To Anonymous Referee 1

General comments: This study showed that that aerosols have very different effects on daytime UHII in different seasons: reducing the UHII in summer, but increasing the UHII in winter. It also found that he seasonal contrast in the spatial distribution of aerosols between the urban centers and the suburbs lead to a spatial discrepancy in aerosol radiative effect. Different mechanisms are analyzed for different seasons. The manuscript has well-presented some interesting findings. However, there are still some major concerns that need to be addressed.

Response: We would like to thank you very much for providing so many insightful comments. Following your comments and suggestions, we have made many changes. The manuscript was also more carefully edited. The responses are highlighted in red; the changes in manuscript are highlighted in blue in this response file.

Comment 1.I suggest the authors combine the first paragraph with the second paragraph. And remove the sentence in the second paragraph, "It is well established that cities are the largest sources of anthropogenic heat emissions as by-products from industrial and human activities. Human activities can also generate large amounts of aerosols that can reduce air quality, change the physical and chemical properties of the atmosphere, and endanger human health (Sanap and Pandithurai 2015, Cohen et al. 2017, Wei et al. 2019a, b)." to the beginning of the third paragraph.

Response: Done per the suggestion.

Comment 2. The sentence "The effect of urbanization on clouds and precipitation has been the focus of many studies (Changnon et al. 1977, Ackerman et al. 1978, Changnon et al. 1991, Shepherd et al. 2002, Shepherd and Burian 2003)" looks very abrupt here. **Response:** We have moved this sentence to line 79 and revised this sentence to "The effect of urbanization on clouds and precipitation has also been the focus of many studies (Changnon et al., 1977; Ackerman et al., 1978; Changnon et al., 1991; Shepherd et al., 2002; Shepherd and Burian, 2003)".

Comment 3.Overall, illustrations with more logics are needed for introduction Section. **Response:** Thank you for this suggestion. Figure 1 is a newly added figure showing the relationship between urbanization, urban heat island, aerosols, local and regional weather and climate.



Figure 1. Illustration of the relationship between urbanization, urban heat island, aerosols, local and regional weather and climate. Solid arrows denote the effect.

Moreover, to be more logical, we moved the sentence "With increasing urbanization in the future, cities are likely to influence local and regional weather and climate to greater and greater degrees." to line 82.

Comment 4.Section 2 is suggested to be "Data and methods". The data, method of Extracting urban impervious surfaces and urban contours, model description should be included separately by three parts. I suggest the authors combine the "research windows" into "method of Extracting urban impervious surfaces and urban contours". And combine the "Aerosol parameters" to the part of "data" together with some data in the present part "Study areas and data". "Study areas" can be removed to the beginning of result analysis. Additionally, the method of calculating USII should be mentioned. **Response:** Done per your suggestion.

The method of calculating UHII is added to section 2.2 on lines 190 to 194: "The UHII is the temperature difference between the average temperature of the urban core window and the average temperature of rural windows, calculated as $UHII = \Delta T = T_u - T_r$, (3) where T_u is the average temperature of an urban area, and T_r is the average temperature of the neighboring rural area."

Comment 5.Figure 1 need some modifications, for example, the city name "Changchun" has been divided into 2 rows.

Response: We have redrawn this figure.

Comment 6.Figure 2 should mark the result of confidence test. The impact factors are more than aerosol. The atmospheric humidity should be included. Here, the relation between USII and visibility may be one-sided. Moreover, the result of urban heat island does not just include the changes in aerosol. In Figure 3, the details of "severe air pollution condition" should be shown, including the data used here, definition of severe air pollution and period of severe air pollution event. It is not clear whether the

 $MUHII = \frac{\sum_{i=1}^{n=15} UHII_{m \sim i} - UHII_{p \sim i}}{n}$ is calculated based on several severe air pollution

event or not. The details should be addressed and added.

Response: We did the confidence test (95%) and added this information to Figure 3 on line 252. We agree with you that aerosols are not the only factor affecting UHII, so we added the relationship between UHII and relative humidity (RH) to Figure 3. Figure 3b shows that there is a positive correlation between RH and UHII, but it is less significant than the correlation between UHII and visibility (p-value of visibility > RH).



Figure 3. (a) Clear-day visibility trend (unit: km yr⁻¹) shown as a function of the UHII trend (K yr⁻¹), and (b) clear-day visibility (unit: km) and relative humidity shown as a function of UHII (unit: K). The period is 2001-2015. The black and green lines is the linear best-fit line through the points. Sample numbers of (a) and (b) are 68 and 510 respectively. The least-squares regression equation is given in each panel. The coefficient correlation (R) and p-value are also given, and all of them pass confidence test in 95%.

The new figure updates the previous figure, and the following sentence was added (lines 242 to 246): "Also analyzed was the relationship between RH and UHII. Figure 3b shows that there is a positive correlation between RH and UHII, but it is less significant than the correlation between UHII and visibility (p-value of visibility > RH). Note that not only these two factors affect UHII. Many other factors affect UHII, but this study mainly focuses on the aerosol effect."

We have added information about "polluted days" in the upper right corner of Figure 4a.

In Figures 4 and S4, we directly compared UHII under polluted conditions and UHII for all days. We deleted the previous version of the figure and the following sentence:

$$MUHII = \frac{\sum_{i=1}^{n=15} UHII_{m \sim i} - UHII_{p \sim i}}{n},$$
(3)

where *MUHII* is the difference between the UHII under severe air pollution conditions and the average UHII, *n* is number of years from 2001 to 2015, *i* represents a specific year during 2001–2015, $UHII_{m\sim i}$ is the average UHII in year *i*, and $UHII_{p\sim i}$ is the UHII under severe air pollution conditions in a year *i*. Figure S3 shows the *MUH11* at each city under polluted conditions and for all days.

Comment 7.Figure 5, "red curves" should be changed to "red curve", "black curves" to "black curve". How did the PM2.5 concentration bins get? And was the urban-rural PM2.5 difference corresponded to the PM2.5 concentration bins? Some descriptions should be added. Same information for AOD is also needed.

Response: Done per your suggestion. Here we divided $PM_{2.5}$ concentration into four bins, and calculated the $PM_{2.5}$ concentration difference in each bin, the method was shown in lines 302 to 303. Therefore, the $PM_{2.5}$ difference is corresponded to each $PM_{2.5}$ concentration bins.

We also added more information about AOD (lines 305 to 307): "Five zones were selected based on the distance to the urban geometric center of all cities: Zone 1: 0–10 km, Zone 2: 11–20 km, Zone 3: 21–30 km, Zone 4: 31–40 km, and Zone 5: 41–50 km, then the average AOD for each zone was calculated."

Comment 8.A better quality of combination figure is needed for Fig. 8. The meaning of arrows in Fig. 9 should be given.

Response: We have redrawn Figure 9. Regarding Figure 10 (lines 365 to 367): "The red arrows mean the change ranges from clean conditions to polluted conditions, the blue arrow mean the change range from summer-polluted condition to winter-polluted condition."

Comment 9.Page 19, Line 368, "In summer (Figure 11 a), aerosols reduce UHII throughout all day; but in winter (Figure 11 b), aerosols enhance UHII in the afternoon. These results are consistent with the observational results shown in Figure 3". Figure 3 cannot provide the consistent result. Figure 3 shows the result at annual scale. However, Figure 11 is the simulation for an event for three days.

Response: Figure 4 shows that aerosols reduce UHII in summer and enhance UHII in winter. Figure 12 shows similar results on a daily scale. To express this more accurately, we changed the sentence "These results are consistent with the observational results shown in Figure 4" to "This shows the effect of aerosols on UHII on a daily scale, supporting Fig. 4." on line 394.

To Anonymous Referee 2

General comments: This study investigated the relationships between daytime surface urban-heat-island (SUHI) intensity and aerosol pollution in summer and winter and their seasonal difference in China by using multi-source observations. The topic is very interesting and has important climate, environment and health implications. This study has the potential to provide new insights about urban climate change and their seasonal change under heavy air pollution context. The manuscript is written clearly, and I really like the schematic diagram in figure 12. While I found some minor issues need to be addressed. My recommendation is to accept with minor revision.

We would like to thank you very much for providing so many insightful comments. Following your comments and suggestions, we have made many changes. The manuscript was also more carefully edited. The responses are highlighted in red; the changes in manuscript are highlighted in blue in this response file.

Comment 1. Introduction: UHI can be defined by satellite-based Land surface temperature (LST) (i.e., surface UHI) and also can be defined by surface air temperature (SAT) recorded by stations. There still is a bit differences in these two definitions and their drive factors, although SAT is closely related to LST. Therefore, some papers in the Introduction need to be stated clearly for which definition. In addition, suggest that surface is added in the paper Title and the MS.

Response: We agree with you that UHII mainly contains surface and atmospheric urban heat islands. We added the sentence "While the UHI mainly involves surface and atmospheric UHIs, this study focuses on surface UHI." on line 57. We also changed the title to "The Mechanisms and Seasonal Differences of the Impact of Aerosols on Daytime Surface Urban Heat Island Effect" in the manuscript and supplement.

Comment 2. Method: about meteorological station should be added in figure 1 or in the supplementary? How did you choose the urban and rural (i.e. reference) stations in each city?



Response: We added the spatial distribution of meteorological stations in Figure S1:

Figure S1. Spatial distribution of meteorological stations located in 35 cities.

We added the sentence "Figure S1 shows the spatial distribution of the meteorological stations." on line 138.

We selected these stations city by city. Urban stations are those stations located within the urban boundaries shown in Figure 2. Rural stations are those stations located outside urban boundaries, least affected by urban areas and with the lowest altitude difference with the urban areas.

Comment 3. Sample numbers should be added in Figure 2.

Response: Figure 3 results are based on Figure S5. Samples numbers in Figure 3a and Figure 3b are 68 and 510, respectively (see line 250).

Comment 4. Please check whether eq.3 matched with the text in lines 239-240? Also y-axis title should be MUHII (or MSUHII)?

Response: In Figures 4 and S4, we directly compared UHII under polluted conditions and UHII for all days. We deleted the previous version of the figure. The following passage has been deleted:

$$MUHII = \frac{\sum_{i=1}^{n=15} UHII_{m \sim i} - UHII_{p \sim i}}{n},$$
 (3)

where *MUHII* is the difference between the UHII under severe air pollution conditions and the average UHII, *n* is number of years from 2001 to 2015, *i* represents a specific year during 2001–2015, $UHII_{m\sim i}$ is the average UHII in year *i*, and $UHII_{p\sim i}$ is the UHII under severe air pollution conditions in a year *i*. Figure S3 shows the *MUH11* at each city under polluted conditions and for all days.

Comment 5. Lines 251: aS4ll? What do you mean? **Response:** Here, "sS4ll" should be "all". We have corrected this typo.

Comment 6. Lines 272-276: excepting temperature inversion-induced stable PBL, aerosol pollutions usually accompanied with low wind speed (particularly <2m/s), which is also favorable to both heat accumulation / store and UHI enhancement.

Response: Yes, you are right. We added more explanations on lines 289 to 291: "In addition to a temperature-inversion-induced stable PBL, air pollution is usually accompanied by low wind speeds (particularly $< 2m \text{ s}^{-1}$), also favorable to both heat accumulation and storage."

Comment 7. Lines 292-293: In the daytime during winter, the high aerosol concentrations in the rural areas, due to high emission induced by coal heating in rural area in the north China, while in south more industries in rural areas under stagnant atmospheric conditions? This seasonal variation in urban-rural difference may modulated by the combined effects of PM2.5 emission, transportation and diffusion (please refer to Urban-rural differences in PM2.5 concentrations in the representative cities of China during 20152018. CHINA ENVIRONMENTAL SCIENCECE, 2019,

39(11): 4552-4560.).

Response: We agree. We added the following sentence (lines 313 to 314): "Many factors (e.g., PM_{2.5} emissions, transportation, and diffusion) may cause the seasonal difference in urban-rural differences (Jiang et al., 2019)."

We also added the reference (line 560): "Jiang, Y. C., Yang, Y. J., Wang, H., Li, Y. B., Gao, Z. Q., and Zhao, C.: Urban-rural differences in PM_{2.5} concentrations in the representative cities of China during 2015–2018, China Environ. Sci., 39(11), 4552–4560, https://doi.org/10.19674/j.cnki.issn1000-6923.2019.0530, 2019."

Note that we have another manuscript under review, focused on the seasonal difference in the urban-rural spatial distribution of air pollution, which also analyzes several potential factors that cause the seasonal difference.

Comment 8. Subfigures in Figure S5 and S7 are very small unclear for readership. **Response:** Figures S6 and S8 have been redrawn for clarity. Increasing the zoom percentage will help with seeing more details.

<u>The Mechanisms and Seasonal Differences of the</u> <u>ImpactOpposite Effects</u> of Aerosols on Daytime <u>Surface</u> Urban Heat Island <u>EffectIntensity between Summer and</u> <u>Winter</u>

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Atmospheric Physics and Chemistry

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Abstract

The urban heat island intensity (UHII) is the temperature difference between urban areas and their rural surroundings. It is commonly attributed to changes in the underlying surface structure caused by 35 urbanization. Air pollution caused by aerosol particles can affect the UHII throughby changing (1) the surface energy balance by Aerosol Radiative Effect (ARE) and (2) PBL stability and air flow intensity by modifyingatmospheric thermodynamic structure which is referred to as Aerosol Dynamic Effect (ADE).-By analyzing satellite data and ground-based observations collected from 2001 to 2010 at 35 cities in China and using the WRF-Chem model, we find that the impact of aerosols on UHII differ considerably: reducing the UHII in summer, but increasing the UHII in winter. This seasonal contrast is proposed to be 40 caused by the different strengths of the ARE and ADE between summer and winter. In summer, the ARE on UHII is dominant over the ADE, cooling down surface temperature more strongly in urban areas than in rural areas because of much higher aerosol loading and offsets the urban heating, therefore weakening UHII. In winter, however, the ADE is more dominant, because aerosols stabilize the PBL more in the polluted condition, weakening the near-surface heat transport over urban areas in both vertical and 45 horizontal directions. This means that the heat accumulated in urban areas is dispersed less effectively and thus the UHII is enhanced. These findings shedfound that aerosols have very different effects on daytime UHII in different seasons: reducing the UHII in summer, but increasing the UHII in winter. The seasonal contrast in the spatial distribution of aerosols between the urban centers and the suburbs lead to a spatial discrepancy in aerosol radiative effect (SD ARE). Additionally, different stability of the 50 planetary boundary layer induced by aerosol is closely associated with a dynamic effect (DE) on the UHII. SD ARE reduces the amount of radiation reaching the ground and changes the vertical temperature gradient, whereas DE increases the stability of the planetary boundary layer and weakens heat release and exchange between the surface and the PBL. Both effects exist under polluted conditions, but their relative roles are opposite between the two seasons. It is the joint effects of the SD ARE and the DE that drive 55

the UHII to behave differently in different seasons, which is confirmed by model simulations. In summer, the UHII is mainly affected by the SD-ARE, and the DE is weak, and the opposite is the case in winter.

This finding sheds a new light on the impact of the interaction between urbanization-induced surface changes and air pollution on urban climate.

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1. Introduction

The global population has been increasingly concentrated in cities (Heilig, 2012). Urbanization in China has dramatically increased from 26% in 1990 to 60% in 2018, resulting in a marked change in theof landscape. It has a significant impact on the urban and rural climate and will continue to make an impact as cities continue to develop (Han et al., 2014).

Urbanization leads to a dramatic change in the underlying surface structure, properties, and spatial distribution of a city, such as a reduction in green areas and a corresponding increase in impervious areas. These changes increase the temperature difference between urban and rural areas, which is known as the urban heat island (UHI) intensity (UHII) (e.g., Kalnay and Cai, 2003; L₂, Zhao et al., 2014; M., Zhao et al., 2016; Zhou et al., 2016; X., Yang et al., 2017). While the UHI mainly involves surface and atmospheric UHIs, this study focuses on surface UHI. 2017. The UHI also affects the structure and movement of cloud systems (Changnon and Westcott, 2002; Kug and Ahn, 2013; Pinto Jr. et al., 2013). Many factors affect the The diurnally and seasonally varying UHI-is affected by many factors, such as

75 weather and climatic regimes, urban impervious surfaces, anthropogenic heat, air pollution, and urban 3D structure (Oke, 1982;; Morris and Simmonds, 2000; Kim and Baik, 2002; Gedzelman et al., 2003; Ryu and Baik, 2012; Ding et al., 2016; Y., Yang Y-et al., 2019).



Figure 1. Illustration of the relationship between urbanization, urban heat island, aerosols, local and regional weather and climate. Solid arrows denote the effect.

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-It is well established that cities are the largest sources of anthropogenic heat emissions as by-products <u>offrom</u> industrial and human activities. Human activities can also generate large amounts of aerosols that can reduce air quality, change the physical and chemical properties of the atmosphere, and endanger human health (Sanap and Pandithurai, $2015_{\frac{1}{27}}$ Cohen et al., $2017_{\frac{1}{27}}$ Wei et al., 2019a, b). With increasing urbanization in the future, cities are likely to influence local and regional weather and climate to greater degrees.

Aerosols can also alter the radiation balance of the climate system. Their thermodynamic effect reduces the amount of radiation reaching the ground, and their microphysical effect can influence cloud properties and precipitation regimes through their impacts on cloud microphysical and dynamic processes (Rosenfeld et al., 2008; Z., Li et al., 2011, 2016, 2019; Fan et al., 2013; Li et al. 2016, Guo et al., 2018; H., Liu et al., 2019, 2019). The effect of urbanization on clouds and precipitation has been the focus of many studies (Changnon et al. 1977, Ackerman et al. 1978, Changnon et al. 1991, Shepherd et al. 2002, Shepherd and Burian 2003). Aerosols can increase cloudiness and cloud thickness and thus change the stability of the planetary boundary layer (PBL)., In humid regions, aerosols may reduce the frequency of

95 light rain but increase heavy rainfall, while in dry areas, aerosols aggravate droughts. Aerosols can also intensify convection by delaying the occurrence of convection and enhancing gust fronts (Khain et al., 2005; Carri ó et al., 2010; Carri ó and Cotton, 2011; Y., Wang et al., 2011; Han et al., 2012; Lee and

Feingold, 2013;, Li et al. 2017, Guo et al., 2016a; Z. Li et al., 2017b). The effect of urbanization on clouds and precipitation has also been the focus of many studies (Changnon et al., 1977; Ackerman et al., 1978;

100 Changnon et al., 1991; Shepherd et al., 2002; Shepherd and Burian, 2003). With increasing urbanization in the future, cities are likely to influence local and regional weather and climate to greater and greater degrees.).

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UHI, surface roughness, and higher aerosol concentrations have been proposed to explain observed urban clouds and precipitation anomalies. Increased urban surface roughness likely does not play a major role in urban-induced precipitation. Rather, the UHI and higher aerosol concentrations may play more important roles (Han et al., 2014). The UHI can alter the water vapor flux (accelerate evaporation), reduce horizontal wind speeds and enhance vertical turbulence, reduce the temperature difference between daytime and nighttime, increase the absorption rate of solar radiation by land, and change underlying surface characteristics (e.g., sensible heat dissipation, convection efficiency, evaporation and cooling, 110 sunlight reflection, and anthropogenic heat transfer) (Jauregui and Romales, 1996; Taha, 1997; Bornstein and Lin, 2000; Givati and Rosenfeld, 2004; Grimmond, 2007; Carrióet, Carrióet al., 2010; L., Zhao et al., 2014; Kaspersen et al., 2015; B., Yang B-et al., 2019).

The UHI and aerosols may interact over cities. Aerosols generally reflect and absorb solar radiation and reduce the amount of shortwave radiation reaching the ground, i.e., the cooling effect of aerosols on

- ground temperature. Some numerical modeling modelling studies have demonstrated that landscape 115 changes reduce<u>change reduces</u> near-surface concentrations of particulate matter $(PM_{2.5})PM_{2.5}$ and that the UHI effect can influence the dispersion of air pollutants (S. Liu et al., 2009; Liao et al., 2015; Tao et al.,- 2015; Zhong et al.,- 2017, 2018). Moreover, aerosols can enhance the UHI at night in(by 0.7 ±0.3) K) for semi-arid cities (by 0.7 ± 0.3 K), and the UHI alters the aerosol concentrations concentration (Cao
- et al., 72016; Fallmann et al., 72016; Lai, 2016). Heavy pollution can reduce UHII in China, especially 120 during the day (H. Wu et al., -2017; Y., Yang et al., -2020).

The Weather Research and Forecasting/Chemistry (WRF-Chem) model has been are used extensively in the simulation and prediction of air quality, the aerosol radiation effect, and aerosol-cloud interactions, and changes in the change of meteorological fields and regional climate (Grell et al., 2005; Chapman et 125 al., 2009). Coupled with the urban canopy model, WRF-<u>Chem</u> can account for the influences of aerosols and land surface changes on the radiative processes if such parameters are fed to the model, e.g., as aerosol loading and single-scattering albedo, surface albedo, and thermal emissivity, roughness, among othersete (Miao et al., 2009; Chen et al., 2011). Many previous pertinent studies are done to date just focused on the annual effects without investigating any seasonal differences and the underlying mechanism. This study aims to fill this gap by analyzing the annual and seasonal effects of aerosols on UHII and proposing

mechanisms that may explain the seasonal differences.

2. DataMethods

2.12. Study areas and methodsdata

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2.1 Data

Thirty five big cities evenly distributed across China were selected in our study. Table S1 lists these cities of different sizes. They represent the major and well-developed metropolitan regions in China. The population and urban areas of these cities have increased faster and/or more dramatic than those of other cities from 2001 to 2015.

Data used in this study include Land Satellite Thematic Mapper/ Enhanced Thematic Mapper (Landsat TM/ETM+) and Moderate Resolution Imaging Spectroradiometer (MODIS) products [including land surface temperature (LST) and aerosol optical depth (AOD)], ground-based data from meteorological stations, PM_{2.5}particulate matter (PM_{2.5}) concentrations, and sounding data.

145 Landsat data are used to identify and outline urban areas and urban <u>contourscontour</u>. The spatial resolution is 30 m. Summertime (June, July, and August) images <u>before or infrom</u> 2000 and <u>in</u> 2015 were examined to ensure the accuracy and consistency of <u>the</u> results.

The MODIS LST product (<u>MYD11A1/A2MYD11A2</u>) at a 1-km spatial resolution was used to calculate urban and rural UHIIs. Since this study is mainly focused on the daytime UHI effect, only data

(daily/eight-day clear-sky LST observations with <u>a</u>1-km spatial resolution) at <u>1330 Beijing Time (13:30</u>
 BJT) for the period 2001–2015 were used. The MYD11A2 product uses the MODIS cloud mask product

(MYD35) to filter out cloudy conditions. A generalized split-window algorithm is applied using MODIS data <u>fromin</u> two longwave bands in the atmospheric window to correct for atmospheric water vapor, haze effects, and the sensitivity to errors in the surface emissivity. <u>Changes in surface emissivity have been</u>

<u>taken into account to To</u> obtain the LST from brightness temperatures, changes in surface emissivity have been accounted for (Wan and Dozier, 1996; Snyder et al., 1998; Wang and Liang, 2009; Yu et al., 2011; Cao et al., 2016).

The MODIS Multi-Angle Implementation of Atmospheric Correction (MAIAC) AOD product, with -is used that has a 1-km spatial resolution and with daily global coverage, is used. This product. It was

retrieved by virtue of a time series analysis and a combination of pixel- and image-based processing to improve the accuracies of cloud detection, aerosol retrievals, and atmospheric correction (Lyapustin et al., 2011a, 2011b, 2012).

A large volume of meteorological data are analyzed, including visibility, surface wind speed, temperature, precipitation, and other parameters every three hours, together with hourly $\underline{PM_{2.5}PM_{2.5}}$ data in urban and

- 165 surrounding rural areas. Figure S1 shows the spatial distribution of the meteorological stations. For consistency To be consistent with the satellite imaging time (133013:30 BJT), the meteorological data and PM_{2.5} PM_{2.5} data observed at 130013:00 and 140014:00 BJT wereare selected. Due to the lack of long-term records of aerosol concentration, visibility is frequently used as a proxy for aerosol loading (K. Wang et al., 2009; J., Wu et al., 2012; X., Yang et al., 2013).
- 170 Validation using Aerosol Robotic Network AOD retrievals shows that the MAIAC and MODIS aerosol retrieval algorithms have similar accuracies over dark and vegetated surfaces and that the MAIAC algorithm generally improves the accuracies of AOD retrievals over bright surfaces such as deserts and urban surfaces (Lyapustin et al., 2011a, 2011b, 2012; Wei et al., 2019c; Z. Zhang et al., 2019). Sounding data and PM_{2.5}The measurements were available from 2013 to 2015. MAIAC AOD retrievals for each
- 175 area were averaged to obtain the spatial distribution of AOD over each city, then the difference in AOD between urban and rural areas was calculated.

L-band sounding data <u>wereare</u> employed, that were acquired at the five radiosonde stations in Beijing, Chengdu, Nanjing, Shenyang, and Xi'an operated by the China Meteorological Administration since 2006. They contain the high-resolution profiles of temperature, pressure, relative humidity (RH),, and 180 wind speed and direction at <u>0800 08:00 Beijing time (BJT_(, UTC+8)</u> and <u>200020:00</u> BJT (<u>W.</u>Zhang et al., 2018; Lou et al., 2019). The data quality of radiosonde measurements has been well validated, <u>making</u> the data suitable for studying and is good enough to study the UHI effect (Guo et al., 2016b).

2.2 Extracting urban impervious surfaces and urban contours

Indices commonly used to extract built-up areas include the Difference Built-up Index (DBI), the Indexbased Built-Up Index (IBI), and the Normalized Difference Built-up Index (NDBI). Another index, the Soil-adjusted Vegetation Index (SAVI), is a modification of the normalized difference vegetation index that corrects for the influence of soil brightness when the vegetative cover is low (Huete, 1988;, Qi et al., 1994;, Rondeaux et al., 1996). After some tests, the difference *NDBI – SAVI* waswere used to extract urban impervious surfaces because of its ability to differentiate urban impervious surfaces from other

land-use types:

$$NDBI = \frac{\rho_5 - \rho_4}{\rho_5 + \rho_4},$$
(1)

$$SAVI = \frac{\rho_4 - \rho_3}{\rho_4 + \rho_2 + L} (1 + L),$$
(2)

where *L* is the soil adjustment factor whose value is 0.5, and ρ_n is the Landsat reflectance of band *n*. We then used different thresholds to extract urban impervious surfaces after calculating *NDBI* – *SAVI*. Results wereare verified by the Google Earth and a land-use map with a 1:100,000 scale from the Resource and Environment Science Data Center of the Chinese Academy of Sciences.

2.3 Research windows

Many previous studies have extracted urban areas from nighttime stable-light data. However, the spatial resolution of such data is low, so the extraction accuracy would be significantly affected in urban areas with uneven zoning and in regions with irregular urban development as in most municipalities in China. The TM/ETM+ data wereare used to accurately extract the physical boundaries of urban areas. The difference in the underlying surfaces of urban and rural areas forms the basis of the urban physical_
boundary extraction. Urban surfaces are generally covered by impervious materials, and rural surfaces are mainly covered by natural surfaces. The influence of the UHI is not only felt within the physical

boundaries of urban areas but also beyond it. In terms of area, this influence can extend from 2 to 2-4 times the extent of an urban area. In terms of distance, the influence of the UHI can be felt as far as 3 to -6 km away from an urban physical boundary (Zhou et al., 2015).

- For each city, nine research windows (6 km x 6 km each) were selected. The windows include one urban window, four suburban windows, and four rural windows. For the study period considered (2001–2015), the urban window represents an area that remained urban and developed during this time. The suburban windows represent areas that were vegetated before the study period. As cities <u>expandedexpand</u>, these areas were gradually replaced by urban impervious surfaces from 2001 to 2015. The rural windows
- 215 represent areas that remained vegetated during the study period. These windows were 10 km away from the urban physical boundary to ensure that these windows were not or were weakly affected by the UHI. The elevations of the areas covered by each window are within 100 m of each other for a given city based on DEM (Digital Elevation Model) data. Water bodies are excluded. Figure <u>S2S1</u> shows the spatial distribution of the nine research windows for a given city. The UHII is the temperature difference between
- 220 the average temperature of the urban core window and the average temperature of rural windows, <u>calculated as</u>-

2.4 Aerosol parameters (AOD, PM_{2.5})

Validation using Aerosol Robotic Network AOD retrievals shows that the MAIAC and MODIS aerosol retrieval algorithms have similar accuracies over dark and vegetated surfaces and that the MAIAC algorithm generally improves the accuracies of AOD retrievals over bright surfaces such as deserts and urban surfaces (Lyapustin, et al. 2011a, 2011b, 2012, Wei et al., 2019c, Zhang et al. 2019). Sounding data and $PM_{2.5}$ measurements were available from 2013 to 2015. $UHII = \Delta T = T_u - T_r$ (3) where T_u is the average temperature of an urban area, and T_r is the average temperature of the neighboring

MAIAC AOD retrievals for each area were averaged to obtain the spatial distribution of AOD over each city, then the difference of AOD between urban and rural areas was calculated.

2.52.3 WRF-Chem model simulations

^{230 &}lt;u>rural area.</u>

- The model used in this study is WRF-Chem 3.9.1, coupled with a single-layer urban canopy model. As 235 shown in Figure S7S6, the domain haswith a horizontal grid resolution of 3 km and 50 vertical levels from the surface to 50 hPa is used. To better characterize the PBL planetary boundary layer, 16 layers are set below 1 km, where 1 km, of which the first layer extends from the surface to ~ 47 m over is about 47 m in Beijing. The Meteorological fields are provided by the National Centers for Environmental Prediction Final Analysis data (NCEP-FNL) provided meteorological fields with awith 6-h temporal frequency and 240 a 1 °×1 ° spatial resolution. The Goddard Earth Observing System-Chem model provided the The chemical lateral boundary and initial conditions. The were provided by GEOS CHEM model. The land cover is derived from the IGBP-Modified MODIS 20-category Land Use Categories dataset derived the land cover.- Monthly 0.25 °×0.25 ° anthropogenic emissions of aerosols and precursors wereare obtained from the Multi-resolution Emission Inventory for China (MEIC, 2012) (http://www.meicmodel.org), 245 providing which provide monthly mean emission data of SO₂, NO_x, CO, NMVOC, NH₃, BC, OC, PM₂, PM₁₀, and CO₂. The <u>The biogenic emission data is provided by the</u> Model of Emissions of Gases and Aerosols from Nature provided biogenic emission data (MEGAN) (Guenther et al., 2006;-Sakulyanontvittaya et al., 2008). The Fire Inventory from NCAR (FINN)-model provided provides the biomass burning emission data (Wiedinmyer et al., 2011). The Carbon-Bond Mechanism version Z 250(CBMZ) chemical mechanism and the Model for Simulating Aerosol Interactions and Chemistry were(MOSAIC) are used in simulations this simulation (Zaveri and Peters, 1999;, Zaveri et al., 2008). Table S1 summarizes other Other details of schemes used in the simulations are shown in Table S3. The simulations are initiated at 1200 UTC 30 June 2015 for summer and 1200 UTC 101 January 2015 for 255 winter. The meteorological fields are reinitialized every 48 hours. We conducted four sets of model experiments (Table S2) to investigate the aerosol radiative impact for both summer and winter: (a) A1Summer with the aerosol radiative effect turned on, (b) A0Summer with the aerosol radiative effect turned off, (c) A1Winter with the aerosol radiative effect turned on, and (d) A0Winter with the aerosol radiative effect turned off. To be consistent with the observation analysis, we select clear-day simulations as the analysis time period by excluding the first 3-day simulation for chemistry spin-up (Table S2). 260

3. The Urban Heat Island (UHI) effect

Selected for the study were 35 large cities evenly distributed across China. Table S3 lists these cities of different sizes. They represent major and well-developed metropolitan regions in China. The population and urban areas of these cities have increased faster or more dramatically than those of other cities. We used the difference NDBI – SAVI to extract urban impervious surfaces, and then determined urban contours based on the identification of impervious surfaces. Figure <u>2</u>+ shows the urban contours of all cities.



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Figure 21. Main urban contours of the 35 cities. Blue contours outline urban boundaries <u>before or in</u> 2000,2001 and red contours <u>outline</u> urban boundaries in 2015. The surface height (in meters above sea level) is indicated by color shading.

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Figure <u>S3S2</u> shows UHII and visibility trends. <u>UHII and visibility have similar trends in</u>For most cities, no matter before <u>andor</u> after 2008. The trends, however, differ pre-, there are similar trends between UHII and visibility; and there is an obvious difference between trend before 2008 and <u>post-2008.trend after</u> 2008 of both UHII and visibility. Figure <u>32</u> shows the relationships between UHII and visibility based on their respective trends shown in Figure <u>S3S2</u>. UHII and visibility are <u>grossly</u> positively correlated grossly. Higher visibility means a lower aerosol concentration, leading to a higher UHII, and vice-versa. On the other hand, the two may also change in opposite directions if the expansion of a city is more associated with the heavy industry withof strong emissions. In such a case, industrial the expansion can produce both more aerosol particles, especially secondary aerosols converted from precursor gases, and stronger UHI,

- but they have no causal relation. This is likely a reason for the diverse relationships between the trends of the two variables. <u>TheOf course, the</u> complication originates from highly different pathways of city expansions among these cities. The overall positive relationships revealed in Figure <u>3 attest</u> 2 may thus serve as a testimony to the dominance of their causal relationship, implying that aerosol loading influences does influence the UHII to a varying degrees. Also analyzed was the relationship between RH and UHII, but it is less
- significant than the correlation between UHII and visibility (p-value of visibility > RH). Note that not only these two factors affect UHII. Many other factors affect UHII, but this study mainly focuses on the aerosol effectdegree.





Figure 32. (a) <u>Clear-day visibility</u> Visibility trend (unit: km yr⁻¹) shown as a function of the UHII trend (K yr⁻¹), and (b) <u>clear-day</u> visibility (unit: km) <u>and relative humidity</u> shown as a function of UHII (unit: K). The <u>period is 2001-2015</u>. The black and green lines <u>blue line</u> is the linear best-fit line through the points. <u>Sample numbers of (a) and (b) are 68 and 510 respectively</u>. The least-squares regression equation is given in each panel. The coefficient correlation (R) and p-value are also given, and all of them pass <u>confidence test in 95%</u>.-

ToIn order to better investigate the effect of aerosols on the UHII, we calculated the UHII under severe air pollution conditions (i.e., visibility less than 8 km) and compared it with the average UHII. On an annual basis (Fig. S4), the UHII under severe air pollution conditions is lower than the average UHII, suggesting that a high aerosol loading will reduce the UHII. In summer (Fig. 4a), the UHI at 29 of the 35 cities is weaker under polluted conditions. In winter (Fig. 4b), however, the majority of cities (27 out of 35) have a stronger UHI under polluted conditions, suggesting that aerosols enhance the UHII in winter.÷



where *MUHII* is the difference between the UHII under severe air pollution conditions and the average UHII, *n* is number of years from 2001 to 2015, *i* represents a specific year during 2001–2015, $UHII_{m-t}$ is the average UHII in year *i*, and $UHII_{p-t}$ is the UHII under severe air pollution conditions in a year *i*. Figure S3 shows the *MUH11* at each city under polluted conditions and for all days. On an annual scale, the UHII under severe air pollution conditions is lower than the average UHII, which suggests that a high

aerosol loading will reduce the UHII. In summer (Figure 3a), the UHI at 29 of the 35 cities is weaker under polluted conditions. In winter (Figure 3b), however, it is just opposite, with the majority (27 out of 35) cities having stronger UHI under polluted conditions, suggesting that aerosols enhance the UHII in winter.



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Figure 3. The mean UHII (unit: K) at the 35 cities in (a) summer and (b) winter. Red and blue bars represent UHII calculated using data from all days and from polluted days only, respectively. The overall mean UHII calculated using data from <u>allaS411</u> days and from polluted days only are shown as red and blue solid lines, respectively.

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4. Causes for the opposite impacts of aerosolsaerosol on the UHI in summer and winter

4.1 Mechanisms of the aerosol impact on the UHI

Aerosols alter <u>the</u> radiation budget by scattering and absorbing solar radiation (Chylek and Coakley, 1974; Chylek and Wong, 1995; Li, 1998). The aerosol radiative effect tends to cool down <u>the</u> surface, warm up the atmosphere, stabilize the PBL, <u>and</u> suppress the dispersion of pollutants in the PBL, <u>incurring to incur</u> a positive feedback (Li et al., 2017a, 2017). As illustrated in Fig. 5Figure 4, the UHII may be influenced by both the Spattial Discrepancy of Aerosol Radiative Effect (SD-ARE) and the suppressed vertical exchange of surface heat fluxes, which may be denoted as the <u>Aerosol</u> Dynamic Effect (<u>ADE</u>)
becauseDE) for it is related to turbulent dynamics.





Figure <u>54</u>. Diagram of the mechanisms behind aerosol effects on the UHII. The blue frame contains the processes and interactions between aerosols and the PBL. Red frames contain the processes of the <u>Spatial</u>
 Discrepancy of Aerosol Radiative Effect (<u>SD</u>-ARE) and the <u>Aerosol</u> Dynamic Effect (<u>ADE</u>). <u>SolidDE</u>), respectively. The solid arrows denote the direct <u>effects</u>effect, while the dashed arrow indicates the indirect effect.

The <u>ARE</u>: The increasing difference<u>Spatial Discrepancy</u> of <u>aerosolsAerosol Radiative Effect (SD</u>
 different ARE between the urban and rural areas will reduce more): The varying amount of solar radiation to <u>urban</u>reaching the ground thanbetween urban and rural ground, whichareas influences the rise of the LST <u>because</u>and thus changes UHII, as a result of different aerosol loading and properties between urban and rural areas. The above process reduces the temperature difference between urban and rural areas, and thus reduces UHII, This process <u>usually</u> has a negative effect on <u>UHII</u>, and it belongs to aerosol directly

350 <u>radiative effect</u>UHIIIy.

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The <u>ADE:Dynamic Effect (DE)</u>: On the other hand, <u>an</u> aerosol-induced temperature inversion (especially in winter) within the PBL (<u>R.</u> Zhang et al., 2014; J., Li et al., 2015; Z., Li et al., 2017a, 2017) renders <u>a</u> very stable PBL <u>that inhibits</u> <u>inhibit</u> vertical and horizontal airflows and surface heat fluxes (latent/sensible heat) between urban areas and rural areas (Petäjä et al., 2016). <u>In addition to a</u> temperature-inversion-induced stable PBL, air pollution is usually accompanied by low wind speeds

(particularly $< 2m s^{-1}$), also favorable to both heat accumulation and storage. Urban surfaces can store more heat, which affects the UHII. This process <u>usually</u> has a positive effect on UHII, and it affects heat exchange mainly through turbulence mixing.

Compared with rural areas, urban impervious surfaces have <u>a</u> low thermal capacity<u>, so</u> and their temperatures are thus more sensitive to heat changes. Note that the <u>AREDE</u> and <u>ADESNA-RE</u> are not independent and that there is an indirect effect between them due to potential urban-rural <u>circulationscirculation</u>.

4.2 Analyses of influential Influential factors

365 4.2.1 Analyses for ARE

Urban-rural differences in air quality: <u>Urban The urban</u>-rural differences in air quality were analyzed by calculating the spatial differences in $PM_{2.5}$ of $PM_{2.5}$ and AOD under cloudless conditions between urban and rural areas. Their spatial differences are then analyzed between summer and winter were also analyzed.÷

- 370 <u>Measurements</u> The measurements of urban $\underline{PM_{2.5}} \underline{PM_{2.5}}$ concentrations were divided into four categories: 0–50, 50–100, 100–150, and > 150 µg m⁻³ <u>based</u>³ based on urban pollution <u>levels</u>. Figure <u>65</u> shows the mean urban-rural differences in each $\underline{PM_{2.5}}$ concentration bin of all cities. On average, the spatial difference in summer is larger than in winter across all $\underline{PM_{2.5}}$ <u>concentration bins</u>. Five zones were selected based on the distance to the urban geometric center of all cities: Zone 1: 0–10 km, Zone 2: 11–20 km,
- Zone 3: 21–30 km, Zone 4: 31–40 km, and Zone 5: 41–50 km, then the average AOD for each zone was calculated. Figure 7eoncentration bins. Figure 6 shows the variation trends of mean AOD as a function of distance from the urban geometrical center of each city in winter and summer. As the distance from the urban geometrical center increases, summertime AODs decrease more rapidly than wintertime AODs. Both-Figures 65 and 76 indicate that the spatial difference inof air pollution between urban and rural areas in summer is larger than that in winter. Moreover, in summer, urban pollution is often more serious than rural pollution. -In winter, pollution in both urban and, in particular, rural areaspollution is severe. Many factors (e.g., PM_{2.5} emissions, transportationserious, and diffusion) may cause the seasonal difference inrural may be more serious than urban-rural differences (Jiang et al., 2019).-



Figure <u>65</u>. Summertime (red <u>curve</u>curves) and wintertime (black <u>curve</u>curves) urban-rural PM_{2.5} <u>concentration mean differences</u> (unit: $\mu g m^{-3}$)-<u>differences</u> of all cities across four PM_{2.5} concentration bins: 0–50, 50–100, 100–150, and > 150 $\mu g m^{-3}$.



Figure 76. Mean AOD as a function of distance from the urban geometrical center of all cities in winter
 (red <u>curve</u>curves with open circles) and summer (black <u>curve</u>curves with <u>open circles</u>crosses). The distance ranges are < 10 km, 11–20 km, 21–31 km, 31–40 km, and 41–50 km from the urban geometrical center. <u>Error bars are shown.</u>

<u>UHII response to variation of visibility:</u> Figure S5 shows the relationship between UHII and visibility
 difference. For most cities, higher visibility difference causes smaller UHII in summer, while UHII barely
 <u>changes as visibility difference change in winter.</u> This result indicates that UHII is more sensitive for
 <u>visibility difference in summer than winter, namely, the ARE has an obvious effect in summer, but it is</u>
 very weak in winter.

The results of section 4.2.1 indicate that ARE is more significant in summer than in winter.

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4.2.2 Analyses for ADE

Air stability <u>withininside</u> the PBL: Wind affects the heat exchange between urban and rural areas. <u>Regardless, regardless</u> of wind direction, high wind <u>speeds favor thespeed favors</u> urban-rural heat exchange and <u>reducereduces</u> the UHII, while low wind <u>speedsspeed</u> decrease <u>the</u> urban-rural heat exchange and enhance UHII. <u>MeanThe means of</u> wind <u>speeds werespeed are</u> computed in urban and rural areas in summer and winter, under polluted and clean conditions (Figure <u>8 based on Figure S6).7</u>). As-is expected, the mean wind speed under polluted conditions is lower than that under clean conditions, especially in winter when the difference is 1.1 ms⁻¹ <u>versusv.s.</u> 0.6 ms⁻¹ in summer. This <u>suggestsresult</u> indicates that the urban-rural exchange in summer is stronger than that in winter.



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Figure <u>87</u>. Comparison of average wind <u>speeds</u> (unit: m s⁻¹) of 35 cities between urban and rural areas under heavy air pollution (white bars) and clean conditions (<u>hatcheddark</u> bars) in summer and winter, respectively.

Vertical temperature gradients affect the stability of the atmosphere, surface heat fluxes (especially sensible heat),) and vertical turbulence. Figure 98 shows the vertical temperature profiles at five cities in different seasons under polluted and clean conditions. Note that there are much fewer sounding stations than general surface meteorological stations in China. The vertical temperature gradient is weaker under polluted conditions than under clean conditions, so the vertical mixing is weaker. This phenomenon is also more pronounced in winter than in summer. For Nanjing, both aerosols and meteorological conditions may affect the temperature gradient in winter because the large difference of surface temperature between clean and polluted conditions. The temperature gradient within the planetary boundary layer (PBL) under polluted conditions generally decreases more sharplydrastically than under clean conditions in winter (Figure 109). These results suggest that compared with clean conditions, vertical airflow and surface heat release under polluted conditions are lessened more significantly in winter than in summer.





Figure <u>98</u>. Mean vertical temperature profiles (vertical curves, unit: ℃) at five cities in different seasons and under polluted (black) and clean (green) conditions. <u>MeanThe mean</u> PBL heights (PBLH) under polluted and clean conditions are also shown (black and green horizontal lines, respectively). Panels (a), (c), (e), (g), and (i) show summertime results, and panels (d), (f), (h) and (j) show wintertime results.
Panels (k) and (l) show temperature reductions below 1.5 km [unit: K-€ (100 m)⁻¹] under polluted (hatcheddark bars) and clean (white bars) conditions in summer and winter, respectively.



Figure <u>10. Average</u>9. The average temperature reductions <u>below 1.5 km [unit: K (100 m)⁻¹] fromof</u> sounding observations <u>atof</u> five cities <u>below 1.5 km [unit: K (100 m)⁻¹]</u>-under polluted (<u>hatcheddark</u> bars) and clean (white bars) conditions in summer and winter. The red arrows mean the change ranges from clean conditions to polluted conditions, the blue arrow mean the change range from summer-polluted condition to winter-polluted condition, respectively.

Seasonal differences in air stability in the urban and rural areas may be summarized as follows. Under 445 polluted conditions, both horizontal and vertical exchanges decrease inside the PBL, thus weakeningweakens the heat exchange and pollution dispersion. However, this effect is much stronger in winter than in summer. In winter, the airflow significantly weakens with the increasing pollution, stabilizing the PBL becomes very stable, and significantly decreasing heat exchanges withinsignificantly decrease inside the PBL.

- 450 UHII response to variation of visibility: Figure S5 shows the relationship between UHII and visibility difference. For most cities, higher visibility difference causes smaller UHII in summer, while UHII barely changes as visibility difference change in winter. This result indicates that UHII is more sensitive for visibility difference in summer than winter, namely, the SD ARE has an obvious effect in summer, but it is very weak in winter.
- 455 The results of section 4.2.2 indicate that ADE is more significant in winter than in summer.

<u>In summary, the above analyses suggestindicate</u> that the two mechanisms behave differently roles in summer and winter. In summer, the <u>SD</u>-ARE plays a more important role than the <u>ADEDE</u> to change the UHII, while the importance of <u>the</u> two mechanisms is opposite in winter.

460 **4.3 Testing the mechanisms throughby modeling**

We evaluate the simulated aerosol and meteorological properties with surface PM_{2.5} observationsobservation and sounding data (Figs.Figure S6, S7, S8, and 1140). Figure S7S6 shows that the simulated *PM*_{2.5}-near-surface <u>PM_{2.5}get high</u> concentrations <u>are highest inat the</u> regions south <u>and east</u> of Beijing and east to Beijing, in general agreement with <u>observations.the observation</u>. The temporal variations of simulated <u>and observed PM_{2.5} concentrations have consistent trends <u>at as observation for</u> most stations (Fig. S8Figure S7). The vertical profiles of temperature, RH₂ and wind <u>speedspeeds</u> also agree with <u>sounding observations (Fig. 11). In general the sound in observation.</u> Therefore, the simulation results appearare sound in general.</u>



Figure <u>11. Vertical profiles</u>^{10.} The vertical profile comparisons of temperature (unit: °C), RH (unit: %), U-wind speed (<u>U</u>; unit: m₄/s⁻¹), V-wind speed (<u>V</u>; unit: m₄/s⁻¹) and wind speed (<u>WS</u>; unit: m₄/s⁻¹) at (a) <u>1200 UTC 8 July 2015</u><sup>20150708-12:00 BJT in summer and (b) <u>1200 UTC 7 January 2015. Red</u><sup>20150107-12:00 BJT in winter. The red lines are simulation results, <u>and the black lines are observations</u> observation data.
</sup></sup>

Figure 1244 depicts the averaged diurnal variations of UHII differences (Δ UHII) between UHII with aerosol radiation effect (ARE) and UHII without ARE, with negative values meaning the reduction of UHII by aerosols reduce UHII and positive values showing the opposite. In summer (Figure 1211 a), aerosols reduce UHII throughout all day; but in winter (Figure 1211 b), aerosols enhance UHII in the afternoon. This shows These results are consistent with the effect of aerosols on UHII on a daily scale, 480 supporting Fig. 4-observational results shown in Figure 3. The averaged diurnal variation of downward shortwave radiation at the surface (SWDOWN) between urban and rural areas shows that the SWDOWN difference between urban and rural areas in summer is larger than that in winter (Figure S9S8). The results in Figure S7S6 and S9S8 indicate that the spatial difference of air pollution in summer is larger than that in winter, and the wintertime pollution is more serious than summertime pollution, which is consistent 485 with observational results shown in Figures 5-6-7. Figure 1389 shows that the model simulated temperature reductions below 1.5 km, suggesting the ARE is more significant on the temperature lapse rate in winter than that in summer in both urban and rural areas. Moreover, the temperature lapse rate in summer is far largermore than that in winter. They are also consistent with the observational results shown 490 in Figure 109.





Figure <u>12. Average</u><u>11. The average</u> diurnal <u>variations in variation of</u>-UHII differences (ΔUHII; UHII unit: <u>K)</u>^oC) between UHII with <u>and without including</u> ARE and UHII without ARE for typical days in (a) summer (averaged over 6–10 July 2015) and (b) winter (averaged over 7–10 January 2015).-



Figure 13. Temperature reductions from model simulations below 1.5 km [unit: K $(100 \text{ m})^{-1}$] without ARE (white bars) and with ARE (hatched bars) for typical days in summer (green) and winter (black) in (a) urban areas and (b) rural areas.

5. Conclusion and discussion discussions

The urban heat island intensity (UHII) is investigated using long-term satellite. Satellite, ground-based, and sounding data and WRF Chem mods were used to analyze the UHII-under different environmental conditions from severely polluted to and clean conditions at 35 cities in China_aiming at understanding the impact of aerosols on the UHII. The impact is found to be opposite. Seasonal differences in UHII between summer and winter. were also compared. On an annual basis, aerosols reduce the UHII, which is-consistent with previous studies work (Wu et al., 2017). Aerosols lessens In summer, aerosols reduce the UHII in summer, but strengthens it in winter. The opposite effects are explained by two distinct roles

- 510 of in winter, aerosols, namely, enhance the UHII. Furthermore, we used the concepts of the Spatial Discrepancy in Aerosol Radiative Effect (SD-ARE) and Aerosolthe Dynamic Effect (ADE) based on our analyses DE) to explain how aerosols influence the UHII in different seasons. We then verified The mechanisms by means of extensive observational data from satellite analyses and ground, which is further reinforced by model simulations. The ARE refers to the reduction of surface solar radiation by aerosol
- 515 which lowers surface temperature, whereas the ADE is concerned with the dispersion of heat associated with any change in

In summer, airflow due to aerosol-induced changes in atmospheric stability.

In summer, aerosols do not have much impact on airflowslightly within the PBL in urban area.under polluted conditions. There is still a strong heat release and heat exchange between urban and rural areas

- 520 <u>in both polluted and clean conditions. As such, the ADE is weak in summer, but the ARE is strong because</u> <u>aerosol loadings is much higher in</u>, so the dynamic effect is weak. The spatial discrepancy in aerosol radiative effect differs between urban and rural areas because of the inhomogeneous spatial distribution of air pollution between these two areas. Since urban pollution is often more severe than rural pollution, less solar radiation reaches urban areas than in rural areas. The <u>reductions of surface solar radiation</u>
- 525 <u>andurban</u> temperature <u>are a lot moreenhancement is thus weaker under polluted conditions</u> than <u>those in</u> <u>rural areas</u>, <u>which helps lessenclean ones</u>, <u>weakening</u> the UHII. Figure <u>14a12a</u> shows a diagram of how aerosols influence the UHII in summer.

In winter, the spatial discrepancy in aerosol <u>effects on PBL stability is dominant over the ARE</u>radiative effect because is weak but the dynamic effect is significant under polluted conditions in winter.

- 530 Concerning the spatial discrepancy in aerosol radiative effect, the spatial difference <u>inof</u> air pollution between urban and rural areas is small (i.e., the differences of ARE between urban and rural areas are <u>similar from clean to polluted condition</u>). This means that, and urban and rural areas likely experience the same severe pollution, <u>heating</u>this heats the atmosphere and <u>reducing</u>reduces the <u>similar amount of</u> solar radiation reaching the <u>surfaces of the urban and rural areas by a similar amount</u>. Whereas through ADE,
- 535 <u>the PBL is more stabilized in polluted conditions</u>urban and rural ground. Concerning the dynamic effect, airflow intensity and temperature gradients significantly decrease, <u>weakening the heat</u> exchangestabilizing the PBL and weakening the heat release and heat exchange. Since pollution

conditions in both urban and rural areas are similar, the spatial discrepancy in aerosol radiative effect is not a major factor causing higher UHIIs. the dynamic effect weakens airflow, reducing temperature

540 gradients significantly, which in turn, reduces the heat exchange between urban and rural areas and the surface heat release. Increasing heat thus accumulates in urban areas, thereby increasing the UHII. Figure 12b shows a diagram of how aerosols influence the UHII in winter.

Our analysis shows the seasonally different effects of aerosols on the UHII and explains the different mechanisms in different seasons, and the mechanism summary is shown in both vertical and horizontal

545 <u>directions. Heat is thus accumulated in urban areas, enhancing the UHII. Figure 14b illustrates how</u> <u>aerosols influence the UHII in winter.</u>

tables at the bottom of Figures 12a and 12b. Although this study comprehensively <u>investigates some</u> explains potential aerosol effects, <u>there may exist</u> other effects <u>may be at play</u> such as <u>differences inland</u> surface and aerosol properties (e.g., absorbing versus scattering aerosols) between urban and rural areas.

550 <u>This</u>). More work needs <u>further examination but infeasible at present due to a lack of to be done to verify this. Additionally, this study analyzed observations between urban and rural regions. While themade at 35 cities located in China and some results of a few cities that were at odds with generalized findings reported here are generally true in the majority of the 35 cities, they are not exclusively true at all; the different results in some cities may be due to their the unique characteristics of these cities regarding their</u>

555 location, terrain, climatic background, <u>among other factors. etc. This warrants further investigations.</u>



Figure 14. The impact of the ARE and the ADE on UHII in summer (a) and winter (b) by altering radiation (yellow arrows) and heat exchange (brown arrows) on thermal contrast between urban and rural



Figure 12 Aerosol effects on the UHII in (a) summer and (b) winter under polluted conditions. The background brightness indicates pollution intensity. Yellow arrows show the solar radiation, and their

width indicates the amount of solar radiation to the ground. Green arrows denote heat, and their width
 indicates heat intensity. Black points and arrows show the process of aerosol-radiation-interaction.
 Temperature profiles reflect the vertical temperature gradient under clean and polluted conditions. The plus sign means positive effect, while the minus sign means a negative effect.

Data availability

- 570 The—Landsat data. MODIS LST. and MAIAC AOD can be download from https://search.earthdata.nasa.gov/. Hourly PM_{2.5} data is published in real time by the China National Environmental Monitoring Center ((CNEMC, http://www.cnemc.cn/). Meteorological fields are available from the). National Centers for Environmental Prediction/National Weather Service/NOAA/U.S. Department of Commerce (2000): NCEP FNL Operational Model Global Tropospheric Analyses, 575 continuing from July 1999,- Research Data Archive at the National Center for Atmospheric Research,
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Author contributions

580 All authors made substantial contributions to this work. WCHHWC and ZQLLZQ designed this research. WCHHWC conducted the analyses and wrote the draft under the supervision of ZQL. ZQLLZQ. LZQ reviewed and edited this paper. WF and YWZZYW conducted the WRF-Chem <u>simulationssimulation</u> and helped to edit this paper. JPGGJP and TNSSTN provided <u>somepart of</u> datasets and helped to edit this paper. MC reviewed and edited this paper. JWF gave many suggestions about this study. TMCCTM and JWWJ provided <u>somepart of</u> datasets. <u>SSLLSS</u> gave many suggestions about model simulations.

Competing interests

The authors declare that they have no conflict of interest.

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