkers that can identify individuals at risk of severe COVID-19 due to environmental chemical exposures.
- 5) Develop interventions to limit chemicals in the environment or mitigate adverse health impacts of exposures in severe COVID-19 cases (e.g., for metal-associated immunotoxicity, interventions could include nutritional supplementation or chelation therapy).
- 6) Evaluate the need for boosters to strengthen COVID-19 vaccine effectiveness among individuals highly exposed to immunotoxic environmental chemicals.
- 7) Converge aspects of epidemiologic and experimental study design and dissemination of findings that can support rapid environmental policy making.

Finally, greater collaboration between environmental health scientists, molecular epidemiologists, immunologists, and infectious disease researchers conducting basic and translational science is needed to promote increased understanding of the interactions between environmental chemicals and infectious diseases, including epigenetic contributions. Breaking down disciplinary silos would better enable taking adaptive actions to respond to COVID-19 and pre-emptive actions to possibly prevent future pandemics.

Conclusion

In conclusion, numerous environmental contaminants are associated with epigenetic modification of immunomodulatory genes involved in viral entry, viral recognition, cytokine production, and immunologic memory. Several of these immune pathways overlap with those involved in the host response to the SARS-CoV-2 virus. Epigenetic regulation of the immune system may be a significant molecular mechanism underpinning associations between environmental chemicals and COVID-19 outcomes.

Author Contribution C.M.B. and A.E.E. performed the literature search and drafted the manuscript. R.C.F. critically revised the manuscript.

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Declarations

Human and Animal Rights This article does not contain any studies with human or animal subjects performed by any of the authors.

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