

1 How does the macroenvironment influence brain and behaviour – a review of current 2 status and future perspectives

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37 ABSTRACT

38 The environment influences mental health, both detrimentally and beneficially. Current research
 39 has emphasized the individual psychosocial ‘microenvironment’. Less attention has been paid to
 40 ‘macro-environmental’ challenges including climate change, pollution, urbanicity and socioeco-
 41 nomic disparity. With the advent of large-scale big-data cohorts and an increasingly dense map-
 42 ping of macroenvironmental parameters, we are now in a position to characterise the relation be-
 43 tween macroenvironment, brain, and behaviour across different geographic and cultural locations
 44 globally. This review synthesises findings from recent epidemiological and neuroimaging studies,
 45 aiming to provide a comprehensive overview of the existing evidence between the macroenviron-
 46 ment and the structure and functions of the brain, with a particular emphasis on its implications
 47 for mental illness. We discuss putative underlying mechanisms and address the most common
 48 exposures of the macroenvironment. Finally, we identify critical areas for future research to en-
 49 hance our understanding of the aetiology of mental illness and to inform effective interventions for
 50 healthier environments and mental health promotion.

51 Introduction

52 The environment refers to the broader ecological context in which an individual exists, interacts,
 53 and adapts (1), and may have direct and indirect effects on mental health (2). It can be broadly
 54 divided into the “macroenvironment”, encompassing environmental characteristics at the neigh-
 55 bourhood or larger level, and the “microenvironment”, which relates to the individual psychoso-
 56 cial level (3). The macroenvironment includes factors such as urbanisation, climate patterns, geo-
 57 logical features, and ecosystem interactions, as well as socioeconomic disparity – all of which are
 58 undergoing rapid and dynamic changes. Urbanisation continues at unprecedented rates, with more
 59 than 50% of the population residing in cities (4), involving the expansion of infrastructure and
 60 shifts in land use patterns and population density. These alterations contribute to increased envi-
 61 ronmental pollution and decreased availability of natural spaces (4). Climate change results in
 62 rising temperatures, changed weather patterns, and extreme weather events (5). These factors are
 63 interconnected, and changes in one may trigger or amplify changes in another.

64 Mental disorders ranked among the three leading causes of health loss globally, consistently con-
 65 tributing to over 14% of age-standardised years lived with disability during the past three decades
 66 (6). It has been suggested that adverse macroenvironmental factors contribute to an increased risk
 67 of mental health disorders (7–9) and may account for more than 20% of population attributable

68 risk of mental disorders (10,11). While extensive research has explored the influence of the micro-
69 environment on brain and mental health, the significance of the macroenvironment has only re-
70 cently attracted attention. Mental illness may result from accumulated exposure to single or mul-
71 tiple environmental factors throughout the individual's life course. In almost all cases, there is a
72 complex interplay between risk and protective factors of micro- and macroenvironment.

73 In view of these complex dynamics, it is essential to understand how the macroenvironment con-
74 tributes to the occurrence of mental illness and which are the neurobiological underpinnings of
75 this relationship. In the following sections, we document the association of the macroenvironment
76 with brain structure and function and attempt to connect these findings to potential risks of mental
77 illness. We address the most common macroenvironmental exposures that encompass immediate
78 environmental factors, such as air, noise and light pollution, proximal factors comprising regional
79 socioeconomic characteristics, and distal factors, like urbanisation, natural spaces, and climate.
80 These macroenvironmental exposures are mostly modifiable, presenting opportunities for inter-
81 ventions and strategies to promote the structural and functional integrity of the brain and mitigate
82 the burden of mental illness.

83 **Search strategy and study selection**

84 We conducted a literature search on the association between modalities of the macroenvironment
85 and magnetic resonance imaging (MRI)-assessed brain structure and function in PubMed from
86 January 1, 2010, to April 19, 2023. We used predefined search terms (**Supplementary Infor-**
87 **mation**), with no restrictions applied except for the filter [Humans]. In short, MeSH (Medical
88 Subject Headings) terms and title/abstract text words related to environmental exposures were
89 employed, including urbanisation, air, noise and light pollution, green space, blue space, regional
90 socioeconomic factors, climate, weather extremes, combined with MRI-detected brain changes in
91 structure and function. The reference lists of relevant systematic reviews identified in our formal
92 search were hand-searched for relevant literature. Furthermore, studies known to the authors were
93 added. Publications on animal models and cell lines were excluded. Studies investigating the as-
94 sociation between indoor air pollution and occupational hazards with brain plasticity were further
95 excluded.

96 **Air pollution**

97 Air pollution arises from natural phenomena, like dust storms or wildfires, and from human activ-
98 ities, such as industrial processes and transportation. It includes solid particles and liquid droplets

suspended in the air, referred to as particulate matter (PM), and gases, like ground-level ozone, sulphur dioxide (SO₂), nitrogen oxides (NO_x: NO + NO₂), carbon monoxide (CO), polycyclic aromatic hydrocarbons (PAH) and others (12). Each of these pollutants may have independent and potentially synergistic effects; however, the impact of exposure to a combination of air pollutants on human health is not well understood (13).

Air pollutants enter the body through the respiratory system, initiating a cascade of physiological and biochemical responses affecting different tissues and organs, including the brain (14,15). Pollutants translocate across the blood-brain barrier and can induce systemic inflammation (14), compromising the permeability of blood-brain barrier (16). Air pollution-related neuroinflammation was associated with neurotoxicity, oxidative stress, and impaired control of inflammatory processes (17,18). The developing brain is highly vulnerable to toxicants during two critical developmental periods, the foetal and early life, due to the limited barrier function of the placenta and blood-brain barrier, and potential toxicant transfer during breastfeeding (19).

Prenatal and early childhood exposure to several components of traffic-related air pollution (TRAP), such as PM, PAH, airborne copper and organic carbon, appear to influence brain development in later childhood and adolescence (20–28), including the corpus callosum (21,28), limbic system (21,26), nucleus accumbens (NAc) and cerebellum (21,27) (see **Table 1** for a detailed description). In addition to these structural changes, TRAP exposure is associated with functional connectivity (FC) changes, mainly in frontocortical areas and the default mode network (DMN) (29,30).

Prenatal exposure to fine PM (PM_{2.5}) and PAH is associated with smaller white matter (WM) volume in parietal lobes (26), and WM surface reductions in the left hemisphere, mediating the association between air pollutants and conduct disorder problems (25). Furthermore, early life exposure to TRAP is associated with increased frontotemporal cortical thickness in children and adolescents (21,26,27). Alterations in global WM microstructure, including increase fractional anisotropy, and in several WM microstructure tracts were documented (21). Hemispheric asymmetry in WM and gray matter (GM) volumes across all cortical regions and several subcortical regions has been observed (29,31–34). While brain asymmetry is a typical trait in humans, it can be altered and has been linked to psychiatric disorders (35–37).

The vulnerability of the brain to air pollution extends beyond early brain development and includes later stages of life. Studies among adults exposed to different components of air pollution, reported volume reductions in total cerebral brain (38), total WM and GM (39–42), deep-GM (43) and local atrophy mainly in frontocortical areas, insula and subcortical regions (44–51), which partially mediated the association between PM_{2.5} and NO₂ with depressive symptoms (50).

Functional neuroimaging studies reported a reduced stress-related activation in connectivity networks associated with acute stress, such as the salience, DMN, and central executive networks, in adults with higher exposure to air pollution (52), and augmented stress-related information transfer across cortical and subcortical brain networks among participants with a higher polygenic risk score for depression (53); suggesting that air pollution may increase vulnerability to mood dysfunction and potentially inhibit an appropriate stress response.

Taken together, it becomes apparent that exposure to air pollution has diverse and hemisphere-specific implications on brain morphology and function in children and adults (**Table 1**). Air pollution effects on brain regions appear to vary depending on the specific pollutant and period of assessment during the lifespan. Although concrete conclusions cannot be made, disruptions were observed in regions such as prefrontal cortex (PFC), ACC, hippocampus, amygdala, insula, NAc, corpus callosum and striatum, all of which have been implicated in the risk for major psychiatric disorders (54,55), like depression, anxiety (56–59), substance use disorders (60,61) and schizophrenia (54,62).

Epidemiological studies have provided evidence linking air pollution to mental health disorders in exposed youth and adults (63). Recent meta-analysis highlighted a positive association between PM_{2.5}, PM₁₀ and NO₂ exposure with risk for depression (72) and suicide (64). Furthermore, evidence supports that short- and long-term exposure to PM_{2.5} is linked to an increased risk for anxiety, while exposure to PM₁₀, NO₂, and NO_x might increase the risk for schizophrenia or hospitalisation for schizophrenia (65,66). By linking epidemiological approaches on air pollution with neuroimaging data, future studies can help elucidate mechanisms by which air pollution-induced neuroinflammation and other potential biological pathways, such as stress response (17) may affect brain, behaviour and psychopathology.

Noise pollution

Noise pollution originates from urban traffic, airports, industries, and construction sites and can evoke negative emotions and annoyance. Prolonged exposure to disruptive noise is thought to induce brain alterations through mechanisms such as sleep disturbances, which prompt a pro-oxidative environment, predisposing to neuroinflammation, and heightened hypothalamic-pituitary-adrenal (HPA)-axis reactivity (67,68), that might contribute to mental illness (69,70). Residents in a community impacted by changed flight patterns compared to a demographically similar non-impacted community, showed a higher risk for substance use and mental health-related emergency visits among individuals living in noise-affected communities, particularly in younger age groups (71). Meta-analyses have reported increased odds for depression and anxiety with higher 24-h

noise level (72). Still, the association between noise and mental health is limited due to high risk-of-bias studies and inconsistent findings across studies included in the different systematic reviews (72–74).

The relation between noise pollution and brain structure and function remains understudied and is also afflicted with inconsistent findings (75,76). A study on 8–12 year-olds exposed to school road-traffic noise over one year reported enhanced connectivity in the subcortical auditory pathway (77), indicating possible enhancement on auditory processing abilities but also increased sound sensitivity and sensory overload. Whether these results, along with potential noise-induced chronic stress and sleep disturbance contribute to anxiety and behavioural problems in children requires further investigations. Among older adults participating in a 5-year study, higher noise pollution was associated with cognitive decline and alterations in brain network organisation were found (44,52). Further studies on the behavioural and cognitive consequences of noise pollution across the lifespan are required to provide robust evidence and establish explicit mediating brain structures and functions.

Light Pollution

Light pollution, a consequence of human activities, including outdoor lighting, commercial signage, and illuminated buildings, produces excessive or misdirected artificial light and disrupts the natural darkness of the night sky. Exposure to artificial light at night (ALAN) has become increasingly prevalent, especially in urban areas. Light is detected by the retina and transmitted through the intrinsically photosensitive retinal ganglion cells (ipRGCs) to the suprachiasmatic nucleus in the hypothalamus and other brain regions involved in regulating circadian rhythms and sleep-wake cycles (78). Circadian rhythm disruptions have been linked to an elevated risk of major depressive disorders, bipolar disorders, and heightened mood instability (79), potentially mediated by oscillations in clock genes expression responsive to light-dark transitions (80). Light is also projected (via the ipRGCs and the suprachiasmatic nucleus) to regions involved in mood regulation, such as the PFC, hippocampus, and amygdala (81,82), directly influencing emotional processing and mood functions (83,84). Hence, prolonged and ill-timed ALAN exposures may precipitate or worsen symptoms of mood disorders.

Cross-sectional analyses reported an increased prevalence of mood and anxiety disorders in adults and adolescents with higher exposure to outdoor ALAN (85–87). However, residual confounding due to air pollution has likely influenced the results (87). We found no studies examining the relationship between ALAN and brain structure and function. Participants exposed to dim ALAN during one-night sleep in a polysomnography laboratory exhibited decreased brain activity in the

inferior frontal gyrus (IFG) compared to a night without any light exposure (88). Decreased activation in the IFG has been associated with impairments in executive functions and reported in clinical populations afflicted with bipolar disorder, depression, and schizophrenia (89–92). Still, further research is needed to elucidate the effects of light pollution on brain changes.

Urbanisation

Urbanization is a shared element in global migration patterns over the past half-century, involving the transition from rural to urban settlements (4). Historically, this transition has been linked to economic growth. Urban dwellers are more likely to benefit from sustainable infrastructure, essential education, healthcare services, and more work opportunities than rural residents. Despite these advantages, urban environment is inhomogeneous, depicted by economic, social and environmental inequalities (4,93). Rapid and unplanned urbanisation increases income inequalities, linked to disparities in health and education, marginalisation, social isolation and threat, and environmental pollutants (93–95). The urban environment is associated with mental disorders, such as depression, anxiety and schizophrenia (95–100), with urban upbringing identified as the most prominent risk factor for schizophrenia (9,98).

A common underlying mechanism linking urban living stressors to vulnerability to mental illness has been suggested to be the dysregulation of the HPA-axis (17,93,101,102), potentially resulting in cerebral functional and structural changes (103). Moreover, urban environments may interact with genetic variations in genes related to stress response and brain structure, such as neurodegeneration, neural differentiation, and axon growth (104). Various neuroimaging studies reported the association between urban environment and functional changes in stress-related brain regions (105,106). Current city living and urban upbringing associated with increased activity in the amygdala-hippocampus complex and subgenual ACC during a stress task in healthy adults (107,108). The ACC is a key region for regulating amygdala function, negative emotions, and stress and has been proposed to mediate the relationship between medial PFC (mPFC) activity and affective symptoms (109). Among individuals with an urban upbringing, activity alterations in those brain regions were modulated by genes related to dopamine, anxiety, and stress phenotypes, whereas such effects were not evident in individuals with a rural or small-town childhood (110,111).

Urban upbringing is associated with reduced hippocampal and amygdala volumes among adolescents (112) and dorsolateral PFC (dlPFC) and mPFC in adults (113,114). Healthy adults with higher urban upbringing scores were observed to have cortical thinning in the dorsolateral, mPFC, and parahippocampal cortex (115), although findings are not consistent (116). Stress-induced vol-

ume reductions in the observed regions during childhood are associated with depression, psychosis, and post-traumatic stress disorders in later life (117–119), while the identified cortical thinning aligns with regions implicated in psychiatric conditions, including schizophrenia and bipolar disorders (120). To what extent brain changes in these disorders are driven by urbanicity remains to be determined.

The urban environment encompasses various economic, social, ambient, and infrastructural characteristics. Current literature assessed urban living based on a measure of population density and duration of residency (literature is described in this section) or by using isolated factors, such as pollution, urban green spaces, and socioeconomic deprivation, which often co-occur and interact within individuals' living environment. A study using a composite measure of urban living, including night-time lights, green space, build-up space, water bodies and land use, reported an association with reduced mPFC volume, increased cerebellum volume, and decreased functional network connectivity within the mPFC of the anterior DMN that was observable in two cohorts of young adults residing in Europe and China. The observed neural correlates mediated the association between urban living and depressive symptoms (121). In addition, analyses on a comprehensive set of factors related to urban living identified environmental profiles relevant to psychiatric symptoms among adults. In particular, an environmental profile predominantly characterised by regional deprivation, pollution and density of urban infrastructure was positively associated with affective symptoms and mediated by smaller striatum volumes, while an environment characterised by dense build-up space and mixed land use was associated with anxiety symptoms and was mediated by reduced volumes of IFG, amygdala and cerebellar regions. The associations were moderated by genes related to stress response regulation, anxiety and phobia, suggesting that genetic variations may explain individual differences in response to environmental adversity (104).

Further research is warranted that accounts for the inherent complexity of the living environment to disentangle the distinct and interconnected attributes of urban environments that contribute to brain function and dysfunction.

Natural space

Two prominent frameworks have been suggested to explain the effects of natural environments, such as surrounding green spaces, forests, or water bodies on mental well-being. The attention restoration theory posits that nature facilitates the restoration of attentional capacity, reduces mental fatigue, and enhances cognitive functioning (106,122–124). Simultaneously, the stress reduction theory proposes that nature lowers stress levels and enhances positive feelings (125,126). These effects occur via mechanisms involving the autonomic nervous system, reflected by lower

blood pressure and improved heart rate, as well as the modulation of the endocrine system, including reductions in stress hormones secretion (127,128). Nature-induced benefits on the central nervous system have also been observed in experimental, intervention and observational studies, corroborating the notion that contact with nature promotes mental health. Compared to urban scenes, viewing natural landscapes in a laboratory setting was linked with cognitive restoration, reduced visual attention focus (129), and activation of brain areas associated with positive emotional responses, rewarding experience, and recollection of positive memories (105,130–132). Additionally, nature images evoked enhanced FC between the DMN, dorsal attention network, ventral attention network, and the somatomotor network, potentially promoting cognitive coherence and effortless attentional engagement (133).

Walking in nature showed positive effects on brain and mental health by decreasing PFC activation, which is associated with sadness and behavioural withdrawal, and reducing rumination – a pattern linked to depression (134), possibly via restorative benefits of nature. Additionally, after a nature walk, there was decreased amygdala activation during a social stress-inducing task, a region responding to fear and stress (135). Such benefits were not observed after urban walks (134,135). Surrounding urban green space also seemed to have supportive effects on coping with stress (aligning with the stress reduction theory), as indicated by activation patterns in emotion-regulatory brain areas, like the dlPFC, mPFC, insula, ACC, posterior cingulate, and ventral striatum (136,137). Nevertheless, opposite activation directions than expected were observed in the amygdala that could not be explained with certainty (137).

Higher residential greenness was further associated with morphological brain changes. The findings encompassed higher GM and WM volumes in PFC and cerebellum (39), and lower global atrophy and thicker PFC, insula and praecuneus in adults (138–140) – structures linked to cognitive process and psychiatric disorders when reduced (141–144). Indeed, reduced volumes in frontolimbic and cerebellar regions were observed in environments characterised by reduced access to natural spaces that mediated the association between urban living and affective and anxiety symptoms (104). Further research is needed regarding the different typologies of natural spaces and vegetation, which is currently lacking. For example, among older adults, only neighbourhood forest exposure seemed to positively affect amygdala integrity, but not urban green or blue spaces (145). The presence of green space in the living environment was associated with reduced risk of depression and anxiety in cross-sectional studies (146), however, non-consistently, and similar associations were not supported by longitudinal studies (97,147). These discrepancies possibly arose due to methodological shortcomings, such as an inability to assess whether participants spent time in those environments, and the mediating effects of air and noise pollution or exercise uptake. Different buffer areas around the home location were used in the literature. Yet, it remains unclear

which catchment scale is the most relevant for mental wellbeing. Furthermore, distance to green areas was typically calculated with Euclidean distance rather than network or road connections. This approach may not accurately reflect the experiences of the local urban population.

Regional socioeconomic status

Regional socioeconomic status can significantly influence the cognitive, emotional, and behavioural development of children and adolescents, and these effects may persist in adulthood (148–151). Youth growing up in disadvantaged neighbourhoods, marked by poverty, violence, poor housing conditions, or limited access to educational and healthcare resources (152), are often exposed to higher levels of chronic stress and unpredictability (153), and may have difficulties building supportive social networks (154). Consequently, they face a higher risk of childhood mental disorders (155,156). Neighbourhood disadvantage has been linked to HPA-axis dysregulation and reactivity (157,158), and alterations in neural development and functioning related to cognitive processes, rewards, and social threats in youth. For instance, lower neighbourhood socioeconomic status associated with decreased activation in regions of the executive system, including the dlPFC, posterior parietal cortex, precuneus and cerebellum, during a working memory task (159). Neighbourhood poverty may also disrupt self-control development, measured with inhibition performance task, via its effect on IFG activation (160). Furthermore, youth living in more deprived areas recorded lower activation in caudate, putamen, accumbens area and pallidum during reward anticipation (161), and higher amygdala reactivity to threat-related stimuli, particularly in neighbourhoods where safety and management norms were more permissive (162). Altogether, these responses have been implicated in internalising and externalising symptoms and psychopathology (163–165).

Changes in connectome in youth residing in socioeconomically disadvantaged areas suggest that neighbourhood deprivation impede the developmental progression of brain function in children and young adults (172), involving reduced fronto-amygdala and fronto-striatal resting state FC (173–175), and changes in FC between DMN and dorsal attention network and sensorimotor systems (166). The observed connectome alterations were coupled with internalising symptoms and worse cognition. Furthermore, increased fronto-striatal FC in newborns living in deprived neighbourhoods mediated the relationship between disadvantage and externalising symptoms at age 2 years (167).

Compared to the above findings, different patterns in FC were observed when community violence and crime were assessed. Such experiences associated with FC changes in youth between regions

of the limbic system, mainly encompassing the hippocampus (178,179). Furthermore, youth exposed to community violence demonstrated FC changes between the hippocampus and insula, with opposing directions observed across studies (168,169). These discrepancies may be influenced by various factors, including the specific timing of exposure to community violence, developmental changes, individual characteristics, or other contextual factors, such as positive parenting and school environment (166,170,171). Differential social experiences, such as discrimination, within similar environments may exert distinct neural influences on minoritized and discriminated individuals, including various racial and gender identities, particularly in the domains of threat, reward and emotional processes (153,172–174).

Neighbourhood adversity in adolescence may shape neural responses to social situations, threats, and rewards in adulthood. Individuals with a disadvantaged upbringing displayed increased sensitivity in reward-related brain regions like the striatum, NAc, and ventrolateral PFC. Notably, current income did not mediate the observed associations, suggesting a potential link between early experiences and reward anticipation and pursuit in later life (175). Furthermore, exposure to neighbourhood disadvantage during adolescence might influence reward-related processes in adulthood, via decreased activation in brain regions associated with cognitive and affective processes, such as amygdala, hippocampal and dlPFC (176). Lastly, neighbourhood quality might influence neural responses to social stimuli, as observed by increased activity in the dorsal ACC and prefrontal regions among individuals with disadvantaged upbringing (177).

Several studies have demonstrated the effect of neighbourhood disadvantage on brain structure in youth and adults, such as widespread lower volume of WM and GM (178,179), including hippocampus (168,179–181), amygdala (168), dlPFC and dorsomedial PFC, superior frontal gyrus (181), IFG and ACC (182). In addition, smaller surface area and cortical thinning was observed in the frontal, parietal, and temporal lobes, cingulate and insula (183–187). Finally, neighbourhood disadvantage was linked to atypical neurodevelopmental trajectories during adolescence, indicating delayed brain development (188,189). It is currently unknown whether the deviations in brain trajectories due to adversity, converge later in development or if they reflect atypical developmental patterns.

Altogether, neighbourhood disadvantage was associated with alterations in brain regions involved in emotional processes, including the amygdala, hippocampus, and dlPFC, and reward-related regions such as the striatum and NAc. Several studies accounted for individual or family socioeconomic status as a confounding variable, demonstrating that regional socioeconomic status may exert distinct effects on brain and behaviour. Most studies evaluated neighbourhood disadvantage as a single measure of neighbourhood violence or poverty, or used a composite score structured from several measures, e.g., poverty, unemployment rate, education levels. However, assessing

different attributes of regional challenges might elucidate distinct neural correlates to different adversity typologies (190).

Weather patterns and climate change

Weather patterns encompass various meteorological factors, including temperature, precipitation, humidity and sunlight duration. Mounting evidence suggests that weather patterns may influence mood, behaviour, and overall mental well-being. Higher ambient temperatures have been associated with an increased suicide or self-harm burden (64,191,192), mental health-related mortality, and morbidity of schizophrenia, mood disorders, and anxiety disorders (193,194). Likewise, higher humidity has been linked with a greater burden of concurrent depression and anxiety, increased mental health-related emergency visits (194,195), and aggravation of the adverse effects of high temperatures (196). Regarding precipitation patterns, limited evidence suggests a possible positive link with mental illness (197–199). Studies have reported a negative association between sunlight exposure and risk of depression and anxiety (146), while cloudiness and decreased sunshine duration were linked to increased suicide rates (200). Furthermore, seasonal changes directly affect the duration of daylight. Seasonal daylength fluctuations appear to affect mood and behaviour negatively and were associated with a higher prevalence of seasonal affective disorder and earlier onset of bipolar disorder (201). Here it is important to acknowledge that many of these findings are susceptible to bias due to inadequate control of confounders and the risk for an ecological fallacy – the incorrect inference about individuals based on aggregated-level data associations (202).

The changes in weather patterns associated with climate change introduce new challenges that further complicate mental health outcomes via direct effects of stress and trauma and indirect mediating factors, including food insecurity, poverty, climate change-induced violence and forced migration (100). Extreme weather events include heatwaves, flooding, and drought. Systematic investigations demonstrated positive associations between heatwaves and mental health-related morbidity (193,203), where greater frequency, duration, and intensity of heatwave conditions magnified the observed effects (193,204). Direct exposure to floods was associated with depression, anxiety, post-traumatic stress disorder, suicidal ideation, and psychological distress (194,205,206). Similarly, droughts were associated with increased psychological distress, especially among rural inhabitants and vulnerable populations (207,208). The neural circuits linking weather and psychiatric risk are unclear, as studies investigating the weather and climate change effects on MRI-detected brain activity are lacking. During simulated hyperthermia conditions (50°C, >40min), there was heightened activation in the dlPFC and the right intra-parietal sulcus (209). Additionally, impairments in the FC of the DMN were observed (210), coupled with prolonged reaction time in

cognitive tasks compared with the control group (209,210). A few cross-sectional studies reported positive associations between daylength and volumes of the hippocampus, amygdala, and brain-stem – regions that exhibited seasonal variations in serotonin signalling (201), suggesting that changes in volumes of subcortical regions and neurotransmitter signalling involved in emotional regulation may be involved in the seasonality of mental disorders.

Perspective

The existing literature supports the notion that macroenvironment can influence the physiological development and ageing of the brain. However, reaching definitive conclusions is challenging. Current findings are either contradicting or lack specificity, as multiple regions show an association with macroenvironmental adversity, particularly in relation to air pollution. These observations may result from the diverse selection of regions of interest, the timing and severity of exposure. The influences of macroenvironmental adversity on the brain may be more immediate or manifest over time depending on the specific exposure and brain region (20,121), while the reversibility of unfavourable changes in structure and function following exposure to factors that contribute to resilience is unclear (211).

Research investigating the associations of light and noise pollution, weather patterns and extremes on the brain is notably limited. Certain brain regions have been consistently reported to show changes in response to the other macroenvironmental factors. The common brain areas include regions involved in emotional regulation, such as PFC, amygdala, hippocampus, and ACC, similar to the effects observed in microenvironmental adversity (Vaidya et al., 2023), as well as regions related to reward processing, such as striatum and NAc. More specifically, urbanicity, air pollution, and regional deprivation demonstrated unfavourable effects on these brain regions, while natural spaces were associated with beneficial effects. Furthermore, distinct neural regions have also been associated with different types of environmental adversity. For example, current city living was associated with amygdala activity, while urban upbringing affected ACC (108). Similarly, neighbourhood poverty appeared to impact FC between PFC, amygdala, and striatum, while changes in FC mainly involving the hippocampus were observed with exposure to neighbourhood violence. The underlying pathways for the differential links of various macroenvironmental factors with specific brain regions, despite eliciting common effects, such as HPA-axis activation and neuroinflammation, need to be investigated.

Future research directions

Overcoming the complexity of high dimensional data

The associations between the macroenvironment, brain outcomes and mental health involve complex interactions between multiple environmental exposures, individual susceptibility and social factors. As individuals are typically exposed to multiple stressors simultaneously, it becomes challenging to quantify the impact of a specific environmental factor. Furthermore, high correlations are usually present among the different environmental factors adding complexity in determining their independent effects. High collinearity might lead to unstable or imprecise coefficient estimates (212). Indeed, most studies have primarily focused on exploring the relationships between a singular exposure and brain outcomes or mental health, while investigations incorporating analyses of multiple exposures have shown that associations observed with single exposures tend to be less pronounced (21). A further constraint in the existing literature, which impedes the understanding of precise mechanisms, is the insufficient investigation into the mediating role of brain structure and function in the association between the environment and mental health.

To address these challenges, statistical models are needed that enable simultaneous modelling of high-dimensional data, aiming to reduce the complexity and understand underlying patterns by grouping them based on their shared characteristics and distinctions. These methods include independent component analysis, canonical correlation analysis, hierarchical clustering, latent class analyses, and normative modelling (213). An example of such analyses has been demonstrated recently (104). The authors analysed a comprehensive set of environmental variables such as pollution, area deprivation, greenspace and distance to various facilities, and reduced redundancy by applying confirmatory-factor analysis. Thereafter, sparse canonical correlation analysis was employed to identify complex living profiles related to distinct psychiatric symptom groups, while simultaneously allowing the qualitative and quantitative assessment of each factor and their contribution to risk or resilience. Finally, multiple sparse canonical correlation analysis explored the mediating role of brain morphology in the observed associations.

These findings lay the groundwork for understanding the biological processes involved in complex real-life environmental challenges. Further studies are needed to expand upon and provide deeper insights into the specific mechanisms and identify biomarkers for risk and resilience, using deeply phenotyped datasets. Moreover, the applicability of the findings should be examined across diverse populations, settings, and environmental conditions.

Addressing long latency periods

Long latency periods may exist between exposure to environmental hazards and the onset of mental health or brain outcomes, making it further challenging to establish a clear cause-effect relationship. Most studies are cross-sectional and are based on a single MRI measurement. Repeated measurements across the lifespan could give insights into the temporal relationships and enable the examination of critical periods of vulnerability, windows of intervention, and long-term consequences of early-life exposure on later brain health. Therefore, longitudinal studies are crucial for examining these long-term trajectories of brain development, ageing and degeneration related to environmental exposures. Prominent examples of such studies include IMAGEN (214), ABCD (Adolescent Brain Cognitive Development) (215), Generation R (216), along with the ongoing follow-up assessments in the UK Biobank (217) and the NAKO (German National Cohort) (218). Furthermore, longitudinal studies could help to assess pre- and post-exposure effects on brain outcomes. In this way, the immediate and delayed effects on the brain can be evaluated, as well as the potential reversibility or persistence of these effects.

Enhancing macroenvironmental exposure assessment

Current literature relies on assessments of environmental factors that are based on a few stations or land use regression models which are spatially and temporally misaligned with the location or period of interest and may not capture accurately the level of environmental exposure. This issue is particularly important when studying susceptibility periods. Environmental exposures often vary in intensity, duration, and timing, posing additional challenges in their accurate measurement. Misclassification of environmental exposures might hinder small but clinically relevant associations or result in spurious associations. To improve the accuracy of exposure assessment, an increased granularity in the spatial and temporal resolution of data collection is required. Remote sensing satellite data, and integration of multiple data sources, such as air quality models and meteorological reanalysis data provide globally standardised environmental measures enabling the tracing of environmental features spanning back several decades (219–221). The wealth of historical environmental data facilitates global comparative analyses and enables the assessment of the cumulative effects of environmental exposures. A recent study among young adults from China and Europe exemplified the application of several satellite-based measures of urbanicity to characterise spatiotemporal patterns of mental disorders risk (121). Confirmatory factor analysis was performed to develop a composite urbanicity measure, which was calculated for each participant from birth to age of recruitment. This approach allowed to assess the cumulative effects and the susceptibility periods of lifetime urban exposure on brain and behaviours.

Measures of urbanicity or other features of macroenvironment that can be applied to different sociocultural conditions and geographies are significant, as they might uncover common associations with brain and behaviour and may assist in global public health policies and urban planning.

Embracing mobility

Another source of misclassification is the static exposure assessment, disregarding that individuals are exposed to multiple environments along their daily movements. Considering the high spatial and temporal variability of some environmental exposures (e.g., pollutants associated with traffic and industrial production), the actual environmental exposure should be linked to the individual movement patterns and residence time to capture aetiological meaningful associations. Incorporating mobility patterns in data collection, such as daily movements, commuting behaviours, and residential relocations in combination with utilization of geospatial techniques and geographic information systems will allow more accurate assessment of cumulative exposures. Furthermore, leveraging technology, such as wearable devices and mobile applications, alongside ecological momentary assessments, to collect real-time data on individuals' environmental exposures may be helpful to overcome the 'static assumption' errors (222,223). By integrating sensors that measure parameters such as temperature, humidity, UV radiation, air pollution and activity levels, wearable devices provide a personalized perspective into the microclimates individuals experience throughout their daily lives, accounting for factors such as indoor and outdoor environments and personal behaviours. This granular data allows the identification of patterns and correlations between atmospheric variables and their impact on mental well-being (224,225).

Consolidating future directions

To identify complex real-life environmental profiles and establish their relationship with brain and behaviour, a dataset with adequate overall power is essential. It can be achieved by increasing between-participant variations (combining study populations with heterogeneous macroenvironment and varying mental illness burden) and decreasing random measurement error (utilising objective measures of macroenvironment, repeated measurements and biomarkers). Driven by these objectives, a concerted effort is being made by the environMENTAL consortium, involving multidisciplinary expertise (213). Through the integration of individual cross-sectional and longitudinal cohorts across Europe and beyond, the consortium aims to leverage the strength of existing datasets, which can be enriched with remote sensing, meteorological and air pollution data, and with digital-health tools enabling real-time data collection (i.e., smart phone applications and ecological momentary assessments). Furthermore, combining federated analyses, using the COIN-STAC platform (Collaborative Informatics and Neuroimaging Suite Toolkit for Anonymous Computation) (226) with data harmonisation, and using representational biostatistical models, will enable the identification of impactful environmental signatures that can be evaluated for their replicability and generalisability across study designs, cultural settings, and molecular levels.

Conclusions

The current review highlights that various macroenvironmental factors, including air pollution, neighbourhood disadvantage, and urbanicity, may alter brain structure and function and, consequently, mental health. Exposure to these factors, particularly during critical periods of development, might have lasting impacts, resulting in heightened risk for a range of mental illnesses. Then again, detrimental effects of urban environment related to higher risk for mental health disorders, like social stress and air pollution, might be attenuated with exposure to natural environments through decreased stress-related activation in brain regions for emotional regulation (135). Similarly, higher safety norms may mitigate the harmful effects of regional socioeconomic adversity on brain and mental health (162).

However, our understanding of these interactions is still evolving and evidence on specific macro-environmental factors, such as climate, noise and light pollution is comparatively sparse. The short-term and long-term effects of the macroenvironment on brain and mental health is elusive and the need for well-designed longitudinal analyses is pressing. The exploration of mediating and moderating factors, that explain these associations, not only in terms of brain but also, lifestyle and social factors, is essential. Additionally, there is a notable lack of studies on subpopulations and vulnerable groups.

By recognizing the impact of environmental factors on brain plasticity processes, policymakers, and healthcare professionals can work towards creating healthier and more supportive environments that promote mental well-being and resilience.

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564 **Competing interests** The authors declare no conflict of interest.

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1240 **Abbreviations**

ACC	anterior Cingulate Cortex
ALAN	Artificial Light At Night
CO	Carbon Monoxide
dIPFC	dorsolateral Prefrontal Cortex
DMN	Default Mode Network
FC	Functional Connectivity
GM	Gray Matter
HPA	Hypothalamic-Pituitary-Adrenal
IFG	Inferior Frontal Gyrus
ipRGCs	intrinsically photosensitive Retinal Ganglion Cells
mPFC	medial Prefrontal Cortex
MRI	Magnetic Resonance Imaging
NAc	Nucleus Accumbens
NO ₂	Nitrogen Dioxide
NO _x	Nitrogen Oxides
PAH	Polycyclic Aromatic Hydrocarbons
PFC	Prefrontal Cortex
PM	Particulate Matter
PM ₁₀	Particulate Matter with aerodynamic diameter ≤ 10 µm
PM _{2.5}	Particulate Matter with aerodynamic diameter ≤ 2.5 µm
SO ₂	Sulphur Dioxide
TRAP	Traffic-Related Air Pollution
WH	White Matter

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Table 1. Studies on air pollution and MRI-detected alterations in brain structure and function

Exposure period	Exposure duration	Period at MRI assessment	Pollutant/ Method of assessment	Brain alterations	Reference
Lifetime		Childhood to adolescence 7 – 18 years	Lived in a highly polluted city vs unpolluted city	Prefrontal WM hypersensitivity ↓ WM volumes in temporal and parietal lobe	(227,228) Mexico City and Polotitlán area study n = 30, 73
Childhood 9 – 10 years	1 year	Childhood	PM2.5 Spatiotemporal model	↓ SA in frontal pole (R), cuneus (L) ↑ SA in lateral orbitofrontal (R) ↓ CT in lateral orbitofrontal (L), superior frontal (L), inferior temporal (R), parahippocampus (R), rostral anterior cingulate (L), caudal anterior cingulate (L), posterior cingulate (L), isthmus (L), insula (R) ↑ CT lateral orbitofrontal (R), paracentral (R), middle temporal (L), rostral anterior (R), caudal anterior (R), posterior (R) ↓ volumes in accumbens (L), pallidum (R), thalamus (R) ↑ volumes in pallidum (L), putamen (L)	(31) ABCD study n = 10,343
Childhood 9 – 10 years	1 year	Childhood	PM2.5 Spatiotemporal model	↑ rN0 (nonlinear) in the cingulum hippocampal portion (L), uncinate fasciculus (L), and fornix (L) ↑ rN0 (linear) in the uncinate fasciculus (R), the fornix (R), superior longitudinal fasciculus (L) ↓ MD (nonlinear) in the anterior thalamic radiations (L), cingulum hippocampal portion (L), fornix (L),	(229) ABCD study n = 7,602

				<p>superior longitudinal fasciculus (L), uncinate (L), inferior longitudinal fasciculus (R), and uncinate (R)</p> <p>↓ MD (linear) in the inferior fronto-occipital (L), inferior longitudinal fasciculus (L), cingulum hippocampal portion (R), fornix (R)</p>	
Childhood/ Preadolescence 9 – 13 years	2 years	Preadolescence/ adolescence 11 – 15 years	PM2.5 Spatiotemporal models	<p>↑ WM volume in caudate/corpus callosum (L), cingulum (L), inferior fronto-occipital fasciculus, inferior frontal gyrus (R), inferior temporal gyrus (R)</p> <p>↑ GM volume in precentral gyrus (L), cerebellum (L), medial orbitofrontal cortex</p> <p>↓ WM volume in inferior temporal gyrus (L), angular gyrus (L), posterior thalamic radiation (L), middle frontal gyrus (L), hippocampal cingulum (L), postcentral gyrus (R),</p> <p>↓ GM volume in insula (L), cingulate gyrus (R), caudate (R), cerebellum (L), fusiform gyrus, precentral gyrus (R), middle frontal gyrus</p>	(32) San Francisco and San Jose Bay Area study n = 115
Prenatal	Whole pregnancy (PM2.5) 48-h during last trimester (PAH)	Childhood/Adolescence 6 – 14 years	PM2.5, PAH Spatiotemporal models (PM2.5) Personal air monitors (PAH)	<p>Exposure to PM2.5</p> <p>↓ WM surface in lateral pre/procentral gyrus, superior frontal gyrus, middle frontal gyrus (L), middle temporal gyrus (L), inferior parietal lobule (L), anterior cingulate cortex, posterior cingulate cortex (R) with higher exposure to PM2.5</p> <p>↑ WM surface in medial and dorsal pre/procentral gyrus, medial superior frontal gyrus, lateral superior temporal gyrus (R), dorsal superior parietal gyrus with higher exposure to PM2.5</p>	(26) CCCEH study n = 332

				<p>↓ CT in superior parietal gyrus, pre/procentral gyrus with higher exposure to PM2.5</p> <p>↑ CT in superior frontal gyrus, inferior frontal gyrus (L), superior temporal gyrus (L), inferior temporal gyrus, middle temporal gyrus, inferior parietal lobule (L), anterior cingulate cortex, posterior cingulate cortex (R), fusiform and lingual gyrus with higher exposure to PM2.5</p> <p>↑ FA in caudate, lenticular nucleus, insula, brainstem, thalamus, cingulate gyrus, superior corona radiata with higher exposure to PM2.5</p> <p>↑ ADC in inferior fronto-occipital fasciculus, anterior corona radiata, vertical occipital fasciculus with higher exposure to PM2.5</p> <p>Exposure to PAH</p> <p>↓ WM surface in inferior temporal gyrus, middle temporal gyrus, inferior parietal lobule (L), anterior cingulate cortex (R), posterior cingulate cortex (L)</p> <p>↑ WM surface in pre/procentral gyrus, superior frontal gyrus, dorsal middle frontal gyrus, ventral fusiform gyrus, ventral lingual gyrus</p> <p>↓ CT in superior frontal gyrus, middle frontal gyrus, inferior frontal gyrus (L), pre/procentral gyrus, superior temporal gyrus (R), middle temporal gyrus (R)</p> <p>↑ CT in middle temporal gyrus (L), anterior cingulate cortex, fusiform and lingual gyrus</p>	
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				<p>↑ FA in middle orbitofrontal gyrus, cerebellum, hippocampus, globus pallidus, putamen, thalamus, corpus callosum, internal capsule</p> <p>↓ ADC in internal capsule, corpus callosum</p>	
Prenatal	1 st , 2 nd , 3 rd trimester and whole pregnancy	Childhood/ Preadolescence 8 – 12 years	PM2.5 LUR models	<p>↓ volume in total, anterior and body corpus callosum with higher PM2.5 exposure during the 3rd trimester. Associations did not survive false discovery rate correction.</p> <p>No association for WM, GM and lateral ventricles</p>	(28) BREATH n = 186
Childhood/ Preadolescence 7 – 11 years 8 – 12 years	1 year Two 1-week periods separated by two semesters	Childhood/ Preadolescence	NO2, PAH, BPA, EC, copper Monitors at site	<p>Exposure to PAH, BPA and NO2</p> <p>↓ Caudate volume</p> <p>No association for putamen and globus pallidus</p> <p>Exposure to copper</p> <p>↑ GM concentration in the caudate nucleus</p> <p>No association for putamen and globus pallidus</p> <p>↑ FA predominantly in caudate nucleus</p> <p>↓ rsFC between the frontal lobe opercula and the caudate nuclei, and vice versa</p>	(29,33,34) BREATH study n ≈ 200
Childhood/ Preadolescence 8 – 12 years	1 year Two 1-week periods separated by two semesters	Childhood/ Preadolescence	Pollution index: weighted average of pooled indoor and outdoor NO2 and EC Monitors at site	<p>↓ rsFC between regions belonging to the DMN</p> <p>↑ rsFC between the medial frontal cortex and the frontal operculum at the lateral boundary of the DMN</p>	(30) BREATH study n = 263

				↓ task fMRI deactivation (rest > task map) in the supplementary motor area and somatosensory cortex	
Prenatal	1 year	Childhood 6 – 10 years	NO ₂ , PM _{coarse} , PM _{2.5} , PM _{2.5abs} LUR models	<p>↓ CT in praecuneus (R), pars opercularis (R), pars orbitalis (R), rostral middle frontal (R), superior frontal (R), cuneus (L) with higher exposure to PM_{2.5}</p> <p>↓ CT in lateral orbitofrontal (R) with higher exposure to PM_{2.5coarse}</p> <p>↓ CT in fusiform (L) with higher exposure to PM_{2.5abs}</p>	(21) Generation R study n = 783
Prenatal	1 year	Preadolescence 9 – 12 years	NO _x , NO ₂ , PM ₁₀ , PM _{coarse} , PM _{2.5} , PM _{2.5abs} , PAH, OC, copper, iron, silicon, zinc, OP LUR models	<p>↑ volumes of putamen and pallidum with higher exposure to PM_{coarse}</p> <p>↑ volume of cerebellum with higher exposure to PM₁₀, PM_{coarse}, PM_{2.5}, PM_{2.5ab}</p> <p>↓ volume of hippocampus with higher exposure to PAH, copper</p> <p>↓ volume of amygdala with higher exposure to OC, silicon</p> <p>↓ volume of corpus callosum with higher exposure to OP</p> <p>↓ CT in postcentral gyrus with higher exposure to OC</p>	(21) Generation R study n = 3,133

				<p>↓ CT in rostral middle frontal gyrus with higher exposure to copper and PM2.5abs</p> <p>↓ FA in forceps minor, corticospinal tract, superior longitudinal fasciculus (R) with higher exposure to PM2.5</p> <p>↑ MD in cingulum bundle, forceps minor, superior longitudinal fasciculus (L), inferior longitudinal fasciculus (L) with higher exposure to silicon</p> <p>↑ rsFC between brain regions of the same brain hemisphere, predominantly in the auditory association, dorsolateral prefrontal, somatosensory and motor, anterior cingulate and medial prefrontal, dorsal stream visual, and insular and frontal opercular cortices with higher exposure to NO2</p>	
Childhood 6 – 10 years	1 year	Preadolescence 9 – 12 years	<p>NOx, NO2, PM10, PMcoarse, PM2.5, PM2.5abs, PAH, OC, copper, iron, silicon, zinc, OP</p> <p>LUR models</p>	<p>↓ volume of hippocampus with higher exposure to PMcoarse, OP</p> <p>↑ volume of nucleus accumbens with higher exposure to zinc</p> <p>↓ volume of corpus callosum with higher exposure to OC</p> <p>↓ CT in lingual gyrus with higher exposure to copper and OP</p> <p>↑ SA in precentral gyrus with higher exposure to zinc and OP</p>	(21) Generation R study n ≈ 3,000

				<p>↑ SA in pericalcarine cortex and precuneus with higher exposure to zinc</p> <p>↓ SA in pars triangularis with higher exposure to PMcoarse</p> <p>↓ FA in corticospinal tract (L), uncinated fasciculus, superior longitudinal fasciculus (R), inferior longitudinal fasciculus (R) with higher exposure to NOx</p> <p>↑ MD in cingulum bundle (L) with higher exposure to OP</p> <p>↑ MD in cingulum bundle, forceps minor, superior longitudinal fasciculus, inferior longitudinal fasciculus, uncinated fasciculus with higher exposure to zinc</p>	
Prenatal and childhood	Whole pregnancy and childhood at periods: 0 – 2 years 2 – 5 years 5 – 9 years	Preadolescence 9 – 12 years	NOx, NO2, PM10, PMcoarse, PM2.5, PM2.5abs LUR models	<p>Exposure to NOx from 0 – 2 and 2 – 5 years</p> <p>↑ rsFC in areas in auditory association, premotor, orbital and polar frontal, inferior parietal, and posterior cingulate cortices, in the ventral diencephalon, and in the MT+ complex and neighbouring visual areas</p> <p>Exposure to NO2 during pregnancy and from 0 – 2years</p> <p>↑ rsFC in areas in in auditory association, ventral diencephalon, and insular and frontal cortices opercular, somatosensory and motor and early auditory, dorsal stream visual and superior parietal</p> <p>Exposure to PMcoarse from 2 – 5 and 5 – 9 years</p>	(21) Generation R study n = 2,197

				<p>↑ rsFC in areas in anterior cingulate and medial prefrontal cortices and in the MT+ complex and neighbouring visual areas</p> <p>Exposure to PM2.5abs from 0 – 2 and 2 – 5 years</p> <p>↑ rsFC in areas in insular and frontal opercular, auditory association, lateral temporal, somatosensory and motor, anterior cingulate and medial prefrontal, and posterior cingulate cortices, and in the MT+ complex and neighboring visual areas</p>	
Prenatal and childhood	Whole pregnancy and childhood at periods 0 – 3 years 3 – 6 years 6 – age of MRI	Preadolescence 9 – 12 years	NOx, NO2, PM10, PM2.5, PM2.5abs LUR models	<p>Exposure to NOx from 3 – 6 years</p> <p>↑ rsFC in regions of the visual and task positive networks: MT+ complex and neighbouring visual areas – inferior frontal cortex and MT+ complex and neighbouring visual areas – insular and frontal opercular cortex</p> <p>Exposure to NO2 from 0 – 3 years</p> <p>↑ rsFC in regions of the visual, auditory and task positive networks: dorsal stream visual cortex – superior parietal cortex and auditory association cortex – insular and frontal opercular cortex</p> <p>Exposure to PM2.5abs from 0 – 3 years</p> <p>↑ rsFC between brain regions of several networks (19 of 22): visual - visual, visual – auditory, visual – task positive, visual – task negative, auditory – task positive, auditory – task negative, and task negative – task negative</p> <p>↓ rsFC between brain regions of visual – task positive networks and task positive – task negative networks (3 of 22): MT + complex and neighbouring visual areas – superior parietal cortex, posterior</p>	(75) Generation R study n = 2,197

				cingulate cortex – superior parietal cortex, and frontal opercular cortex – lateral temporal cortex	
Prenatal and childhood	48-h during last trimester 5 years of age	Childhood Mean age \pm SD: 8.0 \pm 1.3 years	PAH Personal air monitors during last trimester Urine samples in childhood	Prenatal exposure to PAH ↓ local volume in the middle frontal gyrus, medial orbitofrontal gyrus, inferior frontal gyrus, superior frontal gyrus, pre-central gyrus, post-central gyrus, supramarginal gyrus, middle temporal gyrus, superior temporal gyrus, mesial superior parietal gyrus, praecuneus, cuneus, cingulate gyrus, gyrus rectus in the left hemisphere. No association with cortical thickness Postnatal exposure to PAH ↓ WM surface in dorsolateral prefrontal regions, especially over the superior frontal gyri	(25) CCCEH study n = 40
Lifetime	From birth to 12 years of age	Childhood 12 years	EC (high vs low exposure group) LUR models	↓ CT in the medial frontal gyrus , ventromedial prefrontal cortex (R), paracentral lobule, postcentral gyrus, superior frontal gyrus, precentral gyrus (L), inferior parietal lobule (L), superior parietal lobule (L), anterior cingulate (L), cingulate (R), precuneus (L), fusiform gyrus (L) ↓ GM volume in the cerebellum, precentral gyrus, inferior parietal lobule	(27) CCAAPS study n = 135
Adulthood	1 year	Adulthood ≥ 60 years Median age [IQR]: 68.0 [9.0] years	PM2.5 Spatiotemporal model	↓ total cerebral brain volume No association with hippocampal volume	(38) Framingham Offspring Study n = 943
Adulthood	1 year	Adulthood 44 – 80 years	NOx, NO2, PM10, PMcoarse, PM2.5 LUR models	↓ total GM volume with higher exposure to any of the investigated pollutants ↓ GM volume in the frontal pole and operculum cortex (L) with higher exposure to PM10	(39,47,49) UK Biobank n ≈ 18,290

				<p>↓ GM volume in the frontal pole, operculum cortex (L), and orbital cortex (R) with higher exposure to NO_x</p> <p>↓ GM volume in the frontal pole (R) and operculum cortex (L) with higher exposure to NO₂</p> <p>Exposure to PM_{2.5} ↓ total WM volume</p> <p>↓ GM volume in the frontal pole, orbital cortex (R), operculum cortex (L)</p> <p>Exposure to PM_{coarse} ↓ GM volume in the frontal pole (R), superior gyrus (L), operculum cortex (L)</p> <p>↓ volume in the thalamus (L)</p>	
Adulthood	3, 8, and 10 years	Adulthood 71 – 89 years	NO ₂ , PM _{2.5} , diesel PM Spatiotemporal model	<p>3-year cumulative exposure to NO₂ ↓ GM volumes in the prefrontal cortex</p> <p>↓ volumes in the anterior cingulate gyrus, insula, amygdala, limbic medial temporal lobe, basal ganglia</p> <p>3-year cumulative exposure to PM_{2.5} ↓ WM volumes in the anterior and posterior extreme/ external capsule, calcarine gyri</p> <p>↓ GM volumes in the superior, middle, medial frontal gyri, inferior frontal gyrus (L), superior parietal lobule, occipital poles</p>	(40–42,48,50) WHIMS n = 764, 1,403, 1,365 n = 1,403 (8- and 10-year assessment)

				<p>↓ volume in the anterior cingulate gyrus</p> <p>↑ volumes in the thalamus, putamen, globus pallidus, posterior insula</p> <p>No association with volumes of corpus callosum, hippocampus, temporal lobe</p> <p>8-year cumulative exposure to PM2.5</p> <p>↓ total WM volume and in the frontal, parietal, temporal lobes, corpus callosum</p> <p>No association with hippocampal, basal ganglia volumes and GM volumes across the cerebral cortex</p> <p>10-year cumulative exposure to diesel PM</p> <p>↑ ventricular volume</p> <p>U-shaped associations were observed for total WM volumes and in frontal, parietal and temporal lobes</p> <p>↓ total GM volumes and in frontal, parietal and temporal lobes</p>	
Adulthood	5 – 20 years divided in 8-year periods	Adulthood Mean age ±SD: 76.0 ±5.0 years	PM10, PM2.5 Spatiotemporal model	<p>↓ deep-GM volumes</p> <p>↓ volumes in total brain, frontal and parietal lobe in one of the study centres with higher exposure to PM2.5</p> <p>No association with hippocampal volume</p>	(43) ARIC study n = 1,753
Adulthood 50 – 80 years	1 year	Adulthood 55 – 85 years	NOx, NO2, PM10, PM2.5, PM2.5abs LUR models	Local atrophy in inferior parietal lobule (R) with higher exposure to NOx, PM10, and PM2.5	(44,52) 1000BRAINS n ≈ 600

				<p>Local atrophy in posterior cingulate cortex and praecuneus (R) with higher exposure to NOx, NO2, and PM10</p> <p>No association with local atrophy in the dorsolateral prefrontal cortex</p> <p>↓ Intra-network rsFC and segregation index in the dorsal attention network with higher exposure to NO2</p> <p>↓ Intra-network rsFC in the ventral attention network with higher exposure to PM10 and PM2.5</p> <p>↑ Inter-network rsFC in the visual network with higher exposure to PMabs</p> <p>↓ segregation index in the ventral attention network with higher exposure to PMabs</p>	
Adulthood	1 year	Adulthood Mean age ±SD: 49.5 ± 13.3 years	NO2, PM2.5, ozone LUR models	<p>↑ volume in rostral middle frontal (L), supramarginal (L), transverse temporal (L), pars opercularis (R) with higher exposure to NO2</p> <p>↑ volume in pars triangularis (L) and CT in fusiform (R) with higher exposure to PM2.5</p> <p>↑ pars orbitalis volume (L) with higher exposure to ozone</p> <p>No association with WM and GM volumes</p>	(45) Taiwanese sleep study n = 4,866
Adulthood	5 years (NO2, PM10) 1 year (PM2.5)	Adulthood Mean age ±SD: 67.3 ± 6.4 years	NO2, PM10, PM2.5, PAH metabolites LUR models	<p>Exposure to NO2</p> <p>↓ volume in caudate, pallidum, amygdala, nucleus accumbens</p>	(46,230) EPINEF study n = 957 n = 528 (PAH)

			Urine samples (PAH)	<p>↓ CT in the frontal cortex, lateral temporal cortex, inferior parietal cortex, posterior cingulate, insula, parahippocampal gyri, fusiform gyri</p> <p>↑ CT occipital cortex, postcentral gyri (L)</p> <p>Exposure to PM10</p> <p>↓ volume in pallidum, putamen, amygdala, nucleus accumbens</p> <p>↓ CT in the lateral temporal cortex, inferior parietal cortex, prefrontal cortex, posterior cingulate, insula, parahippocampal gyri, fusiform gyri</p> <p>↑ CT occipital cortex, postcentral gyri</p> <p>Exposure to PM2.5</p> <p>↓ volume in nucleus accumbens</p> <p>↓ CT in the lateral temporal cortex, inferior parietal cortex, prefrontal cortex, insula, parahippocampal gyri, fusiform gyri</p> <p>↑ CT occipital cortex, postcentral gyri</p> <p>Exposure to PAH (highest vs lowest quartile)</p> <p>↓ CT in parietal, temporal and insular lobes in men</p> <p>↓ CT in frontal and parietal lobes in women</p> <p>↓ volumes in the caudate in men, and pallidum in women</p>	
Adulthood	120 min	Adulthood Mean age ±SD: 27.4 ±5.5 years	Diesel exhaust (intervention arm)	No differences in the default mode network rsFC for post- compared to pre-diesel exhaust exposure	Randomised cross-over study (231)

			Filtered air (control arm)	<p>↑ rsFC in the middle temporal gyrus (R), occipital fusiform gyrus (R) for post-filtered air compared to pre-filtered air</p> <p>↑ rsFC in the angular gyrus (R), frontal pole, middle frontal gyrus, middle temporal gyrus, praecuneus cortex, temporal pole (L) for post-filtered air compared to post-diesel; exhaust</p>	n = 25
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Abbreviations: ABCD, Adolescent Brain Cognitive Development; ADC, average diffusivity coefficient; ARIC, Atherosclerosis Risk in Communities; BPA, benzo[a]pyrene; CCAAPS, Cincinnati Childhood Allergy and Air Pollution Study; CCCEH, Centre for Climate Change and Environmental Health; CT, cortical thickness; EC, elemental carbon; EPINEF, Environmental Pollution-Induced Neurological Effects; FA, fractional anisotropy; FC, functional connectivity; GM, gray matter; L, left; LUR, land-use regression; MD, mean diffusivity; MRI, magnetic resonance imaging; NO_x, nitrogen oxides; NO₂, nitrogen dioxide; OC, organic carbon; OP, oxidative potential of PM_{2.5}; PAH, polycyclic aromatic hydrocarbons; PM, particulate matter; PM_{2.5}, particulate matter with aerodynamic diameter ≤2.5 µm; PM_{2.5}abs, absorbance of the PM_{2.5} fraction; PM₁₀, particulate matter with aerodynamic diameter ≤10 µm; PMcoarse, particulate matter with aerodynamic diameter between 10 µm to 2.5 µm; R, right; rNO, restricted isotropic intracellular diffusion; rs, resting state; SA, surface area; WHIMS-MRI, Women's Health Initiative Memory Study-MRI; WM, white matter;