

# Introduction to the special issue "In-depth study of air pollution sources and processes within Beijing and its surrounding region (APHH-Beijing)"

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Abstract. The Atmospheric Pollution and Human Health in a Chinese Megacity (APHH-Beijing) programme is an international collaborative project focusing on understanding the sources, processes and health effects of air pollution in the Beijing megacity. APHH-Beijing brings together leading China and UK research groups, state-of-the-art infrastructure and air quality models to work on four research themes: (1) sources and emissions of air pollutants; (2) atmospheric processes affecting urban air pollution; (3) air pollution exposure and health impacts; and (4) interventions and solutions. Themes 1 and 2 are closely integrated and support Theme 3, while Themes 1-3 provide scientific data for Theme 4 to develop cost-effective air pollution mitigation solutions. This paper provides an introduction to (i) the rationale of the APHH-Beijing programme and (ii) the measurement and modelling activities performed as part of it. In addition, this paper introduces the meteorology and air quality conditions during two joint intensive field campaigns - a core integration activity in APHH-Beijing. The coordinated campaigns provided observations of the atmospheric chemistry and physics at two sites: (i) the Institute of Atmospheric Physics in central Beijing and (ii) Pinggu in rural Beijing during 10 November-10 December 2016 (winter) and 21 May-22 June 2017 (summer). The campaigns were complemented by numerical modelling and automatic air quality and low-cost sensor observations in the Beijing megacity. In summary, the paper provides background information on the APHH-Beijing programme and sets the scene for more focused papers addressing specific aspects, processes and effects of air pollution in Beijing.

# 1 Introduction

Air pollution is one of the largest environmental risks. It is estimated that air pollution has led to 7 million premature deaths per year globally (WHO, 2016a, b) and over a million in China (GBD MAPS Working Group, 2016). Air pollution also has significant impact on the healthcare system and ecosystems, which cost about 0.3 % of global GDP (OECD, 2016). Air-pollution-related sickness also reduces productivity, and severe haze leads to closure of transport systems, causing additional damage to the economy. Total economic losses related to China's PM2.5 (particulate matter with aerodynamic diameter equal to or less than 2.5 µm) pollution in 2007 amounted to 346 billion yuan (GBP 39 billion, approximately 1.1 % of the national GDP) based on the number of affected Chinese employees whose work time in years was reduced because of mortality, hospital admissions and outpatient visits (Xia et al., 2016).

Considerable research effort has led to huge progress in understanding the sources and pollution processes in megacities in western countries, e.g. major interdisciplinary and multi-institutional programmes in Paris and London in the last few years (Beekmann et al., 2015; Bohnenstengel et al., 2014). Although air pollution in developed megacities some-

times breaks country-specific limits and WHO guidelines, traditional London or Los Angeles type smogs which occurred in the early and mid-20th centuries are rare. In the developing countries, however, the rush to industrialisation and rapid growth in vehicle populations have led to serious air pollution problems that are more complex than the London or Los Angeles smogs.

Air pollution is particularly severe in developing megacities, such as Beijing, where pollutants from traditional sources, such as solid fuel combustion are mixed with those from modern vehicles (Guan et al., 2014), on top of regional pollution from industrial and other anthropogenic activities. Air pollution in Beijing is different from that in well-studied developed megacities, such as Paris and London, in a number of ways including the lack of diesel emissions in the inner city, the use of coal in surrounding rural areas for heating and domestic cooking (Tao et al., 2018), the high emissions of air pollutants in neighbouring provinces (Hebei and Tianjin) and the high oxidising power due to the complex chemistry (Zhang et al., 2009; Li et al., 2017; Lu et al., 2018). This makes Beijing a particularly interesting place to study as it provides an atmospheric environment with major contrasts to developed megacities such as London and Paris in which to investigate urban pollution processes.

Many research programmes have been initiated in Beijing to study the air pollution processes since the late 1990s. Earlier research programmes (e.g. early 2000) focused on primary emissions of SO<sub>2</sub>, NO<sub>2</sub>, CO, PM<sub>10</sub>, volatile organic compounds and subsequently secondary pollutants such as ground-level ozone and secondary fine particles. This research contributed to the development of air pollution mitigation strategies introduced by the Beijing municipal government.

The Beijing Olympic Games (2008) offered additional incentives to improve air quality and this led to the funding of CAREBeijing (Campaigns of Air Pollution Research in Megacity Beijing and Surrounding Region) and other major programmes. The field campaigns were conducted in the summers of 2006, 2007 and 2008, with the objectives to learn the environmental conditions of the region, to identify and quantify the processes (transport and transformation) that led to the impact of the surrounding area on air quality in Beijing and to formulate policy suggestions for air quality improvement during the 2008 Beijing Olympic Games. Measures developed as a result of this and other programmes successfully improved air quality during the Olympic Games and provided valuable examples for developing air pollution control policy in other cities (Wang et al., 2010). CAREBeijing was later extended to CAREBeijing-NCP (Campaigns of Air Pollution Research in megacity Beijing and North China Plain), in which field campaigns were carried out in the summer of 2013 and 2014 to investigate the transport and transformation processes of air pollutants in the Beijing megacity and North China Plain. The results of CAREBeijing and CAREBeijing-NCP have been published in special issues of Atmospheric Chemistry and Physics (https://www.atmos-chem-phys.net/special\_issue198.html, last access: 20 May 2019) and Journal of Geophysical Research-Atmospheres (https://agupubs.onlinelibrary.wiley. com/doi/toc/10.1002/(ISSN)2169-8996.CARBS1, last access: 20 May 2019). However, our understanding of sources and emissions of key air pollutants such as PM<sub>2.5</sub> and ozone and the role of the interactions between physical and chemical processes in the development of pollution events in Beijing is still far from being accurate or complete. In addition, none of the abovementioned large programmes have been directly linked to health effect studies.

The adverse health effects of air pollution provide one of the key motivations to control air pollution. Research has shown that air pollution is one of the leading causes of the disease burden in China (GBD MAPS Working Group, 2016). Especially particulate pollution, the leading cause of severe air pollution events in China, has a significant impact on human health and is associated with high mortality (Q. Zhang et al., 2017), with a considerable proportion of this related to cardiorespiratory diseases (namely stroke, ischemic heart disease and chronic obstructive pulmonary disease) (Yang et al., 2013; Lozano et al., 2013). Despite this increasing evidence base, the adverse health impact of air pollution remains a complex issue. For instance, the risk assessment of disease burden due to air pollution in China has relied largely on the studies undertaken in Europe and North America, which may be subject to error due to the difference of race, lifestyle and air pollution settings (Lim et al., 2012). The marked change in air pollution sources and composition between the heating and non-heating seasons, and the differences between urban and rural areas may all lead to different biological responses in local populations. However, to date, such comparative investigations are largely lacking. A further limitation of such work is the lack of accurate personal exposure estimates which are crucial in high-quality health studies. This may be especially true when considering household air pollution from traditional biomass and coal stoves which may not be easily captured by typical outdoor monitoring instruments (Linn et al., 2001; Brook et al., 2002). Thus, understanding the health impact of air pollution in China remains a major challenge.

To address these issues, the UK Natural Environment Research Council (NERC), in partnership with the National Science Foundation of China (NSFC), UK Medical Research Council (MRC) and UK-China Innovation Newton Fund funded a major joint research programme – Atmospheric Pollution and Human Health in a Chinese Megacity (APHH-Beijing). APHH-Beijing is an integrated research programme, incorporating the capabilities and strengths of the UK and Chinese science communities, which is taking a multidisciplinary approach to investigating the sources, processes and health effects of air pollution in the Beijing megacity. The new scientific understanding underpins the development of interventions and solutions to improve air quality and reduce health impacts.

This special issue "In-depth study of air pollution sources and processes within Beijing and its surrounding region (APHH-Beijing)" documents the research outcomes of this APHH-Beijing programme, in particular the atmospheric measurement and modelling aspects.

This introduction paper describes the motivation and background of the APHH-Beijing programme and presents some of the background air quality and meteorological observations, particularly during the two intensive field campaigns. These campaigns form one of the core research activities within APHH-Beijing integrating the different themes/projects. We do not present the key scientific results of APHH-Beijing in this introduction (not an overview) paper, as much of the research activities are still ongoing and unpublished. Key findings will be published in the special issue to which this paper provides key background information.

# 2 APHH-Beijing programme objectives

The overall aim of APHH-Beijing is to better understand the sources, atmospheric transformations and health impacts of air pollutants in the Beijing megacity and to improve the capability of forecasting air quality and developing costeffective mitigation measures. Specific objectives are

- to determine the emission fluxes of key air pollutants and to measure the contributions of different sources, economic sectors and regional transport to air pollution in Beijing;
- to improve understanding of the processes by which pollutants are transformed or removed through transport, chemical reactions and photolysis, and the rates of formation and conversion of particulate matter (PM) via atmospheric reactions;
- to improve understanding on how the detailed properties of PM evolve and can influence their physical properties and behaviour in the atmosphere and elucidate the mechanisms whereby those properties may interact and give feedback on urban-scale and regional meteorology;
- to exploit new satellite observations and regional models to place the in situ campaigns into a wider context;
- to determine the exposure of Beijing inhabitants to key health-related pollutants using personal air pollution monitors and assess the association between air pollution exposure and key cardiopulmonary measures;
- to determine the contribution of specific activities, environments and pollution sources to the personal exposure of the Beijing population to air pollutants;

- to enhance our understanding of the health effects in susceptible individuals over time periods when there are large fluctuations in pollutants compared with normal controls and to identify health outcomes of air pollution; and
- to estimate economic loss due to both physical and mental impacts of air pollution and examine how Beijing can improve its air quality more cost-effectively.

# **3** Research themes and integration within the APHH-Beijing programme

The APHH-Beijing programme has four themes to address the specific objectives outlined in Sect. 2 and is delivered through five inter-related research projects:

- Theme 1 sources and emissions: delivered by the AIRPOLL-Beijing (Source and Emissions of Air Pollutants in Beijing) project;
- Theme 2 atmospheric processes: delivered by the AIRPRO (The integrated Study of AIR Pollution PROcesses in Beijing) project;
- Theme 3 health effects: delivered by two projects the AIRLESS (Effects of AIR pollution on cardiopuLmonary disEaSe in urban and peri-urban reSidents in Beijing) and the APIC-ESTEE (Air Pollution Impacts on Cardiopulmonary Disease in Beijing: An integrated study of Exposure Science, Toxicogenomics and Environmental Epidemiology) projects; and
- Theme 4 solutions: delivered by the INHANCE (Integrated assessment of the emission-healthsocioeconomics nexus and air pollution mitigation solutions and interventions in Beijing) project.

# 3.1 Research themes

# 3.1.1 Theme 1: sources and emissions

Theme 1 (AIRPOLL) aims to quantify the emission fluxes of key air pollutants in Beijing and the contributions of different sources, economic sectors and regional transport to air pollution in Beijing. The project has carried out two major field observation campaigns jointly with the AIRPRO and AIRLESS projects (Sect. 3.1.2 and 3.1.3) during November– December 2016 and May–June 2017. The campaigns were carried out at two sites – one within Beijing (at the Institute of Atmospheric Physics (IAP) meteorological tower site) and the other in the local region (the rural Pinggu site; see Sect. 4.1 for site information).

During the intensive campaigns, the project measured the fluxes of particulate and gaseous air pollutants from groundlevel sources by sampling on the meteorological tower

(325 m) at the IAP site, which is compared with emissions estimates taken from the inventory for Beijing. This was complemented by top-down fluxes inferred from satellite data for nitrogen dioxide, sulfur dioxide and formaldehyde, the latter indicative of volatile organic compound (VOC) oxidation processes (Palmer et al., 2003; Fu et al., 2007). Through these means, the emissions inventory is being tested, allowing revisions which are being incorporated into the atmospheric modelling work.

AIRPOLL also made very detailed online and offline measurements of airborne particles. This included continuous measurements of size distributions from 1 nm to > 10 µm diameter. Large molecules and molecular clusters were also measured by high-resolution mass spectrometry, which aims to better understanding atmospheric nucleation processes. The project has monitored the chemical composition of particles in real time by aerosol mass spectrometry and analysed the time-integrated particle samples offline for major and minor constituents, including organic molecular markers. AIRPOLL determined the carbon-14 in water-soluble organic carbon, water-insoluble organic carbon and elemental carbon in selected time-integrated particle samples with an aim to differentiate fossil and non-fossil particulate carbon. These data are being brought together for use in receptor modelling of PM sources, which are compared with other estimates of source contributions to PM concentrations. Measured ground-level concentrations both from our campaign sites and the Beijing monitoring network, together with vertical gradient observations at the tower and source apportionment results, are compared with the predictions of a chemistry-transport model and used to provide a clear distinction between advected regional pollution and the impact of local sources. Divergences between measured and modelled pollutant concentrations will be used to provide critical evaluation of emissions inventories, which will be enhanced iteratively to improve knowledge of the sources and emissions of pollutants affecting air quality in Beijing.

During the campaigns, AIRPOLL and AIRLESS measured the concentrations of key tracers and reactive species indicative of sources and chemical pathways at the groundlevel sites, which complements AIRPOLL observations.

### 3.1.2 Theme 2: atmospheric processes

Theme 2 (AIRPRO) aims to study the fundamental chemical and physical processes controlling gas and particle pollution, localised meteorological dynamics and the links between them within Beijing's atmosphere. Central to the project were the intensive in situ measurements at the IAP meteorological tower (325 m) site, jointly carried out with the AIRPOLL project. AIRPRO made comprehensive and detailed local observations of both primary emitted chemicals and particles, radical intermediates and secondary products, for periods of contrasting local and regional emissions, solar insolation and air temperature. These data allow the performance of local and regional models of air pollution to be robustly tested, both for final regulated pollutant outcomes and at a more mechanistic level.

Observations made with instruments from multiple Chinese and UK research groups included complementary measurements of key precursor trace gases such as  $NO_x$ , HONO, SO<sub>2</sub>, CO, O<sub>3</sub>, VOCs and semi-volatile organic compounds (SVOCs), gas-phase radicals such as OH, HO<sub>2</sub>, RO<sub>2</sub>, NO<sub>3</sub> and PM including chemical (both online and offline analyses), biological, physical and optical properties. Through multiple co-located surface measurements, there were both instrumental redundancy (e.g. for equipment failures) and capacity to evaluate through intercomparison some hard-tomeasure atmospheric free radicals and gases such as OH, HO<sub>2</sub>, N<sub>2</sub>O<sub>5</sub>, HCHO and other oxygenated VOCs. The project determined the local in situ chemical processing of air pollution in the contrasting winter/summertime periods alongside overall atmospheric reactivity, both during the day and at night, through a combination of modelling and proxy measurements such as measured ozone production efficiency and OH reactivity.

The IAP tower allowed vertical profiles of key pollutants up to 320 m to be obtained and, with additional remote sensing of composition and meteorology, provided insight into boundary layer stability and evolution over the diurnal cycle. Quantification of shallow mixed layers proved to be vital for explaining local surface in situ chemical processing and also street-level concentrations of relevance to exposure. The potentially significant vertical gradients anticipated in some chemicals and PM properties were further quantified using instruments installed on the tall tower and via profiling gondola measurements. The combined datasets, surface and profiles provide the basis for evaluation of model performance and notably comparisons for those intermediates that provide indicators of whether secondary pollution production is being correctly simulated.

### 3.1.3 Theme 3: health effects

Health effects of air pollution are studied by two projects – AIRLESS and APIC-ESTEE. AIRLESS aims to advance air quality and health research in Beijing by bringing together two fields of research that have made rapid advancements in recent years: measurements of a wide range of pulmonary and cardiovascular biomarkers in a panel study and personal monitoring of multiple air pollutants with high spatiotemporal resolution by sensor technology. AIRLESS is also benefiting from the use of an extensive range of pollution metrics and source apportionment results from the AIRPOLL and AIRPRO projects. These data are being compared with our personal air quality assessments and used to further understanding of the nature of the air pollution exposures of residents and how this relates to their health status.

APIC-ESTEE aims to evaluate the impacts of air pollution on cardiopulmonary health through an integrated study of exposure, epidemiology and toxicology/toxicogenomics. APIC-ESTEE has investigated the relationship between ambient air pollution and personal exposures. This is being used to estimate personal exposures for epidemiological analyses of long-term health impacts in a cohort study and of shortterm effects (i.e. biomarkers, blood pressure, heart rhythm and peak flow) in a panel study. APIC-ESTEE also studied the real-world exposure reduction and health benefit potential of face masks, a commonly used personal-level intervention seen in Beijing. Furthermore, to complement the human based studies into mechanisms of action, APIC-ESTEE has conducted in vivo analyses of mechanistic effects and early life toxicogenomics/metabonomics.

# 3.1.4 Theme 4: solutions

Theme 4 (INHANCE) aims to quantitatively evaluate the performance of China's current air pollution policies and develop cost-effective solutions to mitigate the impact of air pollution in the Beijing megacity. INHANCE considered not only the physical and mental health impacts and direct economic impact but also the cascading indirect economic losses that occurred through inter-industrial and interregional linkages on the supply side of the economy. IN-HANCE has established and evaluated interactive relationships among exposure, vulnerability, impact on health, implications for industry and economic consequences. INHANCE has compared and qualitatively assessed air quality policies between Beijing and other cities, undertaken policy performance assessment modelling, utilised techno-economic inventories for anti-pollution measures to conduct microeconomic cost-benefit analysis of new policies, measured health and macroeconomic costs and benefits in mitigating air pollution, and transformed evidence generated into practical emission alleviation pathways. On these bases, INHANCE will deliver recommendations regarding integrated policy design and an assessment for policy cost-effectiveness.

# **3.2** Integration between the themes and novelty of the APHH-Beijing programme

The APHH-Beijing programme is highly integrated to ensure the biggest possible scientific and policy impacts. One of the most significant integration activities between the different themes is the coordinated joint field campaigns at an urban and a rural site in Beijing for Themes 1, 2 and 3 to fully exploit the complementary measurements and expertise by different research groups, which is described in the following sections. Themes 1 and 2 are closely related and in many senses inseparable. For example, our knowledge of the sources and emissions is essential to interpret the processes, while knowledge on the atmospheric physical and chemical processes will help us to more accurately quantify the source emissions both via actual flux-based measurements and model evaluation of the emission inventories. Furthermore, to ensure integration, Themes 1 and 2 co-located their rural site at Pinggu as that was selected for the Theme 3 panel study.

Modelling of airborne concentrations of pollutants within Themes 1 and 2 is fully integrated, primarily via the UKCA (UK Chemistry and Aerosol), NAQPMS (Nested Air Quality Prediction Model System) and GEOS-Chem models. The models simulate spatial and temporal variations of key air pollutants and are being evaluated using the new observations of pollutant emission fluxes, updated emission inventories, three-dimensional air quality low-cost-sensor observations, comprehensive composition and physics measurements, as well as new process understandings generated from the APHH-Beijing programme. Furthermore, in Themes 1 and 2, ADMS (Atmospheric Dispersion Modelling System) modelling results for the campaign periods facilitate the estimation of population exposure in Theme 3. Outcomes of Themes 1, 2 and 3 help to provide Theme 4 with a more accurate estimate of pollution costs and to develop cost-effective air pollution control measures in Beijing.

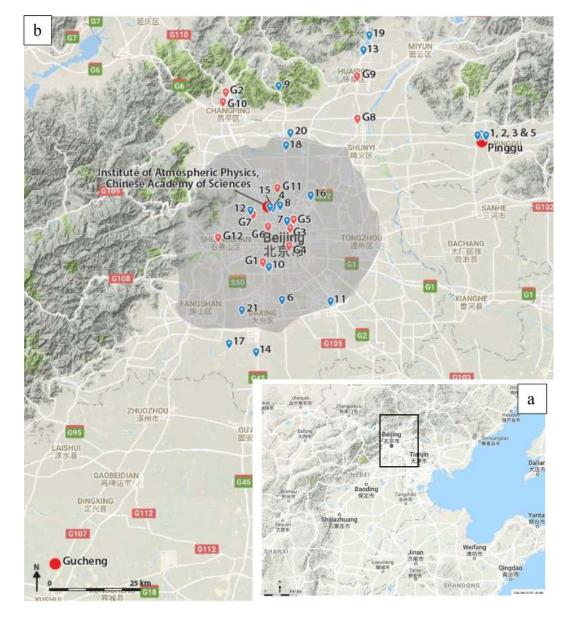
The third stream of integration activities involves regular APHH-Beijing programme science and stakeholder engagement meetings to stimulate collaboration and knowledge transfer between different themes and stakeholders. Furthermore, sharing of data was made available via a dedicated depository in Centre for Environmental Data Analysis (http://catalogue.ceda.ac.uk/ uuid/7ed9d8a288814b8b85433b0d3fec0300, last access: 20 May 2019). All data in the depository will be made publicly available by the end of 2022.

Together, this interdisciplinary APHH-Beijing programme delivers key scientific values and innovation, including

- validation of the bottom-up emission inventories by using novel eddy covariance emission flux observations from the IAP meteorological tower, integrated with satellite retrievals and numerical modelling;
- improvement in understanding of air pollution processes through comprehensive observations of atmospheric gaseous and aerosol species integrated with atmospheric physics measurements; and
- 3. identification of the sources of air pollution that cause largest adverse human health effects by carrying out novel cardiovascular health indicator measurements, integrated with personal exposure, fixed station source apportionment studies and high-resolution air quality modelling.

# 4 Overview of the joint field campaigns

The two intensive campaigns took place from 10 November to 10 December 2016 and 20 May to 22 June 2017. The campaigns were carried out at both urban and rural sites.



**Figure 1.** Study area topography (source: Google Maps) of the Beijing–Tianjin–Hebei region (**a**) with the rectangle showing enlarged study area; locations of measurement sites (Institute of Atmospheric Physics (IAP) – urban Beijing; Pinggu – rural Beijing; and Gucheng – upwind site in the Hebei province), SNAQ (Sensor Network for Air Quality) box sites (red symbols) and the 12 national air quality monitoring stations (G1 to G12, blue symbols) (**b**). The shaded area shows the Beijing build-up area. (Source: **a** and **b** – Google Maps topographic background imagery). G1: Wanshou Xigong; G2: Dingling (Ming Tombs); G3: Dongsi; G4: Tiantan; G5: Nongzhanguan; G6: Guanyuan; G7: Haidian Wanliu; G8: Shunyicheng; G9: Huairouzhen; G10: Changpingzhen; G11: Aoti Zhongxin (Olympic Park); G12: Gucheng. Categories: urban: G1, G3, G4, G5, G6, G7, G8, G11, G12; suburban: G9, G10; rural: G2.

### 4.1 Site information

The winter campaign had two main sites. The urban site  $(39^{\circ}58'33'' \text{ N } 116^{\circ}22'41'' \text{ E})$  is located in the tower section of the IAP, Chinese Academy of Sciences, where the 325 m meteorological tower is located. The site, between the fourth and third north ring roads of Beijing (Fig. 1), is in a residential area. Typical of central Beijing, there are various roads nearby. To the south, north and west ends there are roads

about 150 m away. On site, there are two to three floor buildings to the south, and the east and west ends of the tower are surrounded by small trees and grass. There is a canal right to the north of the site. Further to the west is a park covered mainly by conifer pine trees (Yuan Dynasty Wall Heritage Park).

The rural Pinggu site in Xibaidian village  $(40.17^{\circ} \text{ N}, 117.05^{\circ} \text{ E})$  in north-eastern Beijing was collocated with the

AIRLESS project cohort. Xibaidian village is about 4 km north-west of the Pinggu town centre and about 60 km from IAP. There are several similar small villages nearby. The monitoring station and the clinic used an unoccupied house at the north end of the village away from significant local combustion sources. A two-lane road is about 300 m north of the site. With no centralised heating infrastructure available, residents mainly use coal and biomass for heating and cooking in individual homes.

In the summer, an additional site was operated in Gucheng (39.2° N 115.7° E), Dingxing County, Hebei province. This site, about 120 km to the south-west of central Beijing, is on one of the main high-pollutant transport pathways from the Hebei province to Beijing from the south-west. The site is in a meteorological observatory surrounded by farm fields. The nearest town is about 10 km to the north-east. The nearest road is 500 m to the north and the nearest village  $\sim 1 \text{ km}$  to the west. Several villages are located around the site.

In addition to the two highly instrumented urban (IAP) and rural (Pinggu) sites, 21 SNAQ (Sensor Network for Air Quality) boxes, which measure CO, NO, NO<sub>2</sub>, CO<sub>2</sub>, O<sub>x</sub>, sizeresolved particulates ( $0.38-17.4 \mu m$ ), temperature, relative humidity, wind speed and direction (Popoola et al., 2018), were deployed during the summer and winter campaigns across the urban and rural areas of Beijing to map air pollutant variations (red tags; Fig. 1). Six additional SNAQ boxes were deployed at six different heights (8, 32, 102, 160, 260 and 320 m) on the IAP tower from 9 to 23 November 2016 and 25 January to 31 December 2017.

Figure 1 also shows the location of the 12 national air quality monitoring stations. Hourly data for criteria air pollutants ( $PM_{2.5}$ ,  $PM_{10}$ ,  $SO_2$ ,  $NO_2$ , CO and  $O_3$ ) from January 2013 to December 2017 from the stations were also obtained from official sources. The closest air quality station to the urban IAP site is about 3 km away at the Olympic Park (G11; Fig. 1).

### 4.2 Instrumentation

## 4.2.1 Urban site

Table 1 lists all instruments deployed during the campaigns at the IAP site. Most instruments ran during both campaigns. A majority of the instruments were situated in the nine containers, which were at ground level on the campus grass. A number of online instruments and high-volume PM samplers were also deployed at different heights on the meteorological tower. Vertical profile measurements of atmospheric species including HONO were made during pollution events using baskets attached to the tower. Additional online measurements and offline PM samplers were deployed at ground level, on the roof of a two-storey building to the west (WB) and in a third-floor laboratory at the south end of the campus. In addition, high-, medium- and low-volume PM samplers were placed on the roof of WB for offline characterisation and source apportionment.

### 4.2.2 Rural sites

At Pinggu, online instruments (Table 2) were run within an air-conditioned room on the ground floor with inlets on top of the building. High-, medium- and low-volume PM samplers were deployed on a newly modified flat roof of the single-storey building.

At Gucheng (summer only), a high-volume Digitel sampler and a single particle sampler were set up on a deserted basketball court. An aethalometer AE33 was located on top of a container at the edge of the basketball court. CO and  $O_3$  were also measured in a nearby container.

# 4.3 Synoptic-scale meteorology during the field campaigns

Synoptic circulation patterns (e.g. horizontal advection and wet deposition) play a key role in the variations of air quality in Beijing (Miao et al., 2017; Wu et al., 2017; Zhang et al., 2012). To provide the synoptic context of the APHH-Beijing observations, the daily mesoscale flow patterns have been classified and put into context using a 30-year climatology (Sect. 5.4).

Circulation types (CTs) are classified using the software produced by the COST Action 733 "Harmonisation and Applications of Weather Type Classifications for European regions" (Philipp et al., 2010) with (ECMWF reanalysis) ERA-Interim 6 h 925 hPa geopotential reanalysis data (Dee et al., 2011) at its native 0.75° spatial resolution for the domain of interest (31-49° N, 103-129° E) centred on Beijing (40° N, 116.5° E) covering the period 1988–2017. ERA-Interim 10 m U and V wind components are used to facilitate the interpretation of the flow patterns. Of the COST733 methods (Huth et al., 2008; Philipp et al., 2010, 2016; Tveito and Huth, 2016), two are used: T-Mode PCA (principal component analysis) and SANDRA (simulated annealing and diversified randomisation clustering). The former has been used in Beijing previously (e.g. Miao et al., 2017; Zhang et al., 2012). The latter is considered to perform well in clustering pressure fields and discriminating environmental variables (e.g. Demuzere et al., 2011; Philipp et al., 2016). Classification is performed with the number of CTs ranging from 7 to 18. A total of 11 CTs from the SANDRA method are selected (Fig. 2; Table 3) to adequately represent the general flow conditions around Beijing during the 30-year climatology period (Beck and Philipp, 2010).

As expected, the CTs that occurred during the two field campaign periods are different (Fig. 3). During the winter field campaign, the most frequent circulation type was CT 11 (26% of the 6 h periods) which was often preceded by a period of CT 9 (total 13%). Circulation types 9–11 are associated with air masses that may stagnate over the Beijing urban area (Fig. 2). CT 1 (accounting for 12% of the time) and CT 2 (17%) are associated with the Asian winter monsoon which brings cold and dry air masses to eastern China.

Instrument	Measurements	Institute	References
Container 1			
FAGE	OH (chem and wave) <sup>c</sup> , HO <sub>2</sub> , RO <sub>2</sub>	Leeds	Whalley et al. (2010)
OH reactivity	OH reactivity	Leeds	Stone et al. (2016)
Spectral radiometer	Photolysis rates	Leeds	Bohn et al. (2016)
Filter radiometer	$J(O^1D)$	Leeds	Bohn et al. (2016)
Dew point hygrometer	Water vapour	Leeds	Whalley et al. (2010)
Davis met station	Wind speed, direction, temp, RH, pressure	Leeds	
Vaisala CL31 ALC ceilometer <sup>a</sup>	Cloud-base height, mixing height, attenuated backscatter profiles	Reading	Kotthaus and Grimmond (2018a
Personal air monitors (PAMS)	CO, NO, NO <sub>2</sub> , PM <sub>1</sub> , PM <sub>10</sub> , PM <sub>2.5</sub>	Cambridge	Moore et al. (2016)
MicroPEMs	Personal PM exposure	IOM	Sloan et al. (2016)
Container 2			
DC-GC-FID	C <sub>2</sub> –C <sub>7</sub> VOCs and oVOCs	York	Hopkins et al. (2011)
GCxGC FID	$C_6-C_{13}$ VOCs and oVOCs	York	Dunmore et al. (2015)
TEI 42i	NO	Birmingham	
Teledyne CAPS	NO <sub>2</sub>	York	
TEI 42c	Total NO <sub>v</sub>	York	
TEI 49i	O <sub>3</sub>	York	
TEI 43i	SO <sub>2</sub>	York	
Sensor box	30 <sub>2</sub> CO	York	Smith et al. (2017)
BBCEAS	HONO, NO <sub>3</sub> , N <sub>2</sub> O <sub>5</sub>	Cambridge	Le Breton et al. (2017)
Container 3	1010, 103, 1205	Cambridge	
	Novo	D' ' I	
LOPAP	HONO	Birmingham	Crilley et al. (2016)
LIF HCHO	НСНО	Leeds	Cryer et al. (2016)
LOPAP	HONO	IC-CAS	Zhang et al. (2019)
GC-MS	Organic nitrates	East Anglia	Mills et al. (2016)
ROS online analyser	Reactive oxygen species	Cambridge	Wragg et al. (2016)
Container 4 <sup>b</sup>			
FAGE	$OH (wave)^c, HO_2$	Peking	Lu et al. (2012)
FAGE	OH (chem) <sup>c</sup>	Peking	Tan et al. (2017)
TEI 42i	NO	Peking	Tan et al. (2017)
Teledyne CAPS	NO <sub>2</sub>	Peking	
TEI 42c with Moly converter	NO <sub>2</sub>	Peking	
TEI 49i	O <sub>3</sub>	Peking	
TEI	СО	Peking	
Spectral radiometer	Photolysis rates	Peking	
GC-ECD	PAN	Peking	Zhang et al. (2011)
GC-MS	VOCs	Peking	M. Wang et al. (2015)
Container 5 <sup>b</sup>			
H-TDMA/V-TDMA	Hygroscopicity/volatility	Peking	Wu et al. (2013)
SMPS+APS	Particle number size distribution	Peking	Wu et al. (2016)
Particle size magnifier	Size distribution of $< 3$ nm particles	Peking	Vanhanen et al. (2011)
IGAC-IC	Water-soluble ions	Peking	Yu et al. (2018)
Xact	Metal	Peking	Yu et al. (2018)
Sunset OC/EC	EC/OC	Peking	Y. Zhang et al. (2017)
Container 6			
IBBCEAS	HONO, NO <sub>2</sub>	AIOFM	Duan et al. (2018)
CRDS	NO <sub>3</sub> and N <sub>2</sub> O <sub>5</sub>	AIOFM	Li et al. (2018)
Nitrate Api-ToF-CIMS	Organics, clusters (HOMs)	Birmingham	Junninen et al. (2010)
SMPS	Particle size distribution	Birmingham	Shi et al. (1999)
SIMI S		Dunnenginan	

Instrument	Measurements	Institute	References
Container 7			
Fast NO <sub>x</sub>	NO <sub>x</sub> fluxes	York	Vaughan et al. (2016)
AL5002 CO analyser	CO fluxes	York	Gerbig et al. (1999)
HR-ToF-AMS	Fluxes of PM1 non-refractory (NR) species	CEH	Nemitz et al. (2008)
SP2	BC fluxes	Manchester	Liu et al. (2017)
PTR-ToF-MS	VOC fluxes	GIG Lancaster	Huang et al. (2016)
SYFT-MS Voice 200 Ultra	VOC fluxes	York	Storer et al. (2014)
Container 8			
SMPS3968-APS3321	Particle number size distribution	BNU	Du et al. (2017)
H/V TDMA	Particle hygroscopicity	BNU	Y. Wang et al. (2017)
CCNC-100	CCN	BNU	Y. Wang et al. (2017)
PAX (870 nm)	Extinction and absorption coefficients	IAP	Xie et al. (2019)
Ammonia analyser	NH <sub>3</sub>	IAP	Meng et al. (2018)
Sunset OC/EC analyser	Online OC/EC	IAP	Y. Zhang et al. (2017)
Container 9			
	Doutials and soo alsoo as is much as is	Manahasta	La Dratan et al. (2010)
Iodide FIGAERO-ToF-CIMS	Particle- and gas-phase molar molecule	Manchester	Le Breton et al. (2018)
CPMA-SP2	Black carbon mass and mixing state	Manchester	Liu et al. (2017)
Micro-reactor	oVOCs	York	Pang et al. (2014)
Tower $\sim 100 \mathrm{m}$			
QCL NH <sub>3</sub>	Ammonia fluxes	CEH	McManus et al. (2010)
IRGA LiCOR-7500	$CO_2/H_2O$ flux	CEH	McDermitt et al. (2011)
DMT UHSAS	Size-resolved particle flux (0.06–1 µm)	CEH	Deventer et al. (2015)
TSI APS3021	Size-resolved particle flux (0.5–25 µm)	CEH	Nemitz et al. (2002)
TSI CPC3785	Total particle number flux	CEH	Petäjä et al. (2006)
ROFI	O <sub>3</sub> flux	CEH	Coyle et al. (2009)
Sonic anemometer R3-50	Turbulence, sensible heat flux	СЕН	Högström and Smedman (2004
WXT530 weather station	T, P, RH, wind speed and direction, precipitation	CEH	Trogotioni and Diffedinan (2001
$2B O_3$ analyser	$O_3$ concentration	CEH	Johnson et al. (2014)
Tower $\sim 120 \text{ m}$	-		
High-volume sampler	PM <sub>2.5</sub> filter samples	IAP	
Anderson sampler	Size-resolved PM samples	IAP	
Tower ~260 m			
High-volume sampler	PM <sub>2.5</sub> filter samples	IAP	
Anderson sampler	Size-resolved PM samples	IAP	
ACSM	NR PM <sub>1</sub> species	IAP	Sun et al. (2012)
CAPS-PM- <sub>Ext</sub> (630 nm)	Extinction	IAP	Q. Wang et al. (2015)
SMPS 3938	Particle number size distribution	IAP	Du et al. $(2017)$
		IAP	· · · · ·
Gas analyser	$CO, O_3 and SO_2$	IAP IAP	Zhou et al. $(2018)$ Via et al. $(2010)$
Aethalometer AE33	Black carbon		Xie et al. (2019)
Single particle sampler	Individual particles	CUMTB	W. Wang et al. (2018)
Tower and tower basket measurements			
SNAQ boxes ( $\times 6$ at different heights)	CO, NO, NO <sub>2</sub> , SO <sub>2</sub> , PM <sub>1</sub> , PM <sub>10</sub> , PM <sub>2.5</sub>	Cambridge	Popoola et al. (2018)
LOPAP	HONO (3 min average)	Birmingham	Crilley et al. (2016)
Spectral radiometer	Photolysis rates	Leeds	Bohn et al. (2016)
SNAQ	$CO, NO, NO_2, SO_2, PM_1, PM_{10}, PM_{2.5}$	Cambridge	Popoola et al. (2018)
WIBS	Fluorescent biological aerosol particles (FBAPs)	IAP	Yue et al. (2016)
AE33	BC	IAP	Xie et al. (2019)
L C NIL l	NH <sub>3</sub>	IAP	Meng et al. (2018)
Los Gatos NH <sub>3</sub> analyser	1113		

# Table 1. Continued.

Table 1. Continued.

Four-channel sampler P	PM <sub>2.5</sub> filter samples	D.L.	
Four-channel sampler P	PM <sub>2.5</sub> filter samples	D 1'	
-		Peking	
	PM <sub>2.5</sub> filter samples	Peking	
High-volume sampler H	High-time-resolution PM <sub>2.5</sub> filter samples	York	
FDMS+Thermo Scientific 1405-DF O	Online PM <sub>2.5</sub> mass concentration	IAP	
IAP roof/lab			
Partisol sampler P	$PM_{2.5} + PM_{2.5-10}$	Birmingham	Taiwo et al. (2014)
Streaker sampler H	Hourly elements in PM <sub>2.5</sub> and PM <sub>2.5-10</sub>	Birmingham	Taiwo et al. (2014)
Digitel high-volume P.	PM <sub>2.5</sub> daily	IAP	
Digitel high-volume P.	$PM_1 - 3$ -hourly	IAP	
Andersen sampler S	Size-resolved PM	IAP	
WIBS F	Fluorescent biological particles	IAP	Yue et al. (2016)
CAPS-NO <sub>2</sub> N	NO <sub>2</sub>	IAP	Ge et al. (2013)
Aethalometer AE33 B	Black carbon	IAP	Xie et al. (2019)
CAPS-PM <sub>SSA</sub> (630 nm) E	Extinction, scattering	IAP	Han et al. (2017)
HR-ToF-AMS N	NR-PM species	IAP	Sun et al. (2016)
SP-AMS R	Refractory BC and coated aerosol composition		J. Wang et al. (2017
Iodide FIGAERO- ToF-CIMS Pa	Particle- and gas-phase molar molecule	IAP	Zhou et al. (2018)
	ndividual particles	CUMTB	Wang et al. (2018)

Institution names: AIOFM is Anhui Institute of Fine Optics and Mechanics; BNU is Beijing Normal University; CEH is Centre for Ecology and Hydrology; CUMTB is China University of Mining and Technology (Beijing); GIG is Guangzhou Institute of Geochemistry, Chinese Academy of Sciences; NUIST is Nanjing University of Information Science and Technology; IC-CAS is Institute of Chemistry, Chinese Academy of Sciences. <sup>a</sup> Deployment of instrument from 10 November 2016 to 25 June 2017. <sup>b</sup> Winter campaign only. <sup>c</sup> OH wave and OH chem refer to the methods used to obtain the background signal for the FAGE instruments which are equipped with a scavenger inlet.

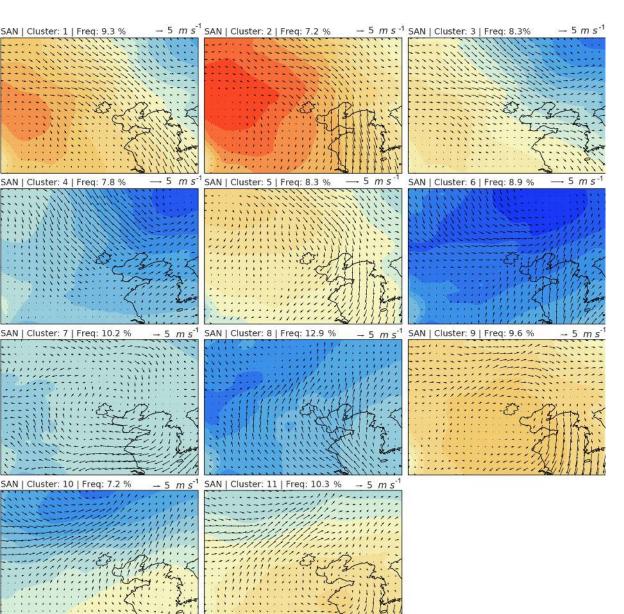
### Table 2. Overview of measurements at the Pinggu site.

Instruments	Measurements	Institute	Reference
Thermo gas analysers	$NO_x/SO_2/CO/O_3$	Peking	Liang et al. (2017)
BAM 1020	PM <sub>2.5</sub> mass concentration	Peking	Liang et al. (2017)
High-volume sampler	PM <sub>2.5</sub> samples	IAP	Zhao et al. (2018)
Medium-volume sampler	PM <sub>2.5</sub> samples	IAP	Zhao et al. (2018)
Low-volume Andersen sampler	Size-resolved PM samples	IAP	Zhao et al. (2018)
Partisol sampler	PM <sub>2.5</sub> samples	Birmingham	Taiwo et al. (2014)
Streaker sampler	Hourly elements in $PM_{2.5}$ and $PM_{2.5-10}$	Birmingham	Taiwo et al. (2014)
High-volume sampler	Filters of PM <sub>2.5</sub> ; high time resolution	Birmingham	
Four-channel sampler	PM <sub>2.5</sub> samples	Peking	Liang et al. (2017)
Thermo MAAP	Online black carbon	Peking	Lin et al. (2011)
Sunset OC/EC analyser	Online OC/EC	Peking	Han et al. (2014)
Xact	Hourly metals	Peking	Yu et al. (2018)
ToF-ACSM	NR-chemical composition (summer)	Peking	Sun et al. (2012)
Thermo Metone	Meteorological parameters	Peking	Liang et al. (2017)
SNAQ	Meteorological parameters	Cambridge	Popoola et al. (2018)
SP-AMS	Individual particle composition	CQIGIT	Chen et al. (2017)
SMPS	Size distribution	Tsinghua	Wang et al. (2009)
ACSM	NR-chemical composition (winter)	Tsinghua	Li et al. (2016)

CQIGIT is Chongqing Institute of Green and Intelligence Technology, Chinese Academy of Sciences.

CT	Description	WS m s <sup>-1</sup>	WS <sub>SD</sub> m <sub>s</sub> <sup>-1</sup>	。 WD	WD <sub>SD</sub>	°C	T2msp °C		C °C		TD2m °C	TD2m TD2m <sub>SD</sub> °C °C	TD2m TD2m <sub>SD</sub> MSLP MSLP <sub>SD</sub> RH °C °C hPa hPa %	TD2m TD2m <sub>SD</sub> MSLP MSLP <sub>SD</sub> °C °C hPa hPa	TD2m TD2m <sub>SD</sub> MSLP MSLP <sub>SD</sub> RH °C °C hPa hPa %	TD2m TD2m <sub>SD</sub> MSLP MSLP <sub>SD</sub> RH RH <sub>SD</sub> °C °C hPa hPa % %
-	<i>H</i> – west of the domain	3.38	1.63	298.3	62.6	0.1	7.1	-12.6		7.9	7.9 1026.50		1026.50	1026.50 4.14	1026.50 4.14 41	1026.50 4.14 41 18
2	H – west of the domain	2.91	1.49	265.9	107.0	-2.8	6.2	-13.8		7.5	7.5 1034.34		1034.34	1034.34 4.47	1034.34 4.47 45	1034.34 4.47 45 18
з	Relatively L in NE	3.21	1.65	281.2	71.3	6.8	8.9	-6.4		9.3	9.3 1017.77		1017.77	1017.77 4.35	1017.77 4.35 43	1017.77 4.35 43 20
4	Further reduction $L$ (compared to CTs 3, 5) in NE winds start to turn over Yellow Sea	3.05	1.73	240.1	104.1	19.2	7.5	7.0		10.4	10.4 1007.20		1007.20	1007.20 3.63	1007.20 3.63 50	1007.20 3.63 50 24
s	Relatively L in NE	2.57	1.37	189.1	125.0	8.2	8.9	-0.9		10.4	10.4 1020.82		1020.82	1020.82 4.62	1020.82 4.62 57	1020.82 4.62 57 23
6	Further reduction $L$ (compared to CTs 3, 5) in NE	2.58	1.32	197.4	87.6	24.6	5.9	14.7		8.0	8.0 1000.99		1000.99	1000.99 2.96	1000.99 2.96 59	1000.99 2.96 59 23
7	When winds are oriented west- ward from the Bohai Sea	2.29	1.12	167.5	100.2	18.9	7.8	10.7		9.5	9.5 1012.59		1012.59	1012.59 3.61	1012.59 3.61 63	1012.59 3.61 63
8	Like CT 6	2.35	1.11	165.4	75.4	24.0	5.3	15.9		6.8	6.8 1006.47		1006.47	1006.47 2.69	1006.47 2.69 65	1006.47 2.69 65 21
9 10	Air mass stagnant over Beijing Air mass stagnant over Beijing	2.03 2.67	0.94 1.17	208.7 211.1	107.4 68.7	2.1 14.2	7.9 9.4	-6.2	_	8.4 10.0	8.4 1028.66 0.0 1013.98		1028.66 1013.98	1028.66 4.18 1013.98 3.84	1028.66 4.18 58 1013.98 3.84 52	1028.66 4.18 58 1013.98 3.84 52
Ξ	Air mass stagnant over Beijing	2.23	0.98	209.1	86.5	8.1	9.4	-0.4		9.6	9.6 1021.83	1021.83	1021.83 4.06	1021.83 4.06 59	1021.83 4.06 59	1021.83 4.06 59 20 20

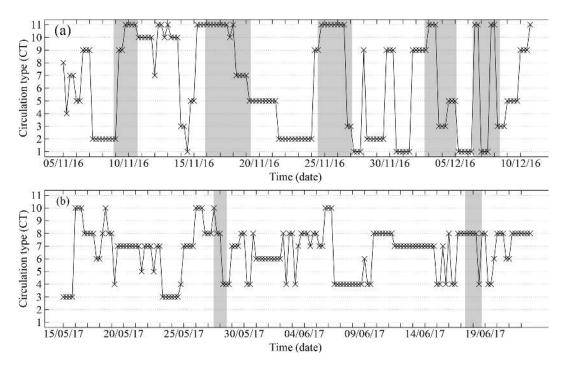
# Table 3. Mean and standard deviation (SD) of climatological conditions in Beijing for each circulation type (CT) for 1988–2017 from ERA-Interim data with frequency (%) of the CT



6100 6550 7000 7450 7900 8350 8800 9250 Geopotential [*m*<sup>2</sup>/*s*<sup>-2</sup>]

**Figure 2.** ERA-Interim (1988–2017) average 925 hPa geopotential with 10 m horizontal wind vector for 11 circulation types classified for Beijing (municipal boundary; thin solid line) surroundings (31–49° N, 103–129° E) determined with the SANDRA method (COST733 class software). Frequency of occurrence is given in the cluster caption. For a discussion of conditions associated with each CT, see Sect. 4.3.

North-westerly flow (over Beijing) is driven by high pressure in the west of the domain (Fig. 2). These are followed by CTs 5, 3 and 7, occurring 14 %, 7 % and 4 % of the time, respectively. CTs 3 and 5 are associated with relatively low pressure in the north-east (September–May period), while CT 7 has a south-easterly winds from the Bohai Sea. CTs 4, 6 and 8 did not occur during the winter campaign. During the summer campaign (Fig. 3b), the most frequent CTs were 8, 7, 4 and 6 (33%, 25%, 19% and 10% of the time, respectively). CTs 8 and 6, which did not occur during the winter campaign period, are associated with the summer monsoon, advecting moist, warm air from the south and south-east (Fig. 2). While southerly and northerly flows converge over Beijing for CT 6, slightly weaker low pressure to the north-east means north-westerly flow dominates for CT



**Figure 3.** Time series of circulation types (CTs) during the two field campaigns: (a) winter and (b) summer. The 11 CTs are shown in Fig. 2; see text for an additional description. Shading shows the pollution events identified in Sect. 5 and Fig. 5.

4. High pressure to the west or south of Beijing is rare during the summer campaign, so that CTs 1, 2, 9 and 11 do not occur, and CTs 3 and 5 are rather rare (5% and 1%, respectively).

# 4.4 Meteorological conditions during the field campaigns

To assess how local-scale flow related to ERA-Interim fields (Sect. 4.3) compared to local conditions, the link between the coarse gridded data and tower-based sonic anemometer observations is explored based on wind roses (Fig. 4). The 30-year climatology (Fig. 4a, d) confirms the clear seasonality in wind direction affecting the occurrence of CTs discussed (Sect. 4.3); i.e. during the winter intensive campaign period (10 November-10 December), north-easterly flow clearly dominates, while southerly wind directions are most common during the summer campaign period (20 May-22 June). The wind roses for winter 2016 and summer 2017 (Fig. 4b, e) are slightly noisier but show similar tendencies to the climatology. The general large-scale patterns are consistent with the in situ wind measurements (Fig. 4c, f). However, a slight diversion towards northerly and south-westerly flow and lower wind speeds occurred in winter and summer (Fig. 4c and f), respectively, when compared to the largerscale data (Fig. 4b and d). In addition, south-westerly flows were more frequent in winter 2016 (Fig. 4b and c) than during the 30-year average climatology (Fig. 4a), which had

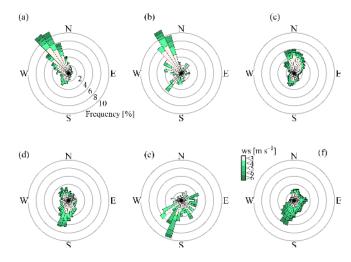


Figure 4. Beijing wind roses: (a, b, d, e) ERA-Interim 10 m horizontal wind ( $40^{\circ}$  N, 116.5° E) and (c, f) sonic anemometer (Table 1) at IAP 320 m a.g.l. for (a) 5 November–10 December in 1988–2017, (d) 15 May–22 June in 1988–2017, (b, c) 5 November–10 December 2016 and (e, f) 15 May–22 June 2017.

the potential to bring more polluted air in the upwind Hebei province to the observation sites in Beijing.

At 102 m, the flow is consistent with northerlies and northwesterlies in the winter campaign and dominantly southerly and easterlies during the summer campaign (Fig. S1 in the Supplement). The measured hourly mean wind speed, temperature and relative humidity were  $3.1 \text{ m s}^{-1}$ ,  $8.3 \,^{\circ}\text{C}$  and 43.8 % in winter, and 3.6 m s<sup>-1</sup>, 25 °C and 46.7 % in summer, respectively. Typical diurnal patterns were observed, with higher wind speed and temperature during the day and RH at night. During the winter haze events (defined in Fig. 5), wind speed at 102 m was low (an average of  $1.8 \text{ m s}^{-1}$ ) and mainly from the south-west direction (Fig. S1).

### 5 Air quality during the field campaigns

### 5.1 Winter

During the winter campaign, the daily average concentration of PM<sub>2.5</sub> at IAP was  $91.2 \,\mu g \,m^{-3}$  from the Partisol gravimetric measurements (Table 4) and 94.0  $\mu$ g m<sup>-3</sup> from an online FDMS (filter dynamic measurement system). The maximum hourly PM<sub>2.5</sub> concentration was  $438 \,\mu g \,m^{-3}$  (Fig. 5, which shows the haze events listed in Table 5). PM<sub>2.5</sub> concentrations significantly exceeded both the daily air quality limit of China (75  $\mu$ g m<sup>-3</sup>) and WHO (25  $\mu$ g m<sup>-3</sup>). During the whole winter campaign period, nearly 50 % of the hours had  $PM_{2.5}$  mass concentration higher than 75 µg m<sup>-3</sup> (Fig. 5). The online  $PM_{10}$  concentration observed at the Olympic Park national air quality monitoring station was up to  $560 \,\mu g \, m^{-3}$  during the campaign, with an average of 130.6  $\mu$ g m<sup>-3</sup>. Average concentrations of NO<sub>2</sub>, O<sub>3</sub>, SO<sub>2</sub> and CO were  $69.7 \pm 33.3$ ,  $16.4 \pm 17.0$  and  $14.9 \pm 11.1 \,\mu g \, m^{-3}$  and  $1.53 \pm 1.02$  mg m<sup>-3</sup>, respectively (Table 4). Most of the criteria pollutants showed a similar temporal pattern (Fig. 5), except O<sub>3</sub>.

The daily average concentration of  $PM_{2.5}$  was 99.7 µg m<sup>-3</sup> at Pinggu (Table 4; based on Partisol gravimetric measurements). The maximum hourly PM<sub>2.5</sub> concentration was  $617 \,\mu g \, m^{-3}$  (Fig. 5). Similar to that at IAP, nearly 50% of the hours had PM25 mass concentrations greater than  $75 \,\mu g \, m^{-3}$ . Average concentrations of NO<sub>2</sub>, O<sub>3</sub>, SO<sub>2</sub> and CO are 46.4 $\pm$ 25.5, 22.3 $\pm$ 22.2 and 15.4 $\pm$ 6.7 µg m<sup>-3</sup> and 1.47 $\pm$ 1.17 mg m<sup>-3</sup>, respectively (Table 4). PM<sub>2.5</sub> was slightly higher at the rural site but NO, CO and SO<sub>2</sub> were comparable between the two sites. PM2.5 and O3 each had similar temporal patterns at the urban and rural sites (Fig. 5), indicating a synoptic-scale meteorological impact. The larger difference in the temporal variation of NO, NO<sub>2</sub> and SO<sub>2</sub> may reflect the varying contribution of more local sources. Large differences in temporal patterns of air pollutants were found on 4 December 2016 when PM<sub>2.5</sub>, SO<sub>2</sub> and NO concentrations were much higher at Pinggu than at IAP.

Diurnal cycles of particles,  $NO_2$  and CO showed no distinct peak but an increment during the nighttime, suggesting the possible impact of boundary layer and/or anthropogenic emissions in winter (Fig. 6). The peak NO levels at 07:00 LT are likely caused by the morning rush hour road traffic.  $PM_{2.5}$ concentration increased sharply from 18:00 LT at Pinggu (not shown), suggesting important local emissions, likely domesVariations of particles,  $NO_x$  and  $SO_2$  show higher levels of these pollutants when air masses were from the south or south-west (Fig. S2), indicating it was impacted by regional transport. All pollutants, except  $O_3$ , had higher mass concentrations when wind speeds were low, suggesting an influence from the local sources. The NO wind rose suggests a strong local source with little contribution from long-range transport. The  $O_3$  concentration was higher during northerlies and when the concentrations of other pollutants such as  $NO_x$  and  $PM_{2.5}$  were lower (Fig. S2).

SNAQ box measurements at six levels (8 to 320 m) during the winter campaign (Fig. 7) have similar overall temporal patterns of CO and NO to that measured by standard gas analyser (Fig. 5). In most cases, the air pollutant levels are similar at different levels of the tower. There are notable differences in NO, CO and CO<sub>2</sub> on 11, 12 and 16–17 November, which suggests that the mixed layer height was low (e.g. <150 m). Interestingly, the O<sub>x</sub> (NO<sub>2</sub> + O<sub>3</sub>) levels are relatively homogeneous across the different levels. These measurements have implications on the role atmospheric chemistry play in transformation of species in the boundary layer, and the measurements also provide useful information that confirms mixed layer height determinations from independent methods such as the ceilometer (Table 1).

According to the meteorological standards (QX/T113-2010), haze is defined as (i) visibility < 10 km at relative humidity (RH) < 80 % or (ii) if RH is between 80 and 95 %, visibility < 10 km and PM<sub>2.5</sub> > 75  $\mu$ g m<sup>-3</sup>. During the winter campaign, 640 of the 1633 h were classified as haze periods using visibility data from Beijing Capital Airport (Fig. S3); within the haze hours, 75 % had PM<sub>2.5</sub> greater than 75  $\mu$ g m<sup>-3</sup> (Area A; Fig. S3) and the rest had a visibility less than 10 km but with a RH < 80 % (Area B; Fig. S3).

Characteristics of five major haze events during the winter campaign (Fig. 5) show that  $PM_{2.5}$ ,  $NO_2$ ,  $SO_2$  and CO had similar trends but  $O_3$  levels dropped to very low concentration (<2 ppb). The events are defined in Table 5.

### 5.2 Summer

Concentrations of air pollutants excluding ozone during the summer campaign were much lower than in winter (Fig. 8, Table 4). Average daily concentration of PM<sub>2.5</sub> and PM<sub>10</sub> at IAP were  $31.4 \pm 14.7$  and  $74.9 \pm 29.3 \,\mu\text{g}\,\text{m}^{-3}$ (based on the gravimetric method), respectively. These levels were slightly higher than those at Pinggu ( $27.8 \pm 13.3$  and  $62.9 \pm 29.3 \,\mu\text{g}\,\text{m}^{-3}$ ). Concentrations of ozone were 4–5 times higher during the summer campaigns ( $106.9 \pm 71.6 \,\mu\text{g}\,\text{m}^{-3}$ at IAP and  $91.8 \pm 62.7 \,\mu\text{g}\,\text{m}^{-3}$  at Pinggu) than in the winter campaign. Average concentrations of NO<sub>2</sub>, SO<sub>2</sub> and CO were  $41.3 \pm 23.5$ ,  $6.3 \pm 6.8 \,\mu\text{g}\,\text{m}^{-3}$  and  $0.61 \pm 0.32 \,\text{mg}\,\text{m}^{-3}$  at IAP, respectively (Table 4). The concentrations of NO<sub>2</sub> and CO were lower at Pinggu, while that of SO<sub>2</sub> was similar. All

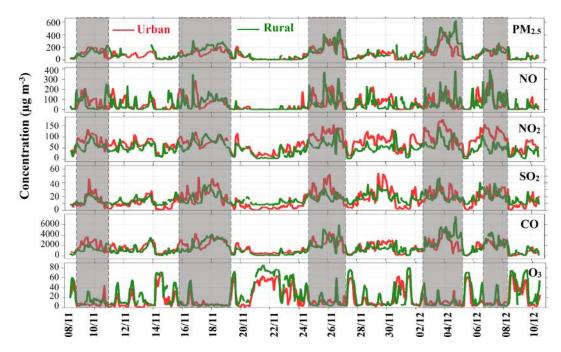


Figure 5. Time series of air quality variables at the urban and rural sites during the winter campaign. Five haze events are indicated (shading; see also Table 4).

**Table 4.** Average air quality variables at IAP, Pinggu and 12 national monitoring sites (12N) during the field campaigns (10 November–11 December 2016; and 21 May–22 June 2017). The 12 national sites 5-year mean concentrations for same times of the years (12N-5Y) and for the same time of the year (campaign period) (12N-campaign) are shown. Data are mean  $\pm$  SD (range of daily mean concentration).

Pollutant <sup>a</sup>	Wii	nter (10 Novemb	er–11 December	2016)		Summer (21 Ma	ay–22 June 2017	7)
	IAP	PG	12N-5Y	12N-campaign	IAP	PG	12N-5Y	12N-campaign
PM <sup>b</sup> <sub>2.5</sub>	$91.2 \pm 63.7$ (10.3–239.9)	99.7 ± 77.8 (13.3–294.3)	84.01 ± 89.1 (3.2–593.3)	95.3±79.6 (4.7–408.8)	$\begin{vmatrix} 31.4 \pm 14.7 \\ (12.2-78.8) \end{vmatrix}$	$27.8 \pm 13.3$ (10.6–70.3)	$58.7 \pm 40.0 \\ (4.2 - 250.3)$	41.7±22.3 (8.9–134.1)
PM <sup>b</sup> <sub>10</sub>	$130.6 \pm 87.0$ (20.0-329.2)	$121.9 \pm 80.4 \\ (10.4 - 312.1)$	$112.8 \pm 102.2 \\ (5-662.0)$	$\begin{array}{c} 134.5 \pm 100.4 \\ (6.0550.1) \end{array}$	$74.9 \pm 29.3 \\ (22.5-164.6)$	$\begin{array}{c} 62.9 \pm 29.3 \\ (15.1 - 141.9) \end{array}$	$94.6 \pm 52.7 \\ (5.0-463.2)$	$81.9 \pm 37.1$ (6.0–277.8)
NO <sub>2</sub>	$69.7 \pm 33.3 \\ (10.2 - 167.3)$	$46.4 \pm 25.5$ (2.3–132.4)	57.7±33.9 (3.9–166.4)	$66.4 \pm 31.3$ (7.3–156.6)	$\begin{array}{c c} 41.3 \pm 23.5 \\ (9.2 - 142.9) \end{array}$	$\begin{array}{c} 29.3 \pm 10.3 \\ (9.3 - 84.0) \end{array}$	$\begin{array}{c} 40.6 \pm 17.9 \\ (8.1  132.4) \end{array}$	$37.6 \pm 16.2$ (12.5–92.8)
SO <sub>2</sub>	$14.9 \pm 11.1$ (0.1–50.8)	$\begin{array}{c} 15.4 \pm 6.7 \\ (6.2 - 44.4) \end{array}$	$16.6 \pm 16.2$ (1.4–112.0)	$14.2 \pm 9.4 \\ (2.1 - 51.4)$	$6.3 \pm 6.8 \\ (0.1 - 38.2)$	$8.9 \pm 4.7$ (4.2–41.2)	$\begin{array}{c} 10.1 \pm 10.6 \\ (1.8 - 82.3) \end{array}$	$7.4 \pm 6.6$ (1.8-64.5)
СО	$\begin{array}{c} 1.53 \pm 1.02 \\ (0.7  5.0) \end{array}$	$1.47 \pm 1.17$ (0.1–6.9)	$1.65 \pm 1.38$ (0.1–9.6)	$\begin{array}{c} 1.86 \pm 1.17 \\ (0.3 - 5.7) \end{array}$	$\begin{array}{c c} 0.61 \pm 0.32 \\ (0.1 - 2.5) \end{array}$	$\begin{array}{c} 0.52 \pm 0.29 \\ (0.1  2.3) \end{array}$	$\begin{array}{c} 0.93 \pm 0.74 \\ (0.28.7) \end{array}$	$0.74 \pm 0.33 \\ (0.2-2.5)$
O <sub>3</sub>	$16.4 \pm 17.0$ (0.3-63.3)	$22.3 \pm 22.2$ (2.9–78.0)	$21.8 \pm 20.5$ (1.0-72.9)	$17.5 \pm 19.2$ (2.1-67.4)	$\begin{vmatrix} 106.9 \pm 71.6 \\ (2.0-349.3) \end{vmatrix}$	$91.8 \pm 62.7 \\ (0.2-291.4)$	$100.4 \pm 67.8 \\ (2.2 - 343.5)$	$110.8 \pm 66.5 \\ (3.6-335.9)$

<sup>a</sup> Units: µg m<sup>-3</sup>, except CO units: mg m<sup>-3</sup>. <sup>b</sup> PM<sub>2.5</sub> and PM<sub>10</sub> from IAP and Pinggu measured by a gravimetric method; all other data are online hourly mean measurements.

pollutants except  $PM_{2.5}$  show more or less different temporal patterns (Fig. 8), suggesting differences in sources at Pinggu and IAP during the summer campaign.

Diurnal patterns of NO, NO<sub>2</sub> and CO at IAP showed a distinct peak in the early morning, suggesting the contribution of traffic emissions (Fig. 6). O<sub>3</sub> and O<sub>x</sub> concentration peaked mid-afternoon. The IAP PM<sub>2.5</sub> pollution rose sug-

gests that both local and regional sources (from the south and south-east directions) impact the site (Fig. S2). Unlike winter, high ozone concentrations occur during southerlies to south-westerlies, suggesting a regional source of this pollutant. NO and NO<sub>x</sub> were largely from local sources during the summer campaign.

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Table 5. Haze	neriods durin	ng the summer	and winter	campaton	neriods
Table S. Haze	perious uurin	ig une summer	and winter	campaign	perious.

Event	Time (LT)	$PM_{2.5} (\mu g  m^{-3})$	Visibility (km)
Winter haze event 1	11/08 21:00-11/10 16:00	158 (79–229)	4.1 (2.3–8)
Winter haze event 2	11/15 21:00-11/19 08:00	143 (56–244)	4.2 (0.6-8)
Winter haze event 3	11/24 12:00-11/27 02:00	210 (68-363)	4.2 (1.5-8)
Winter haze event 4	12/02 16:00-12/05 02:00	239 (58-530)	3.9 (0.9-8)
Winter haze event 5	12/06 09:00-12/08 10:00	144 (64–229)	4.6 (2.2-8)
Summer haze event 1	27/05 12:00-28/05 13:00	107 (62–163)	6.8 (4.5–9)
Summer haze event 2	17/06 09:00-18/06 17:00	90.5 (60–153.3)	9.3 (7–13)

Note: data in parentheses show the hourly range.

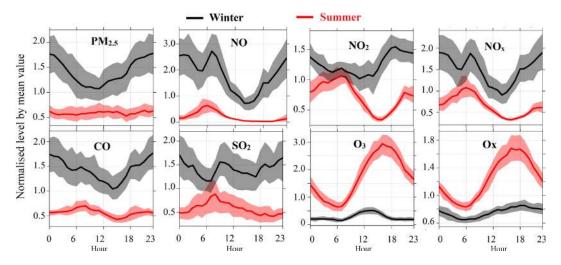


Figure 6. Diurnal patterns of gaseous pollutants normalised by average concentrations at IAP during winter and summer campaigns. The line shows the mean concentrations and shaded area as 95 % confidence interval in the difference in mean concentrations.

Characteristics of two minor haze events (IAP) during the summer campaign (Fig. 8) are shown in Table 5.

# 5.3 Air quality in the wider Beijing megacity during the field campaigns

To assess if the IAP air quality is broadly representative of the wider Beijing megacity, air quality parameters at the 12 national air quality stations were correlated with each other (Fig. 9). A high correlation is observed with  $PM_{2.5}$  across all sites except the rural background air quality station at Ming Tombs (G2; Fig. 1);  $PM_{10}$ , CO and NO<sub>2</sub> at the urban sites are highly correlated but not with the rural and suburban sites (G2, G9 and G10; Fig. 1), suggesting a more local source for these pollutants, comparing to  $PM_{2.5}$  and O<sub>3</sub>; SO<sub>2</sub> between sites shows a lower correlation compared to all other pollutants. The particularly high spatial correlations of both  $PM_{2.5}$  and O<sub>3</sub> across almost all sites indicate a regional pollution phenomenon for the two pollutants. These results suggest that the air quality at the IAP urban site was broadly consistent with that at the other urban sites.

In general,  $PM_{2.5}$  mass concentrations are similar at all the urban sites including IAP which are higher than at the subur-

ban and rural background national monitoring sites (G2, G9 and G10; Fig. S4). The Pinggu site has relatively high  $PM_{2.5}$ pollution during the winter campaign but has the lowest concentrations during the summer campaign. This suggests that local anthropogenic sources have a major impact on  $PM_{2.5}$  at this site during the winter campaign. Source apportionment results, notably high-time-resolution data, are being used to explore this.

The PM<sub>2.5</sub> concentrations measured at IAP are highly correlated with those at the nearby national air quality station (Olympic Park or Aoti Zhongxin; see Fig. 1) (Fig. S5), which gives confidence that national air quality stations are of sufficient quality to provide valuable information on the spatial and temporal variation of key pollutants to supplement campaign measurements.

Table 4 shows that the IAP concentration data for all air quality variables are very close to the 5-year mean of the 12 national air quality monitoring stations. This lends further confidence that the chosen urban site represented well the overall pollution levels in the Beijing urban area.

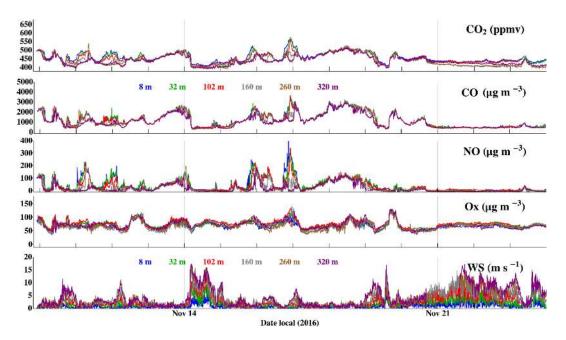


Figure 7. Time series of  $CO_2$ , CO, NO,  $O_x$  ( $NO_2 + O_3$ ) and wind speed at six heights (colour) measured with SNAQ boxes on the IAP tower during the winter intensive field campaign.

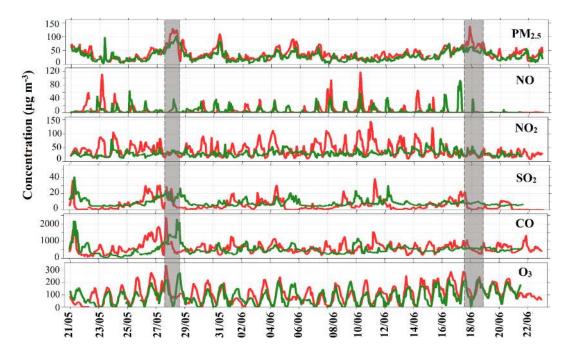
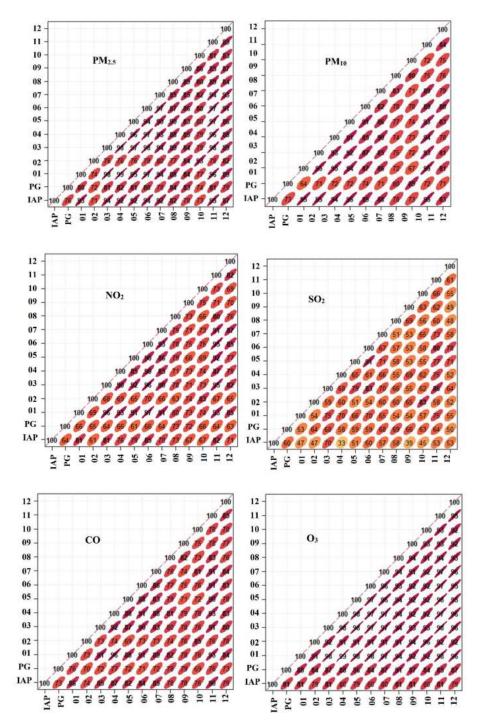


Figure 8. Time series of air quality variables at the urban and rural sites during the summer campaign. Two minor haze events are indicated (shading).

### 5.4 Synoptic circulation and air quality

The average mixed layer height observed at IAP varies with season and CT type (Fig. 10a). Lower mixed layer height is usually linked to air pollution events. The 11 CTs (Sect. 4.3) are clearly associated with distinct air quality conditions based on analysis of hourly air quality data for 2013–2017 at

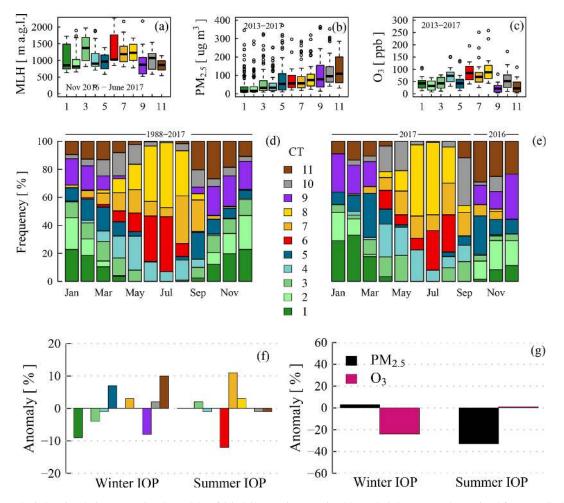
one of the national urban air quality stations (G11, Olympic Park; Fig. 1). Relatively low wind speeds of CT 7 may contribute to the long haze event from 15 to 19 November 2016 (Fig. 5). Most haze events during the winter campaign are cleared out by fresh air masses being advected from the north in CTs 3 or 5 (Fig. 3), which is also marked by the increase



**Figure 9.** Correlations between the air quality at IAP, PQ and 12 monitoring station around Beijing. Stations G1–G12 (Fig. 1b) are labelled 01–12; PG is Pinggu.

in wind speed observed (Fig. S1). Relatively lower  $PM_{2.5}$  concentrations occurred (Fig. 10b) under NE flow conditions (CTs 1–5) and higher concentrations during southerly flow (CTs 6–8, 10). The highest  $PM_{2.5}$  concentrations occur during the heating season when regional flow showed stagnation (CTs 9, 11). All haze events during the winter campaign

(Figs. 3 and 5) are dominated by those CTs, although CTs with NE flow conditions occurred for short periods within the haze events (e.g. 18 November 2016, 4 December 2016). Ozone levels are highest during CTs 5–8 (Fig. 10c), which predominate during spring and summer (Fig. 10d).



**Figure 10.** Analysis by circulation type (CT; Sect. 4.3) of (a) daily maximum mixed layer height (MLH) determined from ALC observations at IAP between November 2016 and June 2017 (analysis method; Kotthaus and Grimmond, 2018b); concentration of (b)  $PM_{2.5}$  and (c)  $O_3$  at the Olympic Park (i.e. Aoti Zhongxin, Fig. 1) in 2013–2017 from the national air quality network for different CTs; occurrence of CTs in (d) 1988–2017 and (e) October 2016–September 2017; (f) anomaly of CT frequency during the campaigns compared to 5-year (2013–2017) averages; and (g) anomaly of  $PM_{2.5}$  and  $O_3$  during the campaigns compared to 5-year (2013–2017) averages. IOP is the intensive observation period (i.e. campaign period).

In the October 2016–September 2017 period (Fig. 10e), the relative frequency of CTs differs slightly from the longterm climatology (Fig. 10d). During the winter campaign, clean air advection from the NE (CTs 1-3) was less frequent than in the 30-year climatology. Given synoptic circulation types associated with stagnation do have a similar occurrence during the winter campaign compared to the same time period within the previous 5 years (with CT 9 being 8% less frequent and CTs 10 and 11 being 2 % and 10 % more frequent; Fig. 10f), PM<sub>2.5</sub> concentrations were similar to the 5-year mean (Fig. 10g, winter campaign period compared to the same dates during 2013–2017). During the summer campaign, south-north contrasts in geopotential were apparently reduced, so CT 6 was 12 % less frequent, while CT 7 was 11 % more frequent (Fig. 10f). The reduced advection of particles from southerly directions might have contributed to

a 33 % lower PM<sub>2.5</sub> concentrations compared to the 5-year average for the same time of year (Fig. 10g). The relative decrease in O<sub>3</sub> (Fig. 10g) during the winter campaign (24 %) might be explained by cloud cover differences, which is being investigated.

### 5.5 Summary of air quality during the campaigns

In summary, the winter campaign was characterised by several high  $PM_{2.5}$  pollution events, with peak hourly concentrations ranging up to  $617 \,\mu g \,m^{-3}$  (at Pinggu), whereas the summer experienced events of high ozone concentrations with the highest hourly average of  $335 \,\mu g \,m^{-3}$  (at IAP). Air quality was generally poor during the winter campaign, with an average  $PM_{2.5}$  concentration of  $91 \,\mu g \,m^{-3}$  in urban Beijing but less severe than in the same period in 2015. Synoptic-scale meteorological analysis suggests that

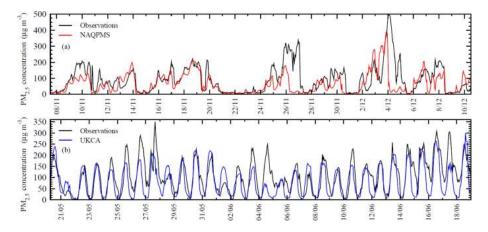


Figure 11. Comparison of observed (at IAP) and modelled pollutant concentrations showing (a)  $PM_{2.5}$  concentrations during the winter campaign compared with NAQPMS simulations and (b)  $O_3$  mixing ratios in summer compared with UKCA simulations.

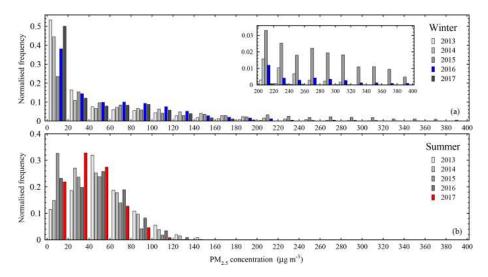


Figure 12. Frequency distribution of  $PM_{2.5}$  in Beijing over the winter (a) and summer (b) campaign periods from the NAQPMS model compared with those from the same periods over the past 5 years under the same emission conditions.

the greater stagnation and weak southerly circulation in November/December 2016 contributed to the poor air quality during all haze events detected, and overall the PM<sub>2.5</sub> pollution level was similar to the 5-year average (2013–2017). PM<sub>2.5</sub> levels were relatively low during the summer campaign, with the highest daily concentration of only  $79 \,\mu g \,m^{-3}$ , matching the cleanest periods over the previous 5 years.

# 6 Preliminary air quality modelling and pollution climatology of the campaign periods

Air quality modelling is a key component of the APHH-Beijing programme. A range of models have been applied that span global (UKCA, GEOS-Chem), regional (WRF-Chem, CMAQ, NAQPMS) and urban to street scales (ADMS). This section provides an example of the comparison between model-simulated pollutant concentrations and APHH-Beijing observations made at IAP to demonstrate model capabilities. Results from specific modelling studies will be published separately.

Figure 11a shows that the magnitude and variation of wintertime PM<sub>2.5</sub> concentrations are reasonably reproduced by NAQPMS during the winter campaign, although there is some weakness in capturing the highest PM<sub>2.5</sub> levels during the haze events at the end of November and start of December. This is partly due to the representation of local meteorological features during this period, which bring these episodes to an end 6–12 h early. The diurnal variations in O<sub>3</sub> during the summertime are reproduced relatively well by UKCA, which captures the rapid daytime formation of O<sub>3</sub> and strong nighttime removal (Fig. 11b). The highest levels of daytime O<sub>3</sub> are underestimated with the model, particularly during the episode at the end of May. However, there is a strong local contribution to this, as evident from the lower concentrations measured at Pinggu (Fig. 8), and these local differences are not fully resolved with the model. Despite this, the day-on-day build-up of daytime  $O_3$  during the periods of 22–27 May and 11–16 June is captured and demonstrates that the model reproduces the synoptic drivers of local  $O_3$  formation well.

We also investigated how representative the campaign periods were of the selected seasons in Beijing by comparing pollutant levels with those from the same period each year over the 2013-2017 period. The NAQPMS model was run for the full 5-year period driven by NCEP meteorology and using temporally varying emissions for a single year that is broadly representative of 2013 conditions. The same emissions were used each year so that the meteorological contribution to pollutant levels could be assessed. This provides important information that cannot be obtained from the monitoring data (as emission varies year by year). The frequency distribution of PM<sub>2.5</sub> over each campaign period for each year is shown in Fig. 12. Winter 2016 was broadly typical of the 5-year period, with similar characteristics to winter 2014, but both years show higher PM2.5 under the same emissions than in 2013 or 2017. In addition, winter 2015 had substantially less favourable conditions for air quality, and more stagnant conditions led to three extended pollution episodes over the period with  $PM_{2.5}$  exceeding 200 µg m<sup>-3</sup>. In contrast, the summer period in 2017 was cleaner than average, with PM<sub>2.5</sub> levels very similar to 2015, and about 25 % less than in 2013, 2014 or 2016. These results are broadly consistent with those based on synoptic weather analyses (Sect. 5.4) as well as by Vu et al. (2019).

### 7 Summary

APHH-Beijing is an integrated and multidisciplinary research programme conducted by leading UK and Chinese researchers to (1) quantify sources and emissions of urban atmospheric pollutants; (2) elucidate processes affecting urban atmospheric pollution events; (3) estimate the personal exposure and impacts of air pollution on human health and (4) develop intervention strategies to improve air quality and reduce health impacts in the Beijing megacity. This introduction paper outlines the motivation of the APHH-Beijing programme and provides the background air quality and meteorological conditions during the two intensive field campaigns that form the basis of data interpretation for campaign observations.

APHH-Beijing has measured the fluxes of key air pollutants, including  $NO_x$ , CO, BC, VOCs and speciated particulate matter, applied a suite of traditional and modern techniques to apportion the sources of particulate matter, determined a wide range of pulmonary and cardiovascular biomarkers linking to direct personal exposure and extensive fixed-station monitoring as well as source apportionment results and has evaluated the effectiveness of Beijing's air pollution control policies using both chemical transport models and novel machine learning techniques. A number of papers have already been published by the APHH-Beijing programme including those in this special issue (J. Wang et al., 2019; Pan et al., 2019; Xia et al., 2018; Zhou et al., 2018; H. Wang et al., 2018; Lyu et al., 2019; Hollaway et al., 2019; Du et al., 2018; Liu et al., 2019, 2018; Smith et al., 2019; Vu et al., 2019; El zein et al., 2019). More papers are being prepared for publication in this special issue and elsewhere, which will cover (but are not limited to) emission fluxes of air pollutants, chemical composition and source apportionment of fine particles, satellite observations of trace gases and aerosols, sources and processes leading to haze events and photochemical smogs, physical and optical properties of aerosol particles, formation processes of secondary aerosols, urban meteorology, feedbacks between haze, photochemistry and meteorology, integrated regional and urban scale modelling, personal exposure to air pollutants and human health effects of air pollution.

*Data availability.* Data are available at http://catalogue.ceda. ac.uk/uuid/7ed9d8a288814b8b85433b0d3fec0300 (last access: 20 May 2019).

*Supplement.* The supplement related to this article is available online at: https://doi.org/10.5194/acp-19-7519-2019-supplement.

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