# Traces of urban forest in temperature and CO2 signals in

# 2 monsoon East Asia

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**Abstract.** Cities represent a key space for our sustainable trajectory society in a changing environment, and our society is steadily embracing urban green space for its role in mitigating heatwaves and anthropogenic CO2 emissions. This study reports two-year years of surface fluxes of energy and CO<sub>2</sub> measured via the eddy covariance method in an artificially constructed urban forest measured by the eddy covariance method to examine the impact of urban forests on air temperature and net CO<sub>2</sub> exchange. The urban forest site shows typical seasonal patterns of forest canopies with the seasonal march of the East Asian summer monsoon. Our analysis indicates This study shows that the urban forest reduces both the warming trend and urban heat island intensity compared to the adjacent high-rise urban areas and that photosynthetic carbon uptake is large despite relatively small tree density and leaf area index. During the significant drought period in the second year, gross primary production and evapotranspiration decreased, but their reduction was not as significant as those in natural forest canopies. We speculate that forest management practices, such as artificial irrigation and fertilization, enhance vegetation activity. We also stipulate Further analysis reveals that ecosystem respiration in urban forests is more pronounced than for typical natural forests in a similar climate zone. This can be attributed to the substantial amount of soil organic carbon available due to intensive historical soil use and soil transplantation during forest construction, as well as relatively warmer temperatures in urban heat domes. Our observational study also indicates findings suggest the need for caution in soil management for less when aiming to reduce CO<sub>2</sub> emissions in urban areas.

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#### 1 Introduction

Cities inhabitmake up only 2% of the Earth's land surface but hold more than 55% of the world's population. It is expected that the urban population will reach 68% by 2050 (UN, 2019). With the unprecedented rapid urbanization in the last century, our life trajectoryhuman civilization heavily depends on urban structures and functions, and it is expected that the urban population will increase by up to 68% by 2050 (UN, 2019). Our current. Current concern is regarding the disastrous impacts of climatic events (e.g., heatwaves, flooding, and drought) and environmental changes (e.g., air pollution and land degradation) on our socioeconomic system in a changing climate (McCarthy et al., 2010; Rahmstorf and Coumou, 2011). Accordingly, it remains an urgent issue to implement integrated policies for climate change mitigation and adaption toward sustainable cities against global warming and related natural disasters. In particular, urban

<u>Urban</u> green infrastructures, such as urban <u>forestforests</u>, have been recognized as a key solution toward alleviating climatic and environmental disasters (e.g., <u>Oke et al., 2017</u>; Chiesura, 2004; Haaland and van den Bosch, 2015; <u>Oke et al., 2017</u>; Kroeger et al., 2019). Green spaces in cities, <u>as opposed to gray spaces</u>, are exposed to wide ranges of environmental and climatic conditions across geographical locations. Especially when green spaces replace gray infrastructures during <u>the-urban</u> redevelopment, it remains unclear whether their benefits emerge in real conditions and thereby <u>outperformingovercome</u> their maintenance cost and other harmful effects- <u>(e.g., allergy and ozone increase)</u>. To leverage their full potential benefits, it is necessary to assess the biophysical effects of urban forests based on direct long-term monitoring in urban areas.

Urban forests are a key part of green infrastructures in a city, and two of their benefits, which have been mainly addressed in previous studies, are thermal mitigation and carbon uptake (Roy et al., 2012; Oke et al., 2017). Firstly, urban forests mitigate direct sunlight and diminish the incoming radiant energy on the land surface, thereby reducing surface temperature. Additionally, urban forests supply water to the atmosphere through transpiration and retain water for longer times than the impervious surfaces of urban structures. These processes contribute toward to reducing air temperature by partitioning more available energy to latent heat flux  $(O_E)$  than sensible heat flux  $(Q_H)$ , thus creating favorable conditions for mitigating heatwaves and related health problems (e.g., Oke, 1982; Hong et al., 2019a). Eventually, this cooling effect reduces the electrical energy load of buildings, by air conditioning as well as greenhouse gas emissions. Previous studies have reported cooling effects of urban forests from street trees to parks scales (Oke et al., 1989; Bowler et al., 2010; Norton et al., 2015; Shashua-Bar and Hoffman, 2000). Such cooling effects depend not only on tree species and structures (Feyisa et al., 2014) but also on the size and vegetation density of urban green areas (Yu and Hien, 2006; Chang et al., 2007; Hamada and Ohta, 2010; Feyisa et al., 2014). However, despite the strong temperature-controlling factors of evapotranspiration (ET) and directsensible heat fluxes over urban forest canopies, only a few studies have reported on surface energy balance (SEB) in urban forests in relation to thermal mitigation based on direct measurements (e.g., Oke et al., 1989; Spronken-Smith et al., 2000; Coutts et al., 2007a; Ballinas and Barradas, 2015; Hong and Hong, 2016;). Moreover, it is noticeable that forest cooling intensity depends on geography and even forests can even produce a warming trend with the decreased as a result of their low albedo (Bonan, 2008; Wang et al., 2018). The lack of direct urban forest measurements hinders proper assessment of their influences on the climate and environment.

Furthermore, urban forests mitigate anthropogenic carbon emissions by photosynthetic CO<sub>2</sub> uptake. Traditionally, carbon uptake by urban forests has been estimated by empirical relationships (e.g., biomass allometric equation) or short-term inventory of biomass data and vegetation growth rates, which have limitations of spatiotemporal coverage (Rowntree and Nowak, 1991; Nowak, 1993; Nowak et al., 2008; Weissert et al., 2014). Currently, the eddy covariance (EC) method is being applied in various ecosystems from grasslands and natural forests to urban areas because it provides continuous net CO<sub>2</sub> flux measurements at the neighborhood scale every half hour (Christen 2014). From this perspective, the EC method is useful for studying the net CO<sub>2</sub> exchange (Fc) from diurnal to interannual variations, with its simultaneous measurement of surface energy fluxes. Recently, direct Fc measurements have been performed using the EC method in urban green spaces to examine SEBturbulent exchanges of energy and carbon exchange (Coutts et al., 2007a, 2007b; Awal et al., 2010; Kordowski and Kuttler,

- 71 2010; Bergeron and Strachan, 2011; Crawford et al., 2011; Kordowski and Kuttler, 2010; Peters and McFadden,
- 72 2012; Velasco et al., 2013; Ward et al., 2013; Ueyama and Ando, 2016; Hong et al., 2019b; Hong et al., 2020).
- 73 However, the EC method provides only the net effects of CO<sub>2</sub> exchange from various carbon sources and sinks,
- vhich limits the physical interpretation and assessment of the benefits and costs of urban forests.
- 75 Flux partitioning into photosynthesis and ecosystem respiration from the EC measured Fc requires additional
- 76 information and data processing (It is Stoy et al., 2006). It is more challenging to partition  $F_C$  into individual
- sources and sinks<del>, particularly</del> in urban areas because of the complex contributions from biogenic (e.g., vegetation
- 78 photosynthesis, respiration of vegetation, soil, and humans) and extra anthropogenic (e.g., fossil fuel combustion
- 79 by transportation or in households and commercial buildings) processes (Pataki et al., 2003). Stochastic Fe
- 80 partitioning methods were recently applied by reprocessing EC observation data with auxiliary data and provided
- 81 useful knowledge on urban
- 82 earbon cycle (Hiller et al., 2011; Crawford and Christen, 2015; Menzer and McFadden, 2017; Stagakis et al.,
- 83 <del>2019).</del>
- 84 With this background, the objectives of this study include: 1) reporting temporal changes in air temperature after
- 85 the artificial construction of an urban forest park in the Seoul metropolitan area wherewith a hot and humid
- 86 summer season affects and shows steep global warming trends (Hongcold and Hong, 2016) dry winter seasons and
- 87 2) quantifying the carbon uptake of urban forests based on the  $F_C$  partitioning through theof  $F_C$  data
- 88 observedmeasured by the ECeddy covariance method and meteorological data (Lee et al., 2021). Here, we
- 89 highlight the biotic and abiotic factors controlling the carbon cycle in urban forests and the impact of urban forests
- on the thermal environment after forest park construction.
- 91 2 Materials and Methods
- 92 2.1 Urban surface energy and CO<sub>2</sub> balances
- 93 The SEB is expressed as:

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$$Q^* + Q_F = Q_H + Q_E + \Delta Q_S + \Delta Q_A$$
 (1)

- 95 where  $Q^*$  is the net all-wave radiation of the sum of outgoing and incoming short- and long-wave radiative fluxes,
- 96  $Q_F$  is the anthropogenic heat flux,  $Q_H$  is the turbulent sensible heat flux,  $Q_E$  is the latent heat flux,  $\Delta Q_S$  is the net
- storage heat flux, and  $\Delta Q_A$  is the net heat advection (Definitions of variables in Appendix A).
- 98 The surface CO<sub>2</sub> budget in an urban forest is formulated as follows:
- 99  $F_C = E_R + E_B + RE GPP \equiv E_R + E_B + NBE$  (2)
- where  $F_C$  is the net CO<sub>2</sub> exchange at the city-atmosphere interface,  $E_R$  and  $E_B$  are the anthropogenic CO<sub>2</sub> emissions
- 101 from fossil fuel combustion by vehicles and heating in a building, respectively. GPP and RE are biotic
- 102 contributions to  $F_C$ ; GPP is the gross primary production as a result of by photosynthetic  $CO_2$  uptake, and RE is

the ecosystem respiration from soil and vegetation. Urban ecosystem respiration considers not only the autotrophic and heterotrophic respirations of vegetation and soil but also human respiration (Moriwaki and Kanda, 2004; Velasco and Roth, 2010; Ward et al., 2013, 2015; Hong et al., 2020). Human respiration is negligible in this study because there is no residential population in the park. Vegetation in urban areas includes trees and lawns in urban forests, as well as gardens and roadsides, and it offsets CO<sub>2</sub> emissions through CO<sub>2</sub> assimilation by photosynthesis as the only carbon sink. Human respiration by park visitor is negligible with 0.4 µmol m<sup>2</sup> s<sup>-1</sup> at most.

Additionally, NBE is the net biome  $CO_2$  exchange and is typically defined as the net ecosystem exchange by RE – GPP for natural vegetation. Put differently, NBE refers to carbon losses in heterotrophic respiration minus the net primary production on natural vegetative surfaces; thus, negative NBE indicates the net carbon uptake by the natural ecosystem (Kirschbaum et al., 2001; Randerson et al., 2002). Unlike natural ecosystems, the  $F_C$  between an urban forest and atmosphere is a complex mixture of biogenic (i.e., GPP and RE) and anthropogenic (i.e.,  $E_R$  and  $E_B$ ) processes across various spatial and temporal scales. In urban environments, anthropogenic emissions depend on the local characteristics (e.g., transport options, fuel types, heating demand, climate, population density, levels of industrial activity, and existing carbon intensity of electricity supply) of the city and locations of the eddy covariance system (Feigenwinter et al., 2012; Kennedy et al., 2014; Lietzke et al., 2015; Stagakis et al., 2019).

### 2.2 Site description

# 2.2.1 Seoul Forest Park

Micrometeorological measurements were taken at the Seoul Forest Park (SFP) in the Seoul metropolitan area, Korea (37.5446°N, 127.0379°E). SFP is the third largest park in Seoul with an area of 1.16 km² (Fig.-1a). This area had been used as a horse racetrack and a golf course inside the track since 1950 and was surrounded by cement factories to the west (Fig.-1b). The local government initially planned this area as a commercial district with a high-rise multi-purpose building complex but changed its plan to redevelop the area as a green space in late 1990s. The construction of the SFP began in December 2003, and it was opened to the public in June 2005 (Fig.-1c).

The dominant land cover within a 300 m radius of the measurement system is a deciduous forest with irrigated grass lawns (*Zoysia*), oak (*Quercus acutissima*), ginkgo (*Ginkgo biloba*), and ash trees (*Fraxinus rhynchophylla*), which correspond to the Local Climate Zone (LCZ) 'A', dense trees (Stewart and Oke, 2012). The maximum leaf area index (LAI) of 300 × 300 m<sup>2</sup> around the SFP tower is approximately 1.6 (Copernicus Service information, 2020). On the east side (0–120°), there are trees (approximately 230 stems ha<sup>-1</sup>) with a small artificial lake and grasslands beyond it. Trees mainly occupy the southern and western directions of a tower (120–330°) within a 100 m radius area (approximately 540 stems ha<sup>-1</sup>) and traffic roads lie outside of the dense vegetation. The mean tree height (*h*<sub>e</sub>) is approximately 7.5 m and ranges between 5.8–9.5 m. The mean roughness length (*z*<sub>0</sub>) and zero-plane displacement height (*z*<sub>0</sub>) are estimated by the tree height-based approach within 100 m radius and they range between 0.3–0.6 and 4.1–8.2 m, respectively (Raupach et al., 1991). z<sub>0</sub> and z<sub>0</sub> have seasonal and directional

variations depending on the variability of the leaves on the vegetation (Lee, 2015; Kent et al., 2018). z<sub>0</sub>-and z<sub>d</sub>
change from approximately 0.6 and 5.0 m during leaf-on period (June-August) to 1.2 and 3.0 m during the leafoff periods (December-February) by the Macdonald method (Macdonald et al., 1998). Approximately 80% of the

142 footprint area of the SFP tower is within 250 m (Fig. 1e).

The traffic roads consist of eight and ten lanes carrying heavy traffic throughout the day (~100,000 vehicles day to the south and west of the tower (Fig. 1e). Hourly traffic volume, which is used for surface flux partitioning, is evaluated on the road adjacent to the SFP tower every year by the Scoul Metropolitan Government (https://topis.scoul.go.kr). Across the road on the western side of the tower, a cement factory still exists, although

its size is smaller than it used to be in the past (Fig. 1b and 1e).

### **2.2.2** Climate conditions

Climatic condition shows a distinct seasonal variation with the seasonal march of the East Asian summer monsoon- (Fig. 1). The mean climatological values (1981-2010) of the screen-level air temperature ( $T_{air}$ ) and precipitation were 12.5°C and 1450 mm year<sup>-1</sup>, respectively. During the study period (June 2013–May 2015), the observed  $T_{air}$  was higher than the climatological mean. Higher temperatures lasted longer in the summer of 2013 with the stagnation of the migratory anticyclones (June) and North Pacific anticyclone (July–August). There were strong heatwaves in the spring seasons of 2014 and 2015 (Hong et al., 2019a). Wind direction also shows seasonal variation with the monsoon system. Main wind comes from vegetative surface in the park, but other land cover types are included differently with seasons. Prevailing wind is southwesterly in spring and summer and changes to northeasterly in autumn and northwesterly in winter (Fig. 2). Accordingly, road fraction in flux footprint is larger in spring and summer and building emission is included only winter season with northeasterly wind (Fig. 3f and 2).

Notably, seasonal precipitation shows a contrasting pattern between two consecutive years (Fig. 2d1d). In the first year (June 2013–May 2014), annual precipitation was 1256 mm, which corresponded to approximately 90% of the climatological mean. In addition, approximately 50% of the annual rainfall was concentrated in the summer with an estimated 650 mm occurring only in July 2013; however, in the second year the annual rainfall was 932 mm (i.e., 67% of the climatological mean)-) (i.e., the smallest annual precipitation in the past 20 years). The monthly precipitation values in the July and August of 2014 were 198 and 169 mm, respectively, which represented only approximately 35% of the climate mean. Accordingly, the vapor pressure deficit (VPD) and downward shortwave radiation ( $K_{\downarrow}$ ) in July 2013 were relatively smaller than those in July 2014 (Fig. 2b and 2c).

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Micrometeorological measurements were taken at the Seoul Forest Park (SFP) in the Seoul metropolitan area, Korea (37.5446°N, 127.0379°E). SFP is the third largest park in Seoul with an area of 1.16 km² (Fig. 3a). This area had been used as a horse racetrack and a golf course inside the track since 1950 and was surrounded by cement factories to the west (Fig. 3b). The local government initially planned this area as a commercial district with a high-rise multi-purpose building complex but changed its plan to redevelop the area as a green space in

late 1990s. The construction of the SFP began in December 2003, and it was opened to the public in June 2005 174 175 (Fig. 3c). 176 The mean tree height  $(h_c)$  is approximately 7.5 m and ranges between 5.8–9.5 m. Analysis and estimation of 177 roughness elements and integral turbulence characteristics are reported in Kent et al. (2018) and here we explain the key information. 1-m horizontal resolution digital terrain and digital surface model data are analyzed for 178 179 roughness parameters and tree heights. The mean roughness length (z<sub>0</sub>) and zero-plane displacement height (z<sub>d</sub>) 180 range between 0.3-0.6 and 4.1-8.2 m with wind directions, respectively. z<sub>0</sub> and z<sub>d</sub> have seasonal and directional 181 variations depending on the variability of the leaves on the vegetation (Lee, 2015; Kent et al., 2018). z<sub>0</sub> and z<sub>d</sub> 182 change from approximately 0.6 and 5.0 m during leaf-on period (June-August) to 1.2 and 3.0 m during the leaf-183 off periods (December-February). Approximately 80% of the footprint area of the SFP tower is within 250 m (Fig. 3e) and the dominant land 184 cover within this range is a deciduous forest with irrigated grass lawns (Zoysia), oak (Quercus acutissima), 185 186 ginkgo (Ginkgo biloba), and ash trees (Fraxinus rhynchophylla), which correspond to the Local Climate 187 Zone (LCZ) 'A', dense trees (Stewart and Oke, 2012). The maximum leaf area index (LAI) of 300 × 300 m<sup>2</sup> around the SFP tower is approximately 1.6 (Copernicus Service information, 2020). On the east side (0-188 189 120°), there are trees (approximately 230 stems ha-1) with a small artificial lake and grasslands beyond it. 190 2.2.3 Observations in the Seoul Metropolitan Area 191 In this study, meteorological data from six stations (one eddy covariance station, one aerodrome meteorological 192 observation station, and four automatic weather stations) in the Seoul Metropolitan Area are additionally analyzed 193 to examine the heat mitigation and CO<sub>2</sub> reduction effects of urban vegetation in the SFP (Table 1 and Fig. 1a). The Europeong eddy covariance site (EP, 37.6350°N, 126.9287°E) is for surface flux observations in the 194 northwest of Seoul, where there was a recent urban redevelopment to high rise and high population residential 195 areas from low rise areas (Hong and Hong, 2016; Hong et al., 2019b). Flux observations at the site have been 196 197 conducted since 2012, and they show the SEB and turbulence characteristics of a typical urban residential area. 198 Because the area around the SFP was originally planned to be redeveloped to high-rise high-population residential 199 buildings, EP is selected for comparative analysis as a hypothetical place for the SFP region because they are 200 close to each other and so have the similar synoptic conditions. 201 The Gimpo Airport Observatory (GP, 37.5722°N, 126.7751°E) is located on the western boundary of Scoul, and it is surrounded by grasslands and croplands, which corresponds to LCZ 'D'. As the dominant wind comes from 202 203 the west, the GP site is generally affected by the same synoptic weather conditions as Seoul. The GP station 204 represents the rural environment of the Seoul Metropolitan Area because urban development is restricted around 205 the airport (Hong et al., 2019a). In this study, we select the GP site as a reference point and calculate the urban heat island intensity (UHii) as the synchronous difference in T<sub>nir</sub> between the urban and rural areas accordingly 206 207 (Stewart, 2011). 208 The Seongdong Observatory (SD, 37.5472°N, 127.0389°E), the closest station to the SFP, is located 209 approximately 300 m north of the SFP tower (Fig. 1c). Since the station began observations in August 2000, the 210 meteorological data at SD are useful for analyzing temperature changes before and after the construction of the

211 SFP. Accordingly, it is used to analyze local climatic changes caused by the SFP. Moreover, SD provides auxiliary weather variables (e.g., precipitation) that are not observed in SFP station and reference data for surface flux gap 212 filling. The Gangnam, Seocho, and Songpa observatories (hereafter denoted as AVG) are located in Seoul's 213 214 central business district, which corresponds to LCZ 1 or 2. These sites are also close to the SFP (~ 5 km); thus, 215 temperatures in these regions can be assumed to be exposed to the same synoptic condition. These regions show 216 greater UHIi than other parts of Seoul because of dense skyserapers, according to the analysis of the spatial distribution of UHIi in Seoul (Hong et al., 2013). The average temperature of these three automatic weather 217 218 stations is used to evaluate the temperature and UHIi reduction effects of the SFP construction. All meteorological 219 data from the automatic weather station and acrodrome meteorological observation station are observed every minute, and they are averaged for 1 h for UHIi analysis. All the meteorological data are processed for quality 220 control on the National Climate Data Portal of the Korea Meteorological Administration (http://data.kma.go.kr). 221 222 2.3 Instrumentation and data processing 223 Trees mainly occupy the south and west sectors of a tower (120–330°) within a 100-m radius area (approximately 224 540 stems ha<sup>-1</sup>) and traffic roads lie outside of the park (Fig. 3f). 225 The measurement system was installed on the rooftop of the SFP facility building (Fig. 143d). A three-dimensional 226 sonic anemometer (CSAT3A, Campbell Scientific, USA) and enclosed infrared gas analyzer (EC155, Campbell 227 Scientific, USA) were mounted 12.2 m above the ground level (2.8 m above the roof of an 8.4 m high building) 228 in June 2013 for 2 years (Fig. 143d). The eddy covariance data were recorded using the data logger (CR3000, 229 Campbell Scientific, USA) with a 10-Hz sampling rate and a 30-min averaging time. The gas analyzer was

230 calibrated with standard CO<sub>2</sub> gas every three months. The main footprint covered the forest canopies, and the The 231 measurement height (z<sub>m</sub>) satisfied the tower height requirement over forested or more structurally complex 232 ecosystems in most of wind directions (i.e.,  $z_m \cong z_d + 4(h_c - z_d)$ ) (and turbulent flow is in the skimming flow 233

region (Grimmond and Oke, 1999; Munger et al., 2012; Kent et al., 2018). Two radiometers (NR Lite2 and CMP3,

Kipp&Zonen, Netherlands) were used to measure the radiative fluxes. An auxiliary measurement included a

humidity and temperature probe (HMP155A, Vaisala, Finland), and EVI (Enhanced Vegetation Index) by in situ

236 LED sensors.

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vehicles day-1) to the south and west of the tower (Fig. 3c). Hourly traffic volume, which is used for surface flux

partitioning, is evaluated on the road adjacent to the SFP tower every year by the Seoul Metropolitan Government

(https://topis.seoul.go.kr). Across the road on the western side of the tower, a cement factory still exists, although

its size is smaller than it used to be in the past (Fig. 3b and 3c).

# 2.2.3 Observations in the Seoul Metropolitan Area

Meteorological data from six stations (one eddy covariance station, one aerodrome meteorological observation

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they show the surface energy fluxes and turbulence characteristics of a typical urban residential area. Because the
area around the SFP was originally planned to be redeveloped to high-rise high-population residential buildings,
EP is selected for comparative analysis as an antipodal place for the SFP region because the sites are close to each
other and so have the similar synoptic conditions.

The Gimpo Airport weather station (GP, 37.5722°N, 126.7751°E) is located on the western boundary of Seoul, and it is surrounded by grasslands and croplands, which corresponds to LCZ 'D'. As the dominant wind comes from the west, the GP site is generally affected by the same synoptic weather conditions as Seoul. The GP station represents the rural environment of the Seoul Metropolitan Area because urban development is restricted around the airport. In this study, we select the GP site as a reference point and calculate the urban heat island intensity (UHIi) as the synchronous difference in *Tair* between the urban and rural areas accordingly (Stewart, 2011).

The Seongdong weather station (SD, 37.5472°N, 127.0389°E), the closest station to the SFP, is located approximately 300 m north of the SFP tower (Fig. 3c). Since the station began observations in August 2000, the meteorological data at SD are useful for analyzing temperature changes before and after the construction of the SFP. Accordingly, it is used to analyze local climatic changes caused by the SFP. Moreover, SD provides auxiliary weather variables (e.g., precipitation) that are not observed in SFP station and reference data for the gap filling.

The Gangnam, Seocho, and Songpa weather stations (hereafter denoted as CBD) are located in Seoul's central business district, which corresponds to LCZ 1 or 2. These sites are also close to the SFP (~ 5 km); thus, temperatures in these regions can be assumed to be exposed to the same synoptic condition. The annual mean maximum UHIi of CBD ranges from 3.7 to 5 °C and is similar to that of the SD. These regions show greater UHIi than other parts of Seoul because of dense skyscrapers (Hong et al., 2013; Hong et al., 2019a). The average temperature of these three automatic weather stations is used to evaluate the temperature and UHIi reduction effects of the SFP construction. All meteorological data from the automatic weather station and aerodrome meteorological observation station are observed every minute, and they are averaged for 1 h for UHIi analysis. All the meteorological data are processed for quality control on the National Climate Data Portal of the Korea Meteorological Administration (http://data.kma.go.kr).

#### 2.3 Data processing procedures

<u>Turbulent fluxes are</u> computed using EddyPro (6.2.0 version, LI-COR), with the applications of the double rotation, time lag compensation using covariance maximization, spike removal and quality test (Vickers, and Mahrt, 1997), spectral corrections for low frequency (Moncrieff(Hong et al., 2004) and high frequency (Fratini et al., 2012), as well as vertical sensor separation correction (Horst and Lenschow, 20092020 and references therein). We apply the following post processes for quality control: 1) plausible value check, 2) spike removal, and 3) discarding the negative  $F_C$  flux during the nighttime (i.e., no photosynthesis at night) (Hong et al., 2020).

The total study period from installation (31 May, 2013) to termination (03 June, 2015) is approximately 2 years

282 (35,174 potential 30-min data), and thein December 2013, there was a gap for approximately 4 weeks due to the

power system failure. The total available data are approximately 90.1%, 88.3%, and 85.4% (n = 31709, 31064,

30028) for  $Q_H$ ,  $Q_E$ , and  $F_C$  after the processes, respectively.

285 The flux partitioning and gap filling methods are well documented in previous studies of Lee et al. (2021) and

Hong et al. (2019b) and here we describe the core of the methods. Missing values in turbulent exchange of energy

and CO2 are filled with an artificial neural network (ANN) of a backpropagation algorithm. The ANN uses the

cosine transformed time-of-the-day and day-of-the-year, air temperature, relative humidity, wind speed and

direction, atmospheric pressure, precipitation, downward shortwave radiation, cloud cover, soil temperature, and

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Flux partitioning into photosynthesis and ecosystem respiration from the EC measured  $F_C$  requires additional information and data processing (e.g., Stoy et al., 2006). It is important to partition the Stochastic  $F_C$  partitioning methods were recently applied by reprocessing EC observation data with auxiliary data and provided useful knowledge on carbon cycle (Hiller et al., 2011; Crawford and Christen, 2015; Menzer and McFadden, 2017; Stagakis et al., 2019). Here we partition the measured FC into four contributing components (i.e., RE, GPP, ER, and  $E_B$  in Eq. 2) to investigate their biotic and abiotic controlling factors in an artificially constructed park. This study applies for a statistical partitioning method described in Lee et al. (2021). Menzer and McFadden (2017) estimates anthropogenic emissions with traffic volume and air temperature in winter with wind directions when anthropogenic emission is dominant in net CO<sub>2</sub> fluxes. This study extends the statistical partitioning method by Menzer and McFadden (2017). Similar to Menzer and McFadden (2017), our partitioning method chooses temporal subsets so that some components in Eqn. (2) are insignificant with footprint weighted road fraction so that the statistical partitioning is applicable even when  $E_R$  is not negligible. In this way, RE is estimated as a function of temperature first and GPP is finally estimated after modelling  $E_R$  and  $E_B$  based on the traffic volume and high-resolution footprint weighted road fraction (see Fig. 1a and Table 1 in Lee et al. (2021)). Our estimations on anthropogenic emission from vehicle and building show good correlation with inventory data such as visitor counts, traffic volume, and natural gas consumption in the park. More information and relevant figures on the flux

# 3 Results and discussion

#### 3.1 Surface energy balance fluxes

partitioning are available in Lee et al. (2021).

The SEBSurface energy fluxes at the SFP shows typical seasonal variations over natural forest canopies with the seasonal march of the East Asian monsoon (Fig. 4) (Hong and Kim, 2011; Hong et al., 2019b; Hong et al., 2020). In summer, there There are lengthy rainy spells and large temporal variabilities of meteorological conditions with the impacts of during the East Asian summer monsoon period (Fig. 2d1d). This heavy rainfall causes substantial decreases in  $K_{\downarrow}$ , and thus  $Q^*$ , with large temporal variations, thereby leading to the mid-summer depression of surface fluxes (Fig. 2e1c and 4).  $Q^*$  also reaches its maximum in spring rather than in summer and decreases

gradually from spring to winter (Fig. 4). More The annual ration of  $Q_E$  to  $Q^*$  at the SFP is smaller than its global average of 0.55 and values over forest canopies at similar latitudes in the East Asia (Falge et al., 2001; Suyker and Verma, 2008; Khatun et al., 2011). halfIn summer, about 50% of Q\* is partitioned to QE, and QH is minimum in summer owing to because of the ample water supply from the summer rainfall. However,  $Q_H$  is maximum in spring and even larger in winter, despite the relatively smaller  $Q^*$ , because of the cold and dry climatic conditions induced by the winter monsoon. Accordingly, the seasonal mean Bowen ratio  $(\beta = \sum Q_H/\sum Q_E)$  ranges from near zero (summer) to approximately 4 (winter) with its daily maximum around 9 in early January 2015 (Fig. 5). Notably,  $\beta$  in the SFP is consistently lower than the high-rise, high-density residential area (i.e., the EP site) because of the ET from the vegetative canopies and the unpaved surfaces in the urban forest. This difference between the two distinct sites confirms that urban forests are responsible for substantial changes in the thermal environment in terms of  $Q_H$  and  $Q_E$ , as well as their related air and surface temperatures because of more evaporative cooling in green spaces compared to impervious surfaces such as roads and buildings in urban areas (Oke et al., 2017)Daytime Bowen ratio in summer is about 0.6, which is smaller in other urban sites but is similar to suburban sites of the similar vegetation cover mainly because of the small fraction of impervious spaces around the SFP station (Table 2). The SEBSurface energy fluxes also shows interannual variabilities over forest canopies influenced by the timing of the onset and duration of the summer monsoon, similarly to natural forest in East Asia, (Hong and Kim, 2011) (Fig. 61, 4, and 5). As discussed in Section 2.2.1.2, annual precipitation is much larger in the first year than in the second year because of the interannual variations in the East Asian summer monsoon activity, thereby making substantial differences in surface radiative fluxes. Furthermore,  $Q_E$  shows the difference between the first and second years of the observation, particularly by responding to such interannual variability of radiation. In the first year-of the observation,  $Q_E$  is more than 300 W m<sup>-2</sup> and has a relatively larger temporal variability because of the frequent rainfall events in summer, compared to the second year. However, it is notable that interannual variability of surface fluxes are relatively weaker than natural forest in this region which will be better manifested in ET and its ratio to precipitation. Evapotranspiration rate, which is equivalent to Q<sub>E</sub>, ranges from 5 mm month<sup>-1</sup> in January 2015 to 74 mm month<sup>-</sup> <sup>1</sup> in August 2013, and the annual ET values are 367 and 320 mm year-<sup>1</sup> in the first and second years, respectively (Fig. 1 and 5 and Table-23). The ET values correspond to 29.3% and 34.3% of the annual precipitations and 49% and 42% of net radiation, respectively. The annual ET in the second year is smaller than that in the first year with extensive drought in the second year. (Fig. 2d). The difference in ET between the two consecutive years (i.e., 48 mm) mainly occurred in summer (42 mm), especially in August (30 mm). It has been reported that approximately 55% of the net radiation is partitioned to latent heat flux in forest canopies globally (Falge et al., 2001; Suyker and Verma, 2008). The annual ET to net radiation from the urban forest is smaller than this global average and it is also smaller than that of forests at similar latitudes in the East Asia () (Fig. 5). Khatun et al., 2011). The annual ET in the second year is smaller than that in the first year with extensive drought in the second year. However, it is notable that the ET in the second year shows only an approximately 12% decrease compared to the first year, despite a substantial decrease in precipitation (26% decrease) and the similar net radiation in the second year,

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compared to the first year (Table 23). Although the summer monsoon provides ample water to the ecosystem, its delay and weakness result in severe drought and stress to the ecosystem in this region (Hong and Kim, 2011); however, such ecosystem stress, such as the shrinking of ET and carbon uptake, is inexplicithas not been extensively investigated for the urban forest. We speculate that artificial irrigation by a sprinkler mitigated ecosystem stress to a certain degree in the urban forest.

#### 3.2 Air temperature

Figure 6 shows the mean diurnal pattern of the air temperature difference between the AVG and SD near the SFP  $(\Delta T_{air} = T_{air} = AVG - T_{air} = SD)$  hereafter) before and after the park construction in summer. Notably,  $\Delta T_{air}$  is always positive during the entire summer season (i.e., AVG is warmer than SD) and shows distinct impacts in terms of magnitude and diurnal variations after the park construction. The warming trend is evident at the AVG (p<0.015), wherein there were no changes in the urban structure and function around them. The warming rate at the AVG is  $3.0 \,^{\circ}\text{C}$  century  $^{+}$ , which corresponds to the warming rate reported in the high-rise urban area in Scoul (Hong et al., 2019a). However, the warming rate around the SFP is approximately  $1.6 \,^{\circ}\text{C}$  century  $^{+}$ , which is smaller than that of the AVG and other urban areas in Scoul and is comparable to the global mean warming rate of  $0.9 \,^{\circ}\text{C}$  century  $^{+}$  (Hansen et al., 2010; Hong et al., 2019a).

Notably, such a lower warming trend around the SFP mainly occurs in the afternoon when ET is dominant. This difference will be larger if we consider that the measurement height at the AVG is higher than that at the SD (Table. 1). The maximum  $\Delta T_{air}$  is approximately 0.3 °C around 10:00 before the park construction (Fig. 6a) and increases up to approximately 0.5 °C with its peak occurrence shifting from the morning to the afternoon (i.e., around 14:00) after the construction (Fig. 6b). This peak time in the afternoon is coincident with the time when photosynthesis is the highest in the vegetation; thus,  $Q_E$  increases in summer. Our results indicate that the thermal mitigation of the urban forest is important as a result of increases in ET, especially if we consider that the SFP area was originally planned to be developed as a high population multipurpose building complex.

# 3.3-Urban heat island intensity

The influence of urban forests on summer temperature produces also evident traces in UHIi. Figure 7 shows the mean diurnal variation of UHIi at the SFP and AVG during summer. Apparently, the UHIi of the SFP (UHIi<sup>S</sup> hereafter) and AVG (UHIi<sup>A</sup>CBD (UHIi<sup>C</sup> hereafter) gradually increases after mid-afternoon and is the largest at night. (Fig. 6). This diurnal pattern is consistent with previous reports in cities exposed to different geographical and climatic conditions because rural areas cool faster than urban areas (Oke et al., 2017). Additionally, UHIi<sup>A</sup>UHIi<sup>C</sup> is positive throughout all days ranging from 0.2–2.2 °C (i.e., warmer than rural area, GP) and is greater than UHIi<sup>S</sup> by 0–1.5 °C. A possible The reason for this stronger UHIi<sup>A</sup>UHIi<sup>C</sup> is that the AVGCBD stations are located in the central business district; thus, the densities of buildings surrounding these stations are much higher than those surrounding the SFP station. At night (19:00–06:00), UHII<sup>A</sup>UHII<sup>C</sup> and UHI<sup>S</sup> are approximately 1.8 °C and 1.4 °C, respectively. The maximum UHIi difference between the AVGCBD and SFP was 0.7 °C in 2013 and 0.5 °C in 2014.

Around sunrise, sharp declines in the UHIi are observed because the air temperature near the urban area increases relatively slowly as urban fabrics, such as asphalt, brick, and concrete, have larger heat capacities and less sky view factors than the rural areas (Oke et al., 2017). Eventually, this slow increase in the air temperature reduces the differences in  $T_{air}$  among the stations, thereby reducing the UHIi. The minimum UHIi<sup>A</sup>UHIi<sup>C</sup> values were 0.3 °C (2013) at 09:30 and 0.2 °C (2014) at 08:30, while the minimum UHIi<sup>S</sup> occurs at 10:30 with values of – 0.1 °C (2013) and 0.0 °C (2014). This implies that the timing of the minimum UHIi is delayed in the SFP compared to the AVG. Our findings indicate that the urban forest has a similar air temperature in the daytime as compared to the rural area (i.e., GP) where has a lower thermal admittance because of its location within the airport. Especially when there is strong ETCBD. Notably, when there is strong ET (i.e., the first year) and more time is required to warm the SFP surface, the urban-rural difference in thermal admittance becomes relatively small. This can be attributed to the higher thermal capacity of the wetter soil of the SFP as a resultbecause of artificial irrigation and the absence of impervious surfaces (Oke et al., 1991).

The diurnal variations in UHIi<sup>S</sup> also show the interannual variability in both amplitude and steepness over the two consecutive years. Despite the similar summertime UHIi<sup>S</sup> for both years, the daytime UHIi<sup>S</sup> in 2013 was approximately 0.2 °C lower than that in 2014. Notably, the summer  $Q_E$  was greater in 2013 than in 2014, and this observed summertime asymmetric difference between the SFP and AVGCBD stations was not found in the winter when ET was negligible (not shown here).

ΔT<sub>air</sub> is always positive during the entire summer season (i.e., CBD is warmer than SD) and shows distinct impacts on magnitude and diurnal variability after the park construction (Fig. 7). This difference will be larger if we consider that the measurement height at the CBD is higher than that at the SD (Table. 1). Notably, this temperature contrast mainly occurs in the afternoon when ET is dominant. The maximum  $\Delta T_{aix}$  is approximately 0.3 °C around 10:00 before the park construction (Fig. Our results suggest that urban forests can play a significant role in mitigating the thermal environment 7a) and increases up to approximately 0.5 °C with its peak occurrence shifting from the morning to the afternoon (i.e., around 14:00) after the construction (Fig. 7b). This peak time in the afternoon is coincident with the time when photosynthesis and  $Q_E$  are highest. The annual mean of the maximum UHIi in the SD is about 4 °C and does not change significantly after the park construction compared to the CBD regions (Hong et al., 2019a). On the contrary, the daytime maximum UHIi of the SD in summer decreases after the park construction (not shown here). Our results indicate that the thermal mitigation of the urban forest is important because of the wetter soil surface of the park and subsequent increases in  $Q_E$ , compared to the impervious surfaces in urban areas. In particular, our findings indicate This is especially true if we consider that the SFP area was originally planned to be developed as a high-population multi-purpose building complex. Our findings emphasize that the heat mitigation of the urban forest depends on the ratio of  $Q_E$  to net radiation. Indeed, there is an evident negative relationship between daytime  $Q_E$  and air temperature differences between the SFP and AVGCBD stations (Fig. 8). As  $K_{\downarrow}$  is more partitioned to  $Q_E$ ,  $T_{air}$  of the SFP decreases more than that of the AVGCBD, and the maximum temperature difference is observed in the summer season. The SFP is cooler than the AVGCBD by up to 0.6 °C, but the SFP is warmer than the AVGCBD during the winter-dormant season when ET is small. Our findings confirm that urban forests are responsible for substantial changes in the thermal

environment in terms of  $Q_H$  and  $Q_E$ , as well as their related air and surface temperatures because of more evaporative cooling in green spaces compared to impervious surfaces such as roads and buildings in urban areas (Oke et al., 2017).

### 3.43 Temporal dynamics of net CO<sub>2</sub> exchange

Figure 9 shows the diurnal evolution of  $F_C$  and footprint weighted road fraction ( $\lambda$ ). Overall, the mean daytime  $F_C$  is negative (i.e., carbon uptake) in the summer (June–August), indicating that photosynthesis, the only carbon sink, is dominant-in the growing season (Fig. 9). This carbon uptake period is coincident with the active vegetation manifested by increases in EVI (not shown here). Summertime photosynthetic carbon uptake (GPP) has a daily average of 7.6 µmol m<sup>-2</sup> s<sup>-1</sup> with a maximum of 18.9 µmol m<sup>-2</sup> s<sup>-1</sup> around 12:30 (Fig. 8a in Lee et al., 2021).9 and 10). A daily minimum  $F_C$  also occurs around 12:30 with the maximum photosynthetic carbon uptake during this time accordingly. The vegetation around the SFP absorbs more  $CO_2$  than earbon sources and  $F_C$  becomes negative only during the summer daytime. However, because, of substantial amounts of anthropogenic emissions and ecosystem respiration,  $F_C$  changes from negative (i.e., earbon sink) to positive values (i.e., earbon source) even around 16:30 in summer unlike in natural ecosystems, despite the substantial downward shortwave.

CO<sub>2</sub> uptake is highest in June, with a maximum of approximately 13  $\mu$ mol m<sup>-2</sup> s<sup>-1</sup> (Fig. 9a). In the middle of summer (4th and 31st two-week data in Fig. 9a), CO<sub>2</sub> uptake decreases significantly because photosynthesis is limited because of the reduced  $K_{\downarrow}$  by cloud and rainfall with the onset of the summer monsoon (Fig. 2e1c). This mid-summer depression of carbon uptake has been reported in the Asian natural vegetations (e.g., Kwon et al., 2009; Hong and Kim, 2011; Hong et al., 2014). HigherGreater reduction in CO<sub>2</sub> uptake observed in 2013 than in 2014 was attributed to a longer monsoon period in 2013. Indeed, from 8 to 21 July 2013 (4th two-week data in Fig. 9a), the accumulated precipitation was approximately 400 mm for two weeks, and the daily averaged  $K_{\downarrow}$  was only 70 W m<sup>-2</sup>.

The vegetation around the SFP absorbs more CO<sub>2</sub> than is emitted by local carbon sources and  $F_C$  is negative only during the summer daytime. Because of substantial amounts of anthropogenic emissions and ecosystem respiration,  $F_C$  changes from negative (i.e., carbon sink) to positive values (i.e., carbon source) even around 16:30 in summer unlike in natural ecosystems, despite the substantial downward shortwave As photosynthesis decreases,  $F_C$  changed (e.g., Desai et al., 2008; Hong et al., 2009; Alekseychik et al., 2017; Chatterjee et al., 2020). As photosynthesis decreases,  $F_C$  changes to positive values from November. During the non-growing season (i.e., late autumn, winter, and early spring), anthropogenic emissions were also dominant because photosynthesis and ecosystem respiration decrease with smaller  $K_{\downarrow}$  and lower temperatures. During these periods,  $F_C$  had minimum values at 04:00–05:00 and increases until 15:00–16:00. Therefore, the The diurnal variations in  $F_C$  mainly followed the traffic volume (Fig. 4a in Lee et al., 2021), and there. There also is a clear positive relationship between  $F_C$  and  $\lambda$  (23rd, 45th, and 47th two-week data in Fig. 9Fig. 4 in Lee et al., 2021). It is also noteworthy that the peak

time of  $F_C$  (16:00) is earlier than the peak time of  $\lambda$  (18:00) from December to early March because  $E_B$  is the largest at around 15:00–16:00, indicating that  $E_R$  and  $E_B$  are the controlling factor of  $F_C$  in this period.

With such apparent The seasonal  $F_C$  variation, it is notable that its variability also depends on the spatio-temporal distribution of CO<sub>2</sub> sources and flux source area footprint because the latter covers various land use with changes in wind direction and atmospheric stability (Fig. 10). In autumn, the main wind direction changed changes to the north as the synoptic conditions change particularly as discussed in section 2 (Fig. 32); therefore,  $\lambda$  is smaller in autumn compared to other seasons (Fig. 9b). For example, the road fraction wasis smallest at < 1% from midnight to midday and < 3% during the afternoon in October and November (11th, 12th, 36th, and 37th two-week data in Fig. 9b). In these periods, the nighttime  $F_C$  showed shows the lowest value of approximately 2.9  $\mu$ mol m<sup>-2</sup> s<sup>-1</sup>, which wasis attributable to the smallest road fraction, lower respiration, and minimal heating usage.

In early spring,  $\lambda$  wasis generally larger; thus,  $E_R$  playedplays a significant role in  $F_C$ , and  $E_B$  also remained remains non-zero until early April because of anthropogenic emission by hot water and space heating in the building within the footprint, thereby resulting in the largest  $F_C$  in this period. With a shutdown of the heating system (i.e., zero  $E_B$ ) and the sprouting of leaves in April, there wasis a sharp decrease in  $F_C$  (Fig. 10b and 10c). From December to March, CO<sub>2</sub> emissions increased up to 30 µmol m<sup>-2</sup> s<sup>-1</sup> with larger variability in the south-west direction because of intermittent anthropogenic emissions from the park facility building in the south-west directions (due to space heating and boiling water), as well as the relatively increased contribution of vehicles on the road in the western part of the site- (Fig. 10b).

Although the positive  $F_C$  in the winter decreased in spring, its magnitude showed directional differences (Fig. 10c). On the eastern side, the mean  $F_C$  showed shows a negative value in May, whereas it remained remains positive on the western side (210–270°) until May. Therefore, these These findings further indicating indicate the different contributions of various carbon sources and sinks among the different wind directions. For the wind directions from the north to the east (0–120°),  $F_C$  showed shows a relatively weaker carbon sink than other directions because of the relatively low tree fraction in this direction (Fig. 10a and 10c). On the southern side (150–180°) having the highest tree cover fraction, a maximum carbon uptake is about 15  $\mu$ mol m<sup>-2</sup> on average was found in June. However, despite the dense vegetation on the south and west side (120–330°), the  $F_C$  magnitude was much smaller than that of other natural forests. This is related to the anthropogenic emissions from vehicles on the roads which is discussed in section 3.65.

# 3.54 Light use efficiency of biogenic CO<sub>2</sub> components

  $F_C$  at the SFP shows a typical light response to the photosynthetically active radiation (PAR) in a way similar to natural ecosystems in spite of anthropogenic CO<sub>2</sub> sources from vehicles (Fig. 11a and 11b11). However, this light response in the urban forest is a distinct contrast with the non-dependent  $F_C$  in high-rise high-population residential areas in Seoul under the same climatic conditions (that does not respond to PAR (i.e., EP station). Importantly, GPP, NBE, and  $F_C$  show different trends on PAR depending on the direction. As stated in Section 2.1.12.2 and 3.43, the western side has a higher density of trees as against more grass on the eastern side, and

biotic CO<sub>2</sub> uptake from the western side is substantially larger than that on the eastern side. Accordingly, the slope of the light response curve for PAR on the western side is steeper than on the eastern side.  $F_C$  at zero PAR ( $F_{C_-\theta}$ ) is larger on the western side (9.7 µmol m<sup>-2</sup> s<sup>-1</sup>) than on the eastern side (5.1 µmol m<sup>-2</sup> s<sup>-1</sup>) because of a contribution of  $E_R$  from roads on the western side of the tower.

*NBE* shows a comparable light response to natural vegetation (e.g., Schmid et al., 2003). A rectangular hyperbolic equation has been used to examine the light response of *NBE* and elucidate the directional differences in carbon uptake:

$$NBE = -GPP + RE = -\frac{\alpha \cdot GPP_{Sat} \cdot PAR}{GPP_{Sat} + \alpha \cdot PAR} + RE$$
 (3)

where  $\alpha$  is the quantum yield efficiency (the initial slope of the light-response curve),  $GPP_{sar}$  is the potential rate of the ecosystem  $CO_2$  uptake.  $\alpha$  is approximately 0.0651 and 0.0558 µmol  $CO_2$  (µmol photon)<sup>-1</sup> on the western and eastern sides, respectively. Notably,  $\alpha$  on the western side is comparable to the high initial quantum yield in crops and subtropical forests in East Asia (Hong et al., 2019b; Emmel et al., 2020). Additionally,  $GPP_{sat}$  is 30.9 and 12.7 µmol m<sup>-2</sup> s<sup>-1</sup> on the western and eastern sides, respectively. In addition, the light saturation points are at a PAR of 1500 µmol m<sup>-2</sup> s<sup>-1</sup> on the eastern side, which occur at a relatively lower PAR than on the western side. Daytime respiration estimated from equation (3) is 6.7 and 6.3 µmol m<sup>-2</sup> s<sup>-1</sup> on the western and eastern sides, respectively. Because GPP is related to PAR, the difference in monthly cumulative GPP between the two years shows a close relationship with the difference in the monthly sunshine duration ( $r^2 = 0.75$ , not shown here), thereby suggesting a possible impact of change in the onset of the summer monsoon on urban forests.

The magnitude of NBE from the western side is larger than that from the suburban area having with about 50% vegetative fraction in Montreal, Canada (Fig. 7b in Bergeron and Strachan, 2011) and  $F_C$  from a highly vegetated environment of about 67% vegetative fraction in Baltimore, USA (Crawford et al., 2011). Also, GPP from the western side is comparable to the dense forest canopies in subtropical forests in Korea (Hong et al., 2019b), deciduous forest ecosystems (Goulden et al., 1996), and a mixed hardwood forest ecosystem (Schmid et al., 2000). However, NBE from the eastern side is similar to  $F_C$  from the suburban areas of about 44%, 50%, and 64% vegetative fraction in Swindon, UK (Ward et al., 2013) and Montreal, Canada (Bergeron and Strachan, 2011), and Ochang, Korea in the same climate zone (Hong et al., 2019b), respectively.

#### 3.65 Annual budget of CO<sub>2</sub> sources and sink

The annual budget of the F<sub>C</sub> and its components is summarized in Table 3. The annual sums of the GPP and RE in the SFP are 4.6 kg CO<sub>2</sub> m<sup>-2</sup> year<sup>-1</sup> (1244 gC m<sup>-2</sup> year<sup>-1</sup>) and 5.1 kg CO<sub>2</sub> m<sup>-2</sup> year<sup>-1</sup> (1378 gC m<sup>-2</sup> year<sup>-1</sup>), respectively- (Table 4). This photosynthetic carbon uptake is smaller than its global mean GPP in natural deciduous broadleaf forests with similar annual precipitation and annual mean air temperature (total 8 years of data from 4 sites of FLUXNET2015 dataset reported in Pastorello et al., 2020) and similar to that of deciduous broadleaf forests in East Asia (Awal et al., 2010; Kwon et al., 2010) (Table 4). Our speculation is, however,5). However, we note that this GPP is relatively larger if we consider the low vegetation fraction and leaf area index

(LAI) at our urban park. Indeed, *GPP* is comparable to values reported in other urban sites if it is scaled with the vegetation cover fraction. Previous studies have shown that the *GPP* of urban vegetation is scaled with vegetation cover fraction with an increase of about 0.7 kg CO<sub>2</sub> m<sup>-2</sup> year<sup>-1</sup> per 10% increase in vegetation cover fraction (Awal et al., 2010; Crawford and Christen, 2015; Velasco et al., 2016; Menzer and McFadden, 2017). Indeed, *GPP* at the SFP with a 46.6% vegetation cover fraction is approximately 1.5 kg CO<sub>2</sub> m<sup>-2</sup> year<sup>-1</sup> which is larger than this scaled with the vegetation cover fraction (Fig. 12a).

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Eventually, Despite this large larger GPP results in a resulting smaller  $F_C$  eventually, there is no substantial decrease in  $F_C$  when they are scaled by vegetation fraction, suggesting large contribution of RE (Fig. 12b). Hong et al. (2019b) reported There was a linear decrease in  $F_C$  of approximately 3.0 kg CO<sub>2</sub> m<sup>-2</sup> year<sup>-1</sup> per 10% increase in vegetation cover fraction based on the observed  $F_C$  across an urbanization gradient in Korea (Fig. (Hong et al., 2019b and references therein). 12b). The annual  $F_C$  in the SFP of 7.1 kg CO<sub>2</sub> m<sup>-2</sup> is  $\frac{1.2 \text{ kg CO}_2 \text{ m}^{-2} \text{ year}^{-1} \text{ smaller}}{\text{than not so much different from other similar cities and this scaled relationship (i.e., more earbon uptake). In particular, <math>F_C$  in the SFP is approximately  $\frac{3.0 \text{ kg CO}_2 \text{ m}^{-2} \text{ year}^{-1} \text{ less than that in recently developed high rise high-population urban areas in Seoul. Our results suggest that efficient management of urban forests, such as regular irrigation and fertilization, can be an efficient way to adapt and mitigate climate change by increasing CO<sub>2</sub> uptake in artificial forest constructions in East Asia.$ 

. Meanwhile, RE at our site is much larger than that in <u>natural</u> temperate deciduous forests in <u>East Asiathe similar</u> climate zone (Takanashi et al., 2005; Kwon et al., 2010) and similar to that in the urban forest in East Asia (Awal et al., 2010), as well as to the global mean RE over forests with similar annual precipitation and annual mean air temperatures (Pastorello et al., 2020). Put differently, the urban forest considered in our study is an outlier compared to other natural forest canopies and urban forests because RE/GPP > 1 (Table 45). Autotrophic respiration is considered to be approximately half of GPP as a rule of thumb (Piao et al., 2010), which corresponds to approximately 45% of the RE at our site, thereby indicating a large contribution of heterotrophic respiration to RE. Indeed, it was reported that soil respiration at the same site was approximately 4 kg CO<sub>2</sub> m<sup>-2</sup> year<sup>-1</sup> (Bae and Ryu, 2017). The reason for the large soil organic carbon was mainly because rice cultivation was carried out in this region before the 1950s, and organic carbon-rich soil was transplanted during the SFP construction, and fertilizers were applied regularly. It has also been reported that RE is enhanced in urban areas because of the relatively warmer temperature in urban regions (i.e., UHI) (Awal et al., 2010). Notably, Q<sub>10</sub> (the rate by which respiration is multiplied when temperature increases by 10 °C) is about 1.9 at the site and matches the Q<sub>10</sub> value for ecosystem respiration (2.2  $\pm$  0.7) calculated for natural forests across 42 FLUXNET sites (Mahecha et al., 2010). Further analysis based on the observed Q<sub>10</sub> and the UHIi at the SFP indicates that UHI leads to an approximately 5% increase in RE.

Figure 13 shows the monthly cumulative sum of the  $F_C$  and its partitioned components. Seasonal variations in the strength of carbon sources and sink as well as  $F_C$  are mainly regulated by the biogenic component in summer and the anthropogenic component in winter- (Fig. 13). Furthermore,  $F_C$  is minimum in June, despite the similar GPP from June to August because of the relatively smaller RE during the summer season. Even in summer, photosynthetic carbon uptake is balanced with ecosystem respiration and does not offset all biotic and

anthropogenic emissions, thus resulting in positive  $F_C$  values throughout the year. In winter,  $E_B$  is dominant with negligible GPP and RE due to cold temperatures, and  $E_R$  also becomes larger than RE from November.  $E_R$  shows apparent seasonal variation in wind direction and atmospheric stability. Its magnitude is about 0.0666 µmol m<sup>-2</sup> veh<sup>-1</sup> h s<sup>-1</sup> in neutral condition and consistent with the value in the inventory data (Lee et al., 2021). The average monthly traffic speed for the road in front of the SFP is 50–60 km h<sup>-1</sup> (based on the January 2014 data from the Seoul Metropolitan Government Traffic Speed Report), and the CO<sub>2</sub> emission rate is approximately 150 g CO<sub>2</sub> km<sup>-1</sup> veh<sup>-1</sup> based on the emission data at this speed (Kim et al., 2011). With the width of the ten-lane road (25–30 m), the inventory-based slope (i.e., CO<sub>2</sub> emission rate per vehicle per area per half-hour) is approximately in the range of 0.0631–0.0757 µmol m<sup>-2</sup> veh<sup>-1</sup> half-hour s<sup>-1</sup> ( $\cong$  150 gCO<sub>2</sub> km<sup>-1</sup> veh<sup>-1</sup> × 1/30 or 1/25 m<sup>-1</sup> × 1/44 mol gCO<sub>2</sub><sup>-1</sup>× 10<sup>-3</sup> km m<sup>-1</sup> × 10<sup>6</sup> µmol mol<sup>-1</sup> × 1/1800 half-hour s<sup>-1</sup>).

There is an evident yearly difference in individual carbon sources and sink in two consecutive years.  $E_B$  is mainly caused by heating buildings and hot water in park facilities using natural gas. Notably, E<sub>B</sub> is highly correlated with gas consumption in SFP during winter on monthly basis ( $R^2 = 0.94$ ; Fig. 6 in Lee et al., 2021). Notably,  $E_B$  is  $also E_B$  is smaller in the first year because of the relatively smaller number of park visitors and consequently smaller gas consumption, compared to the second year. Indeed,  $E_B$  is highly correlated with gas consumption in SFP during winter on a monthly basis (R<sup>2</sup> = 0.94; Fig. 6 in Lee et al., 2021). Eventually, these annual differences lead to a smaller annual mean total  $F_C$  in the first year than in the second year (Table 3). However, 4). RE is maximum in the August of the first year, while it is highest in July offin the second year because the monthly mean air temperature is highest in August of the first and July of the interannual second year with annual variations in air temperature with changes in the timing and duration of the East Asian summer monsoon, of which impacts have also been reported in natural vegetation in the same region (Hong and Kim, 2011; Hong et al., 2019b). In other words, the monthly mean air temperature is highest in August of the first and July of the second year because of the short East Asian monsoon period and drought in July of the second year. However, the 2019b). GPP in summer is relatively smaller in the first year by the mid-summer depression of solar radiation because of the elongated monsoon period (but annual sums of GPP are similar in two years (Table 4 and Fig. 2). However, 13). GPP does not shrink in the second year of significant drought because there is of ample water supply by a sprinkler. Eventually,  $F_C$  in the SFP is approximately 3.0 kg CO<sub>2</sub> m<sup>-2</sup> year<sup>-1</sup> less than that in recently developed high-rise high-population urban areas in Seoul. Our results emphasize the important role of forest suggest that efficient management in enhancing earbonof urban forests, such as regular irrigation and fertilization, can be an efficient way to adapt and mitigate climate change by increasing CO<sub>2</sub> uptake and evaporative cooling despite the low vegetation fraction in artificial forest constructions in East Asia.

# 4 Summary and conclusions

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This study reported two-year surface fluxes of energy and CO<sub>2</sub> measured by the eddy covariance method while also examining in order to examine the role of artificially generated urban forests in mitigating air temperature and anthropogenic CO<sub>2</sub> emissions. The study area is located in the East Asian monsoon region, characterized by a lengthy summer rainy season. During the measurement period, the second year was contrasted with the first year

because of the drought compared to the normal climate condition in the first year. The study region is an urban park with an artificially planted forest in the Seoul Metropolitan Area. The urban forest had a heavy traffic volume around it and was redeveloped from a racetrack and factory in the mid-2000s- where is influenced by a lengthy summer rainy season during the East Asian summer monsoon. To examine the mitigation of air temperature, this study compared compares meteorological conditions in the urban forest with the surrounding high-rise high-population urban areas. This study also proposed applies for the ANN-based gap filling and a statistical CO<sub>2</sub> flux partitioning method based on temporal subsets of flux data and high-resolution footprint-weighted land use data to understand the abiotic and biotic contributions to  $F_C$ .

 Surface energy balancefluxes in the SFP is influenced by the summer monsoon, and more energy is distributed to  $Q_E$  than  $Q_H$  in the summer when vegetation is active, similarin the growing season, similarly to natural forests in this climate zone. Therefore, the The Bowen ratio in this urban forest ranges from near 0 (summer) to about 4 (winter), which is lower throughout the year than that of high-rise and high-density residential areas in Seoul. This suggests that the vegetation and unpaved surfaces of urban forests facilitate more evaporative cooling compared to the impervious surfaces in urban areas. Furthermore, ET decreased in During the measurement period, the second year when there was a is contrasted with the first year because of the drought compared to the normal climate condition in the first year. Notably, ET decreases in the second year, but this drop was not as much as the reduced precipitation if we consider the substantial its related changes in precipitation and radiative forcing in two consecutive years during the drought because of the artificial irrigation by a sprinkler mitigated ecosystem.

It is also evident that the urban forest reduced the warming trend and UHIi around the study area. Air temperature in the SFP wasis lower than the surrounding area, but this coolness wasis reinforced after the park was created. The warming trend diminished diminishes after the construction of the park and wasis smaller than that in other urban regions in the Seoul Metropolitan Area. In addition, the construction of the park delayeddelays the timing of the maximum temperature difference between the urban forest and high-rise commercial from the morning to the afternoon, coinciding with the timing of the maximum  $Q_E$ . The SFP shows a generaltypical diurnal UHIi variation pattern, which has a higher temperature at night than in rural areas. However, the UHIi in SFP is lower by 0.6 °C in summer compared to the surrounding urban area, and the time of the minimum peak time is delayed, possibly because vegetation and permeable soils in SFP have a larger thermal capacity. Notably, UHIi decreaseddecreases more in the partitioning of incoming energy into latent heat fluxes. As a rule of thumb, and there was cooling by 0.2 °C compared to the surrounding urban area if  $Q_E/K_{\perp}$  increased by 10%-% in this study.

Net CO<sub>2</sub> exchange at the urban forest showedshows typical temporal variations in natural forest canopies influenced by the East Asian summer monsoon—(Hong and Kim, 2011; Hong et al., 2019b). A mid-summer depression of carbon uptake wasis observed with the onset of the summer monsoon, like vegetation in the East Asian monsoon region. The *GPP* wasis estimated by the statistical partitioning method, and the non-zero *GPP* period wasis coincident with the active vegetation of the significant vegetation index. Summertime photosynthetic carbon uptake hadhas a daily average of 7.6 μmol m<sup>-2</sup> s<sup>-1</sup> with a maximum of 18.9 μmol m<sup>-2</sup> s<sup>-1</sup> around 12:30. However, even during the growing season, vegetative carbon uptake wasis insufficient to offset anthropogenic CO<sub>2</sub> emissions and ecosystem respiration on a time scale of > 1 day. Our estimations of anthropogenic CO<sub>2</sub>

emissions from vehicles and buildings agreedagree with the estimations based on inventory data such as CO<sub>2</sub> emission rate of vehicles and monthly gas consumption, and their annual budgets each hadhave a comparable magnitude to *GPP*.

Annual *GPP* of the urban forest wasis relatively smaller than that of the forest in East Asia exposed to similar climatic conditions because of the relatively smaller vegetation cover fraction and LAI. However, it wasis larger than the *GPP* expected from the relationship from previous urban studies if it wasis normalized by the vegetation cover fraction. RE is, however, much larger than that in the temperate East Asian forests and is similar to the urban forest in East Asia. We speculate that soil respiration enhancedenhances such large ecosystem respiration RE by relatively warmer temperatures in a city and rich soil organic carbon in the SFP. Eventually, the The annual mean total  $F_C$  is 7.1 kg CO<sub>2</sub> m<sup>-2</sup> year<sup>-1</sup>, which is smaller than the estimate from the scaling between annual total  $F_C$  and vegetation fraction (Hong et al., 2019b). Because of the spatial heterogeneity,  $F_C$  and its components showed directional changes. NBE from the eastern side is similar to  $F_C$ —ofthat in suburban areas with approximately 44%, 50%, and 64% vegetative fraction in Swindon, UK (Ward et al., 2013) and Montreal, Canada (Bergeron and Strachan, 2011), and Ochang, Korea in the same climate zone (Hong et al., 2019b), respectively. However, the NBE and GPP from the western side are comparable to dense forest canopies in subtropical forests in Korea (Hong et al., 2019b), deciduous forest ecosystems (Goulden et al., 1996), and a mixed hardwood forest ecosystem (Schmid et al., 2000).

Our study reveals that urban forests make significant traces results emphasize the important role of air temperature forest management in enhancing carbon uptake and CO2-fluxes evaporative cooling despite their relatively small area the low vegetation fraction. Our key findings are that urban forests in East Asia are highly influenced by the East Asian monsoon like natural forests in this region, but such influence is mitigated by artificial irrigation and fertilization in urban forests. In particular, our Our results emphasize the importance of forest management for efficient carbon uptake and evaporative cooling despite the low vegetation fraction. Furthermore, our observation study also indicates that caution in soil management is necessary to reduce CO2 emissions in urban forests, mainly resulting from large soil organic carbon. We also highlight that our statistical CO2-flux partitioning is a promising method to improve our understanding of the earbon cycle in urban and suburban areas, and a more extensive study is required for validation in another geographical zone, and warm environment.

Acknowledgment. This research was supported by the Korea Meteorological Administration Research and Development Program under Grant KMI2021-01610 and National Research Foundation of Korea Grant from the Korean Government (MSIT) (NRF-2018R1A5A1024958). All data and codes are available in Lee et al. (2021) and upon request to the corresponding author (jhong@yonsei.ac.kr / https://eapl.yonsei.ac.kr).

# **Appendix A. List of Abbreviation**

Abbreviation	<u>Definitions</u>	Abbreviation	<u>Definitions</u>
CBD	the Gangnam, Seocho, and Songpa observatories at central business district	RE	ecosystem respiration
$E_B$	CO <sub>2</sub> emission from buildings	SD	the Seongdong weather station
EC	eddy covariance	SEB	surface energy balance
<u>EP</u>	the Eunpyeong site	SFP	the Seoul Forest Park
$E_R$	CO <sub>2</sub> emission from vehicles on roads	<u>Tair</u>	the screen-level air temperature
ET	evapotranspiration	Tair_CBD	air temperature at the CBD regions
EVI	enhanced vegetation index	Tair_SD	air temperature at the SD
<u>F_C</u>	net CO <sub>2</sub> exchange	<u>UHI</u>	urban heat island
<u>F<sub>C_0</sub></u>	$F_C$ at zero $PAR$	<u>UHIi</u>	urban heat island intensity
<u>GP</u>	the Gimpo weather station	<u>UHIi<sup>C</sup></u>	UHIi at CBD
<u>GPP</u>	gross primary production	<u>UHIi<sup>s</sup></u>	UHIi at SFP
<u>GPP<sub>sat</sub></u>	potential rate of ecosystem CO <sub>2</sub> uptake	VPD	vapor pressure deficit
<u>K</u> <sub>↓</sub>	downward shortwave radiation	$\Delta T_{air}$	Tair_CBD — Tair_SD
<u>LCZ</u>	local climate zone	<u>∆Q</u> s	the net storage heat flux
MAP	mean annual precipitation	<u>∆Q</u> <sub>A</sub>	the net heat advection
MAT	mean annual temperature	<u>h</u> c	mean canopy height
NBE	net biome exchange of CO <sub>2</sub> (RE – GPP)	<u>Z0</u>	mean roughness length
<u>P</u>	<u>precipitation</u>	<u>Z</u> d	zero-plane displacement height
PAR	photosynthetic active radiation	<u>Z</u> m	measurement height
<u>Q</u> E	latent heat flux	<u>α</u>	quantum yield efficiency
<u>Q</u> F	anthropogenic heat flux	<u>B</u>	Bowen ratio (= $\sum Q_H / \sum Q_E$ )

<u>Q</u> <sub>H</sub>	sensible heat flux	$\frac{\lambda}{2}$	source area weighted road ratio
<u>Q*</u>	net radiation	<u> 2</u> v	Vegetation cover fraction
<u>Q10</u>	the rate by which respiration is multiplied when temperature increases by 10°C		

#### 675 References

- Alekseychik, P., Mammarella, I., Karpov, D., Dengel, S., Terentieva, I., Sabrekov, A., Glagolev, M. and Lapshina,
- E.: Net ecosystem exchange and energy fluxes measured with the eddy covariance technique in a western Siberian
- 678 bog. Atmospheric Chemistry and Physics, 17, 9333-9345, 2017.
- Awal M. A, Ohta T., Matsumoto K., Toba T., Daikoku K., Hattori S., and coauthors: Comparing the carbon
- sequestration capacity of temperate deciduous forests between urban and rural landscapes in central Japan. Urban
- 681 Forestry & Urban Greening, 9(3), 261-270, 2010.
- Bae, J., and Ryu, Y.: Spatial and temporal variations in soil respiration among different land cover types under
- wet and dry years in an urban park. Landscape and Urban Planning, 167, 378–385, 2017.
- Ballinas, M., and Barradas, V. L.: The urban tree as a tool to mitigate the urban heat island in Mexico City: A
- simple phenomenological model. Journal of environmental quality, 45(1), 157-166, 2016.
- Balogun, A. A., Adegoke, J. O., Vezhapparambu, S., Mauder, M., McFadden, J. P. and Gallo, K.: Surface energy
- 687 <u>balance measurements above an exurban residential neighbourhood of Kansas City, Missouri. Boundary-Layer</u>
- 688 <u>Meteorology. 133, 299-321, 2009.</u>
- 689 Bergeron, O., and Strachan, I. B.: CO<sub>2</sub> sources and sinks in urban and suburban areas of a northern mid-latitude
- 690 city. Atmospheric Environment, 45(8), 1564-1573, 2011.
- Bonan, G. B.: Forests and climate change: forcings, feedbacks, and the climate benefits of forests. Science, 320,
- 692 1444-1449. 2008.
- 693 Bowler, D. E., Buyung-Ali, L., Knight, T. M., and Pullin, A. S.: Urban greening to cool towns and cities: A
- 694 systematic review of the empirical evidence. Landscape and Urban Planning, 97(3), 147-155, 2010.
- 695 Chang, C. R., Li, M. H., and Chang, S. D.: A preliminary study on the local cool-island intensity of Taipei city
- 696 parks. Landscape and Urban Planning, 80(4), 386-395, 2007.
- 697 Chatterjee, S., Swain, C.K., Nayak, A.K., Chatterjee, D., Bhattacharyya, P., Mahapatra, S.S., Debnath, M.,
- Tripathi, R., Guru, P.K. and Dhal, B.: Partitioning of eddy covariance-measured net ecosystem exchange of CO<sub>2</sub>
- 699 <u>in tropical lowland paddy. Paddy and Water Environment, 18, 623-636, 2020.</u>
- 700 Chiesura, A.: The role of urban parks for the sustainable city. Landscape and Urban Planning, 68(1), 129-138,
- 701 2004.
- 702 Christen, A.: Atmospheric measurement techniques to quantify greenhouse gas emissions from cities. Urban
- 703 Climate, 10, 241-260, 2014.
- 704 Christen, A. and Vogt, R.: Energy and radiation balance of a central European city. International Journal of
- 705 Climatology. 24, 1395-1421, 2004.
- 706 Coutts, A. M., Beringer, J., and Tapper, N. J.: Impact of increasing urban density on local climate: Spatial and
- temporal variations in the surface energy balance in Melbourne, Australia. Journal of Applied Meteorology and
- 708 Climatology, 46(4), 477-493, 2007a.
- 709 Coutts, A. M., Beringer, J., and Tapper, N. J.: Characteristics influencing the variability of urban CO<sub>2</sub> fluxes in
- Melbourne, Australia. Atmospheric Environment, 41(1), 51-62, 2007b.
- 711 Crawford, B., Grimmond, C. S. B., and Christen, A.: Five years of carbon dioxide fluxes measurements in a highly
- vegetated suburban area. Atmospheric Environment, 45(4), 896-905, 2011.

- 713 Crawford, B., and Christen, A.: Spatial source attribution of measured urban eddy covariance CO<sub>2</sub> fluxes.
- 714 Theoretical and Applied Climatology, 119(3-4), 733-755, 2015.
- Desai, A.R., Richardson, A.D., Moffat, A.M., Kattge, J., Hollinger, D.Y., Barr, A., Falge, E., Noormets, A., Papale,
- D., Reichstein, M. and Stauch, V.J.: Cross-site evaluation of eddy covariance GPP and RE decomposition
- 717 <u>techniques. Agricultural and Forest Meteorology</u>, 148, 821-838, 2008.

- 719 Emmel, C., D'Odorico, P., Revill, A., Hörtnagl, L., Ammann, C., Buchmann, N. and Eugster, W.: Canopy
- photosynthesis of six major arable crops is enhanced under diffuse light due to canopy architecture. Global Change
- 721 Biology, 26(9), 2020.
- Falge, E., Baldocchi, D., Olson, R., Anthoni, P., Aubinet, M., Bernhofer, C., Burba, G., Ceulemans, R., Clement,
- 723 R., Dolman, H., Granier, A., Gross, P., Grünwald, T., Hollinger, D., Jensen, N., Katul, G., Keronen, P., Kwalski,
- A., Lai, C., Law, B., Meyers, T., Moncrieff, J., Moors, E., Munger, W., Pilegaard, K., Rannik, Ü., Rebmann, C.,
- 725 Suyker, A., Tenhunen, J., Tu, K., Verma, S., Vesala, T., Wilson, K., and Wofsy, S.: Gap filling strategies for long
- term energy flux data sets. Agricultural and Forest Meteorology, 107, 71-77, 2001.
- 727 Feigenwinter, C., Vogt, R., and Christen, A.: Eddy covariance measurements over urban areas. In Eddy
- 728 Covariance (pp. 377-397). Springer, Dordrecht, 2012.
- Feyisa, G. L., Dons, K., and Meilby, H.: Efficiency of parks in mitigating urban heat island effect: An example
- from Addis Ababa. Landscape and Urban Planning, 123, 87-95, 2014.
- 731 Fratini, G., Ibrom, A., Arriga, N., Burba, G., and Papale, D.: Relative humidity effects on water vapour fluxes
- 732 measured with closed path eddy covariance systems with short sampling lines. Agricultural and Forest
- 733 Meteorology, 165, 53-63, 2012.
- 734 Goldbach, A. and Kuttler, W.: Quantification of turbulent heat fluxes for adaptation strategies within urban
- planning. International Journal of Climatology, 33, 143-159, 2013.
- Goulden, M. L., Munger, J. W., Fan, S. M., Daube, B. C., and Wofsy, S. C.: Measurements of carbon sequestration
- by long-term eddy covariance: Methods and a critical evaluation of accuracy. Global Change Biology, 2(3), 169-
- 738 182, 1996.
- Grimmond, C. S. B. and Oke, T. R.: Comparison of heat fluxes from summertime observations in the suburbs of
- 740 <u>four North American cities. Journal of Applied Meteorology</u>, 34, 873-889, 1995.
- 741 <u>Grimmond, C. S. B. and Oke, T. R.: Aerodynamic properties of urban areas derived from analysis of surface form.</u>
- Journal of Applied Meteorology and Climatology, 38, 1262-1292, 1999.
- Haaland, C., and van Den Bosch, C. K.: Challenges and strategies for urban green-space planning in cities
- undergoing densification: A review. Urban forestry & Urban Greening, 14(4), 760-771, 2015.
- Hamada, S., and Ohta, T.: Seasonal variations in the cooling effect of urban green areas on surrounding urban
- 746 areas. Urban Forestry & Urban Greening, 9(1), 15-24, 2010.
- Hansen, J., Ruedy, R., Sato, M., and Lo, K.: Global surface temperature change. Reviews of Geophysics, 48(4),
- 748 2010.
- 749 Hsieh, C. I., Katul, G., and Chi, T. W.: An approximate analytical model for footprint estimation of scalar fluxes
- 750 in thermally stratified atmospheric flows. Advances in Water Resources, 23(7), 765-772, 2000.

- 751 Hiller, R. V., McFadden, J. P., and Kljun, N.: Interpreting CO<sub>2</sub> fluxes over a suburban lawn: the influence of
- traffic emissions. Boundary-Layer Meteorology, 138(2), 215-230, 2011.
- 753 Hong, J., and Kim, J.: Impact of the Asian monsoon climate on ecosystem carbon and water exchanges: a wavelet
- analysis and its ecosystem modeling implications. Global Change Biology, 17(5), 1900-1916, 2011.
- Hong, J., Kwon, H., Lim, J., Byun, Y., Lee, J., and Kim, J.: Standardization of KoFlux eddy-covariance data
- processing. Korean J. Agric. For. Meteorol., 11, 19-26, 2009.
- Hong, J., Takagi, K., Ohta, T., and Kodama, Y.: Wet surface resistance of forest canopy in monsoon Asia:
- 758 Implications for eddy-covariance measurement of evapotranspiration. Hydrological Processes, 28(1), 37-42, 2014.
- 759 Hong, J. W., Hong, J., Lee, S. E., and Lee, J.: Spatial distribution of urban heat island based on local climate zone
- of automatic weather station in Seoul metropolitan area. Atmosphere, 23(4), 413-424, 2013.
- 761 Hong, J. W., and Hong, J.: Changes in the Seoul metropolitan area urban heat environment with residential
- redevelopment. Journal of Applied Meteorology and Climatology, 55(5), 1091-1106, 2016.
- Hong, J. W., Hong, J., Kwon, E. E., and Yoon, D.: Temporal dynamics of urban heat island correlated with the
- socio-economic development over the past half-century in Seoul, Korea. Environmental Pollution, 254, 112934,
- 765 2019a.
- Hong, J.-W., Hong, J. Chun, J., Lee, Y., Chang, L., Lee, J., Yi, K., Park, Y., Byun, B., and Joo, S.: Comparative
- assessment of net CO<sub>2</sub> exchange across an urbanization gradient in Korea based on in situ observation, Carbon
- 768 Balance and Management, https://doi.org/10.1186/s13021-019-0128-6, 2019b.
- Hong, J. W., Lee, S. D., Lee, K., and Hong, J.: Seasonal variations in the surface energy and CO<sub>2</sub> flux over a high-
- 770 rise, high-population, residential urban area in the East Asian monsoon region. International Journal of
- 771 Climatology, https://doi.org/10.1002/joc.6463, 2020.
- Horst, T. W., and Lenschow, D. H.: Attenuation of scalar fluxes measured with spatially displaced sensors.
- 773 Boundary Layer Meteorology, 130(2), 275-300, 2009.
- 774
- 775 Hsieh, C. I., Katul, G., and Chi, T. W.: An approximate analytical model for footprint estimation of scalar fluxes
- in thermally stratified atmospheric flows. Advances in Water Resources, 23(7), 765-772, 2000.
- 777 Kennedy, C. A., Ibrahim, N., and Hoornweg, D.: Low-carbon infrastructure strategies for cities. Nature Climate
- 778 Change, 4(5), 343, 2014.
- Kent, C. W., Lee, K., Ward, H. C., Hong, J. W., Hong, J., Gatey, D., and Grimmond, S.: Aerodynamic roughness
- variation with vegetation: analysis in a suburban neighbourhood and a city park. Urban Ecosystems, 21(2), 227-
- 781 243, 2018.
- 782 Khatun, R., Ohta, T., Kotani, A., Asanuma, J., Gamo, M., Han, S., Hirano, T., Nakai, Y., Saigusa, N., Takagi, K.
- and Wang, H. (2011) Spatial variations in evapotranspiration over East Asian forest sites. I. Evapotranspiration
- and decoupling coefficient. Hydrological Research Letters, 5, 83-87, 2011.
- 785 Kim, Y., Woo, S.K., Park, S., Kim, M. and Han, D.: A Study on Evaluation Methodology of Greenhouse Gas and
- 786 Air Pollutant Emissions on Road Network Focusing on Evaluation Methodology of CO<sub>2</sub> and NOx Emissions
- from Road. Korea: The Korea Transport Institute (Annual Report), 2011.

- 788 Kirschbaum, M.U.F., Eamus, D., Gifford, R.M., Roxburgh, S.H. and Sands, P.J.: Definitions of some ecological
- terms commonly used in carbon accounting. In Net Ecosystem Exchange Workshop, 18-20, 2001.
- Kroeger, T., McDonald, R. I., Boucher, T., Zhang, P., and Wang, L.: Where the people are: Current trends and
- future potential targeted investments in urban trees for PM10 and temperature mitigation in 27 US cities.
- 792 Landscape and Urban Planning, 177, 227-240, 2018.
- Kordowski, K., and Kuttler, W.: Carbon dioxide fluxes over an urban park area. Atmospheric Environment, 44(23),
- 794 2722-2730, 2010.
- Kwon, H., Park, T. Y., Hong, J., Lim, J. H., and Kim, J.: Seasonality of Net Ecosystem Carbon Exchange Exchange
- 796 in Two Major Plant Functional Types in Korea. Asia-Pacific Journal of Atmospheric Sciences, 45(2), 149-163,
- 797 2009.
- 798 Lee, K. Energy, water and CO<sub>2</sub> exchanges in an artificially constructed urban forest, Master Degree Dissertation,
- 799 Yonsei University, Seoul, 2015.
- 800 Lee, K., Hong, J. W., Kim, J., and Hong, J.: Partitioning of net CO<sub>2</sub> exchanges at the city-atmosphere interface
- into biotic and abiotic components. MethodsX, 8, 101231, 2021.
- 802 Lietzke, B., Vogt, R., Feigenwinter, C., and Parlow, E.: On the controlling factors for the variability of carbon
- dioxide flux in a heterogeneous urban environment. International Journal of climatology, 35(13), 3921-3941, 2015.
- Macdonald, R. W., Griffiths, R. F., and Hall, D. J.: An improved method for the estimation of surface roughness
- of obstacle arrays. Atmospheric Environment, 32(11), 1857-1864, 1998.
- Mahecha, M. D., Reichstein, M., Carvalhais, N., Lasslop, G., Lange, H., Seneviratne, S. I., Vargas, R., Ammann,
- 807 C., Arain, M. A., Cescatti, A., Janssens, I., Migliavacca, M., Montagnani, L., and Richardson, A.: Global
- convergence in the temperature sensitivity of respiration at ecosystem level. Science, 329(5993), 838-840, 2010.
- 809 McCarthy, M. P., Best, M. J., and Betts, R. A.: Climate change in cities due to global warming and urban effects.
- 810 Geophysical Research Letters, 37(9), 2010.
- Menzer, O., and McFadden, J. P.: Statistical partitioning of a three-year time series of direct urban net CO<sub>2</sub> flux
- measurements into biogenic and anthropogenic components. Atmospheric Environment, 170, 319-333, 2017.
- 813 Moncrieff, J., Clement, R., Finnigan, J., and Meyers, T.: Averaging, detrending, and filtering of eddy covariance
- 814 time series. In Handbook of micrometeorology, Springer, Dordrecht, 2004.
- 815 Moriwaki, R., and Kanda, M.: Seasonal and diurnal fluxes of radiation, heat, water vapor, and carbon dioxide
- over a suburban area. Journal of Applied Meteorology, 43(11), 1700-1710, 2004.
- 817 Munger, J. W., Loescher, H. W., and Luo, H.: Measurement, tower, and site design considerations. In Eddy
- 818 Covariance (pp. 21-58). Springer, Dordrecht, 2012.
- Norton, B. A., Coutts, A. M., Livesley, S. J., Harris, R. J., Hunter, A. M., and Williams, N. S.: Planning for cooler
- 820 cities: A framework to prioritise green infrastructure to mitigate high temperatures in urban landscapes. Landscape
- and Urban Planning, 134, 127-138, 2015.
- 822 Nowak, D. J.: Atmospheric carbon reduction by urban trees. Journal of Environmental Management, 37(3), 207-
- 823 217, 1993.

- Nowak, D. J., Crane, D. E., Stevens, J. C., Hoehn, R. E., Walton, J. T., and Bond, J.: A ground-based method of
- 825 assessing urban forest structure and ecosystem services. Aboriculture and Urban Forestry. 34 (6): 347-358., 34(6),
- 826 2008.
- 827 Oke, T. R.: The energetic basis of the urban heat island. Quarterly Journal of the Royal Meteorological Society,
- 828 108(455), 1-24, 1982.
- 829 Oke, T. R.: The micrometeorology of the urban forest. Philosophical Transactions of the Royal Society of London.
- 830 B, Biological Sciences, 324(1223), 335-349, 1989.
- 831 Oke, T. R., Johnson, G. T., Steyn, D. G., and Watson, I. D.: Simulation of surface urban heat islands under 'ideal'
- conditions at night part 2: Diagnosis of causation. Boundary-Layer Meteorology, 56(4), 339-358, 1991.
- Oke, T.R., Mills, G., Christen, A., Voogt, J.A.: Urban Climates. Cambridge University Press, U.K., 2017.
- 834 Pastorello, G., Trotta, C., Canfora, E., Chu, H., Christianson, D., Cheah, Y. W., Poindexter, C., Chen,
- J., Elbashandy, A., Humphrey, M., Isaac, P., Polidori, D., Ribeca, A., van Ingen, C., Zhang, L., Amiro,
- B., Ammann, C., Arain, M.A., Ardö, J., Arkebauer, T., Arndt, S.K., Arriga, N., Aubinet, M., Aurela,
- 837 M., Baldocchi, D., Barr, A., Beamesderfer, E., Marchesini, L.B., Bergeron, O., Beringer, J., Bernhofer,
- 838 C., Berveiller, D., Billesbach, D., Black, T.A., Blanken, P.D., Bohrer, G., Boike, J., Bolstad, P.V., Bonal,
- D., Bonnefond, J.-M., Bowling, D.R., Bracho, R., Brodeur, J., Brümmer, C., Buchmann, N., Burban, B., Burns,
- 840 S.P., Buysse, P., Cale, P., Cavagna, M., Cellier, P., Chen, S., Chini, I. Christensen, T.R., Cleverly, J., Collalti,
- A., Consalvo, C., Cook, B.D., Cook, D., Coursolle, C., Cremonese, E., Curtis, P.S., D'Andrea, E., da Rocha,
- 842 H., Dai, X., Davis, K.J., De Cinti, B., de Grandcourt, A., De Ligne, A., De Oliveira, R.C., Delpierre, N., Desai,
- A.R., Di Bella, C.M., di Tommasi, P., Dolman, H., Domingo, F., Dong, G., Dore, S., Duce, P., Dufrêne, E., Dunn,
- A., Dušek, J., Eamus, D., Eichelmann, U., ElKhidir, H.A.M., Eugster, W., Ewenz, C.M., Ewers, B., Famulari,
- D., Fares, S., Feigenwinter, I., Feitz, A., Fensholt, R., Filippa, G., Fischer, M., Frank, J., Galvagno, M., Gharun,
- 846 M., Gianelle, D., Gielen, B., Gioli, B., Gitelson, A., Goded, I., Goeckede, M., Goldstein, A.H., Gough,
- 847 C.M., Goulden, M.L., Graf, A., Griebel, A., Gruening, C., Grünwald, T., Hammerle, A., Han, S., Han,
- X., Hansen, B.U., Hanson, C., Hatakka, J., He, Y., Hehn, M., Heinesch, B., Hinko-Najera, N., Hörtnagl,
- L., Hutley, L., Ibrom, A., Ikawa, H., Jackowicz-Korczynski, M., Janouš, D., Jans, W., Jassal, R., Jiang, S., Kato,
- T., Khomik, M., Klatt, J., Knohl, A., Knox, S., Kobayashi, H., Koerber, G., Kolle, O., Kosugi, Y., Kotani,
- 851 A., Kowalski, A., Kruijt, B., Kurbatova, J., Kutsch, W.L., Kwon, H., Launiainen, S., Laurila, T., Law,
- B., Leuning, R., Li, Y., Liddell, M., Limousin, J.-M., Lion, M., Liska, A.J., Lohila, A., López-Ballesteros,
- A., López-Blanco, E., Loubet, B., Loustau, D., Lucas-Moffat, A., Lüers, J., Ma, S., Macfarlane, C., Magliulo,
- V., Maier, R., Mammarella, I., Manca, G., Marcolla, B., Margolis, H.A., Marras, S., Massman, W., Mastepanov,
- 855 M., Matamala, R., Matthes, J.H., Mazzenga, F., McCaughey, H., McHugh, I., McMillan, A.M.S., Merbold,
- 856 L., Meyer, W., Meyers, T., Miller, S.D., Minerbi, S., Moderow, U., Monson, R.K., Montagnani, L., Moore,
- 857 C.E., Moors, E., Moreaux, V., Moureaux, C., Munger, J.W., Nakai, T., Neirynck, J., Nesic, Z., Nicolini,
- 858 G., Noormets, A., Northwood, M., Nosetto, M., Nouvellon, Y., Novick, K., Oechel, W., Olesen, J.E., Ourcival,
- 859 J.-M., Papuga, S.A., Parmentier, F.-J., Paul-Limoges, E., Pavelka, M., Peichl, M., Pendall, E., Phillips,
- 860 R.P., Pilegaard, K., Pirk, N., Posse, G., Powell, T., Prasse, H., Prober, S.M., Rambal, S., Rannik, Ü., Raz-Yaseef,
- N., Reed, D., de Dios, V.R., Restrepo-Coupe, N., Reverter, B.R., Roland, M., Sabbatini, S., Sachs, T., Saleska,

- 862 S.R., Sánchez-Cañete, E.P., Sanchez-Mejia, Z.M., Schmid, H.P., Schmidt, M., Schneider, K., Schrader,
- 863 F., Schroder, I., Scott, R.L., Sedlák, P., Serrano-Ortíz, P., Shao, C., Shi, P., Shironya, I., Siebicke, L., Šigut,
- L., Silberstein, R., Sirca, C., Spano, D., Steinbrecher, R., Stevens, R.M., Sturtevant, C., Suyker, A., Tagesson,
- T., Takanashi, S., Tang, Y., Tapper, N., Thom, J., Tiedemann, F., Tomassucci, M., Tuovinen, J.-P., Urbanski,
- 866 S., Valentini, R., van der Molen, M., van Gorsel, E., van Huissteden, K., Varlagin, A., Verfaillie, J., Vesala,
- T., Vincke, C., Vitale, D., Vygodskaya, N., Walker, J.P., Walter-Shea, E., Wang, H., Weber, R., Westermann,
- 868 S., Wille, C., Wofsy, S., Wohlfahrt, G., Wolf, S., Woodgate, W., Li, Y., Zampedri, R., Zhang, J., Zhou, G., Zona,
- 869 D., Agarwal, D., Biraud, S., Torn, M., and Papale, D.: The FLUXNET2015 dataset and the ONEFlux processing
- pipeline for eddy covariance data. Scientific Data, 7(1), 1-27, 2020.
- 871 Pataki, D. E., Bowling, D. R., and Ehleringer, J. R.: Seasonal cycle of carbon dioxide and its isotopic composition
- in an urban atmosphere: Anthropogenic and biogenic effects. Journal of Geophysical Research: Atmospheres, 108,
- 873 D23, https://doi.org/10.1029/2003JD003865, 2003.
- Peters, E. B., and McFadden, J. P.: Continuous measurements of net CO<sub>2</sub> exchange by vegetation and soils in a
- 875 suburban landscape. Journal of Geophysical Research: Biogeosciences, 117, G3,
- 876 https://doi.org/10.1029/2011JG001933, 2012.
- Piao, S., Luyssaert, S., Ciais, P., Janssens, I. A., Chen, A., Cao, C., Fang, J., Friedlingstein, P., Luo, Y., and Wang,
- 878 S.: Forest annual carbon cost: A global-scale analysis of autotrophic respiration. Ecology, 91(3), 652-661, 2010.
- 879 Rahmstorf, S., and Coumou, D.: Increase of extreme events in a warming world. Proceedings of the National
- 880 Academy of Sciences, 108(44), 17905-17909, 2011.
- 881 Randerson, J.T., Chapin Iii, F.S., Harden, J.W., Neff, J.C. and Harmon, M.E.: Net ecosystem production: a
- comprehensive measure of net carbon accumulation by ecosystems. Ecological Applications, 12(4), 937-947,
- 883 2002.
- Raupach, M. R., Antonia, R. A., and Rajagopalan, S.: Rough-wall turbulent boundary layers, Applied Mechanics
- 885 Reviews, 44(1), 1-25, 1991.
- Rowntree, R. A., and Nowak, D. J.: Quantifying the role of urban forests in removing atmospheric carbon dioxide.
- 887 Journal of Arboriculture. 17 (10): 269-275., 17(10), 1991.
- 888 Roy, S., Byrne, J., and Pickering, C.: A systematic quantitative review of urban tree benefits, costs, and assessment
- methods across cities in different climatic zones. Urban Forestry and Urban Greening, 11(4), 351-363, 2012.
- 890 Schmid, H. P., Grimmond, C. S. B., Cropley, F., Offerle, B., and Su, H. B.: Measurements of CO<sub>2</sub> and energy
- 891 fluxes over a mixed hardwood forest in the mid-western United States. Agricultural and Forest Meteorology,
- 892 103(4), 357-374, 2000.
- 893 Schmid, H. P., Su, H. B., Vogel, C. S., and Curtis, P. S.: Ecosystem-atmosphere exchange of carbon dioxide over
- a mixed hardwood forest in northern lower Michigan. Journal of Geophysical Research: Atmospheres, 108(D14),
- 895 2003.
- 896 Shashua-Bar, L., and Hoffman, M. E.: Vegetation as a climatic component in the design of an urban street: An
- 897 empirical model for predicting the cooling effect of urban green areas with trees. Energy and Buildings, 31(3),
- 898 221-235, 2000.

- 899 Shim, C., J. Hong, J. Hong, Y. Kim, M. Kang, B. Thakuri, Y. Kim, J. Chun: Evaluation of MODIS GPP over a
- 900 complex ecosystem in East Asia: A case of Gwangneung flux tower in Korea, Advances in Space Research, 54,
- 901 2296-2308, 2014.
- 902 Spronken-Smith, R. A., Oke, T. R., and Lowry, W. P.: Advection and the surface energy balance across an
- 903 irrigated urban park. International Journal of Climatology: A Journal of the Royal Meteorological Society, 20(9),
- 904 1033-1047. 2000.
- 905 Stagakis, S., Chrysoulakis, N., Spyridakis, N., Feigenwinter, C., and Vogt, R.: Eddy Covariance measurements
- and source partitioning of CO<sub>2</sub> emissions in an urban environment: Application for Heraklion, Greece.
- 907 Atmospheric Environment, 201, 278-292, 2019.
- 908 Stewart, I. D.: A systematic review and scientific critique of methodology in modern urban heat island literature.
- 909 International Journal of Climatology, 31(2), 200-217, 2011.
- 910 Stewart, I. D., and Oke, T. R.: Local climate zones for urban temperature studies. Bulletin of the American
- 911 Meteorological Society, 93(12), 1879-1900, 2012.
- Stoy, P. C., Katul, G. G., Siqueira, M. B., Juang, J. Y., Novick, K. A., Uebelherr, J. M., and Oren, R.: An evaluation
- of models for partitioning eddy covariance-measured net ecosystem exchange into photosynthesis and respiration.
- 914 Agricultural and Forest Meteorology, 141(1), 2-18, 2006.
- 915 Suyker, A.E. and Verma, S.B.: Interannual water vapor and energy exchange in an irrigated maize-based
- agroecosystem. Agricultural and Forest Meteorology, 148, 417-427, 2008.
- Takanashi, S., Kosugi, Y., Tanaka, Y., Yano, M., Katayama, T., Tanaka, H., and Tani, M., CO<sub>2</sub> exchange in a
- 918 temperate Japanese cypress forest compared with that in a cool-temperate deciduous broad-leaved forest.
- 919 Ecological Research, 20(3), 313-324, 2005.
- 920 Ueyama, M., and Ando, T.: Diurnal, weekly, seasonal, and spatial variabilities in carbon dioxide flux in different
- 921 urban landscapes in Sakai, Japan. Atmospheric Chemistry and Physics, 16(22), 14727-14740, 2016.
- 922 United Nations, Department of Economic and Social Affairs, Population Division: World Urbanization Prospects:
- The 2018 Revision (ST/ESA/SER.A/420). New York: United Nations, 2019.
- 924 Velasco, E., and Roth, M.: Cities as net sources of CO<sub>2</sub>: Review of atmospheric CO<sub>2</sub> exchange in urban
- 925 environments measured by eddy covariance technique. Geography Compass, 4(9), 1238-1259, 2010.
- 926 Velasco, E., Roth, M., Tan, S. H., Quak, M., Nabarro, S. D. A., and Norford, L.: The role of vegetation in the
- 927 CO<sub>2</sub> flux from a tropical urban neighbourhood, Atmospheric Chemistry and Physics, 13, 10185–10202,
- 928 https://doi.org/10.5194/acp-13-10185-2013, 2013.
- 929 Velasco, E., Roth, M., Norford, L., and Molina, L. T.: Does urban vegetation enhance carbon sequestration?,
- 930 Landscape and Urban Planning, 148, 99-107, 2016.
- 931 Vickers, D., and Mahrt, L.: Quality control and flux sampling problems for tower and aircraft data. Journal of
- 932 Atmospheric and Oceanic Technology, 14(3), 512-526, 1997.
- 933 Wang, L., Lee, X., Schultz, N., Chen, S., Wei, Z., Fu, C., Gao, Y., Yang, Y, and Lin, G.: Response of surface
- 934 temperature to afforestation in the Kubuqi Desert, Inner Mongolia. Journal of Geophysical Research:
- 935 Atmospheres, 123, 948-964, 2018.

- Ward, H. C., Evans, J. G., and Grimmond, C. S. B.: Multi-season eddy covariance observations of energy, water
- and carbon fluxes over a suburban area in Swindon, UK. Atmospheric Chemistry and Physics, 13(9), 4645-4666,
- 938 2013.

- Ward, H. C., Kotthaus, S., Grimmond, C. S. B., Bjorkegren, A., Wilkinson, M., Morrison, W. T. J., Evans, J. G.,
- 940 Morison, J. I. L.m and Iamarino, M.: Effects of urban density on carbon dioxide exchanges: Observations of dense
- 941 urban, suburban and woodland areas of southern England. Environmental Pollution, 198, 186-200, 2015.
- Weissert, L. F., Salmond, J. A., and Schwendenmann, L.: A review of the current progress in quantifying the
- potential of urban forests to mitigate urban CO<sub>2</sub> emissions. Urban Climate, 8, 100-125, 2014.
- York D., Evensen N., Martinez M., and Delgado J.: Unified equations for the slope, intercept, and standard errors
- of the best straight line. American Journal of Physics, 72(3), 367-375, 2004.
- Yu, C., and Hien, W. N.: Thermal benefits of city parks. Energy and Buildings, 38(2), 105-120, 2006.

Table 1. Details of the stations used in this study.

Sites	Location	LCZLocal climate zone	Height [m]Measurement height (m)
Eddy covariance station			
SFP (Seoul Forest Park)	37.5446°N, 127.0379°E	Dense tree (LCZ <sub>A</sub> )	12.2
EP (Eunpyeong)	37.6350°N, 126.9287°E	Compact highrise (LCZ <sub>1</sub> )	30
Automatie weather Weather station			
SD (Seongdong)	37.5472°N, 127.0389°E	Open midrise and scatted trees (LCZ <sub>5B</sub> )	25
AVG CBD		Compact midrise and highrise	<del>59</del>
(Gangnam)	37.5134°N, 127.0467°E	(LCZ <sub>21</sub> )	<del>35.5</del>
(Seocho)	37.4889°N, 127.0156°E	$\frac{\text{LCZ}_{21}}{\text{LCZ}_{21}}$	<del>58.2</del> 20
· · · · · · · · · · · · · · · · · · ·	37.5115°N, 127.0967°E	LCZ <sub>15</sub> Compact highrise and	<u>13</u>
(Songpa)		open midrise (LCZ <sub>15</sub> )	<u>43</u>
Aerodrome meteorologica	al observation station		
GP (Gimpo)	37.5722°N, 126.7751°E	Low plants (LCZ <sub>D</sub> )	<del>11.4</del> <u>1.5</u>

Table 2. Gap filled annual budgets for surface energy fluxes Daytime Bowen ratio ( $\beta = Q_H/Q_E$ ) in summer at the SFP and precipitation (Pother urban sites of the similar vegetation cover fraction ( $\lambda_{\nu}$ ).

Site name	<u>B</u>	<u> 2</u> v	References
<u>SFP</u>	0.56	0.57	this study
Sites Basel-Sperrstrasse	<del>Q</del> #	₽E	<i>Q</i> *
	<del>(MJ-m</del> <sup>-</sup> 2) <u>.5</u>	<del>(MJ m<sup>-2</sup>)</del> 0.16	(MJ m <sup>-2</sup> )Christen and Vogt (2004)
Basel-Spalenring	2.3	0.32	Christen and Vogt (2004)
Tucson	1.8	0.42	Grimmond and Oke (1995)
Sacramento	1.4	0.42	Grimmond and Oke (1995)
Chicago	0.8	0.44	Grimmond and Oke (1995)
Los Angeles	<u>1.4</u>	<u>0.41</u>	Grimmond and Oke (1995)
Kansas City	0.48	0.58	Balogun et al. (2009)
Oberhausen-suburban	0.36	0.69	Goldbach and Kuttler (2013)

Table 3. Gap-filled annual budgets for surface energy fluxes and precipitation (P).

	<u>ET</u> (mm)	<u>Он</u> (MJ m <sup>-2</sup> )	<u>QE</u> (MJ m <sup>-2</sup> )	<u>Q*</u> (MJ m <sup>-2</sup> )	<u>P</u> (mm)
1 <sup>st</sup> year (2013.06 – 2014.05)	367	726	896	1797	1256
2 <sup>nd</sup> year (2014.06 – 2015.05)	320	867	781	1848	932
Mean annual sum of two-year	344	797	839	1823	1094

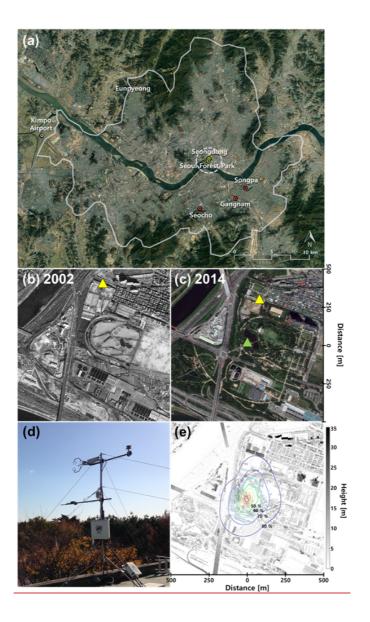
Table 34. Gap-filled annual budgets for  $F_C$  (observed by EC measurement) and its components, indicating ecosystem respiration (RE), photosynthetic uptake by vegetation (GPP), vehicle emissions ( $E_R$ ), and building emissions ( $E_B$ ). All fluxes are in kg CO<sub>2</sub> m<sup>-2</sup> year<sup>-1</sup>.

Sites	<u>Fc</u>	<u>RE</u>	<u>GPP</u>	$\underline{E}_R$	$\underline{E}_{B}$
1 <sup>st</sup> year (2013.06 – 2014.05)	<u>6.6</u>	<u>5.1</u> (77%)	4.7 (70%)	<u>5.4</u> (81%)	1.0 (15%)
2 <sup>nd</sup> year (2014.06 – 2015.05)	<u>7.6</u>	<u>5.0</u> (65%)	4.5 (59%)	<u>5.4</u> (71%)	1.9 (25%)
Mean annual sum of two-year	7.1	<u>5.1</u> (71%)	4.6 (64%)	<u>5.4</u> (76%)	1.5 (20%)

Table 45. Annual budgets of biogenic  $F_C$  components and ratios in deciduous broadleaf forests in similar climatic conditions reported in previous studies. All fluxes are in kg CO<sub>2</sub> m<sup>-2</sup> year<sup>-1</sup>.

Sites Site name	Reference	MAT (°C)	MAP (mm)	maximum LAI	RE	GPP	NBE	RE/GPP
Seoul Forest Park	This study	13.9	1094	1.6	5.1	4.6	+0.5	1.11
Nagoya urban forest	Awal et al.	15.9	1680	5.5	4.9	6.2	-1.3	0.74
Toyota rural forest	(2010)	14.5	1518	4.5	2.6	4.6	-2.0	0.56
Gwangneung deciduous forest	Kwon et al. (2010)	12.8	1487	5	3.8	4.1	-0.3	0.93
Kiryu Experimental Watershed	Takanashi et al. (2005)	14.1	1309	5.5	3.9	5.6	-1.7	0.70
FLUXNET2015 dataset*	Pastorello et al. (2020)	14.5	1113		4.1	6.0	-1.9	0.68

<sup>\*</sup>Average value of 8-year data from 4 sites having mean annual temperature (MAT) of 12-16°C, mean annual precipitation (MAP) of 900-2000 mm.



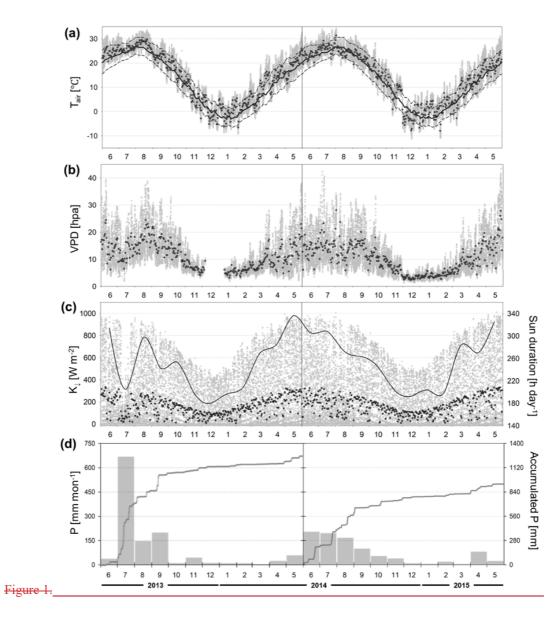


Figure 1. Site descriptions. (a) Location of the stations in Seoul (modified from map data © Google Earth 2019), (b) aerial photographs around Seoul Forest Park (SFP) in 2002 before the creation of the park and (c) in 2014 during the observation period (SFP; green triangle, SD; yellow triangle), (d) photograph of the SFP station, and (e) footprint climatology (Hsieh et al., 2000) with the height of surrounding obstacles around the SFP station.

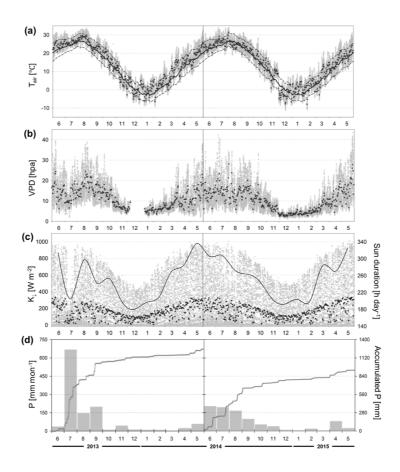
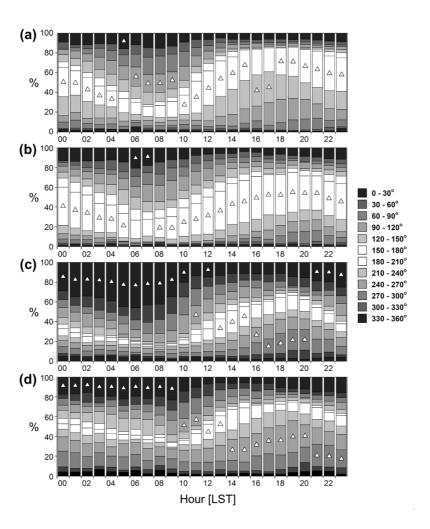


Figure 2. Climatic conditions of the SFP for two years from June 2013 to May 2015: 30-min ( $gray \ dots$ ) and daily mean ( $black \ dots$ ) (a) air temperature with 30-year normal values of Seoul (daily mean;  $solid \ line$ , min and max;  $dashed \ lines$ ), (b) vapor pressure deficit (VPD) and missing data existing on December 2013, (c) downward shortwave radiation ( $K_{\downarrow}$ ) and monthly averaged sunshine duration per day ( $black \ line$ ), (d) monthly precipitation ( $gray \ bars$ ) and yearly accumulated precipitation ( $solid \ line$ ).



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<u>Figure 2. Wind roses with seasons</u>: (a) spring (b) summer (c) autumn (d) winter. <del>The white triangle indicates the dominant wind direction during that hour.</del>

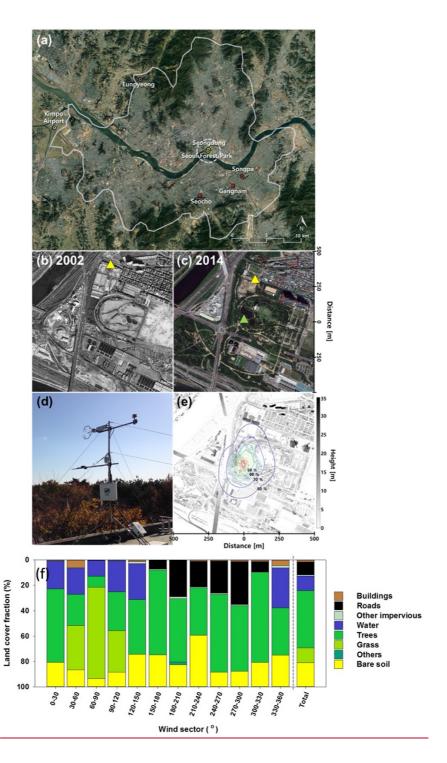
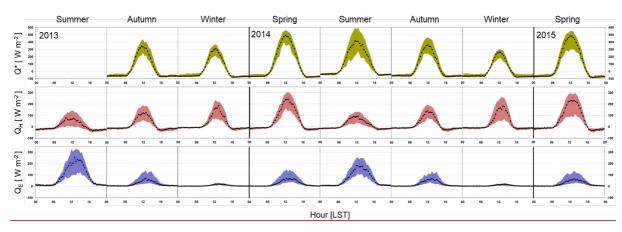


Figure 3. Site descriptions. (a) Location of the stations in Seoul (modified from map data © Google Earth 2019), (b) aerial photographs around Seoul Forest Park (SFP) in 2002 before the creation of the park and (c) in 2014 during the observation period (SFP; green triangle, SD; yellow triangle), (d) photograph of the SFP station,



(e) footprint climatology (Hsieh et al., 2000) with the height of surrounding obstacles around the SFP station, and (f) land cover fraction within a 150 m radius around a flux tower.

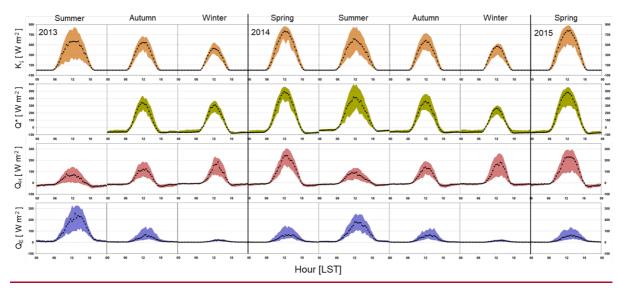


Figure 4. Diurnal variations of surface energy fluxes. Seasonal median diurnal variations (*points*) and interquartile ranges (*shaded*) of 30-min downward shortwave radiation ( $K_{\perp}$ ), net radiation ( $Q^*$ ), sensible heat flux ( $Q_H$ ), and latent heat flux ( $Q_E$ ), and net radiation ( $Q^*$ ) for two years. Since the net radiation system was installed in September 2013, there was no  $Q^*$  value in the first summer.

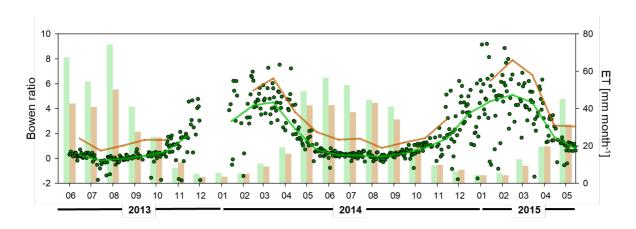
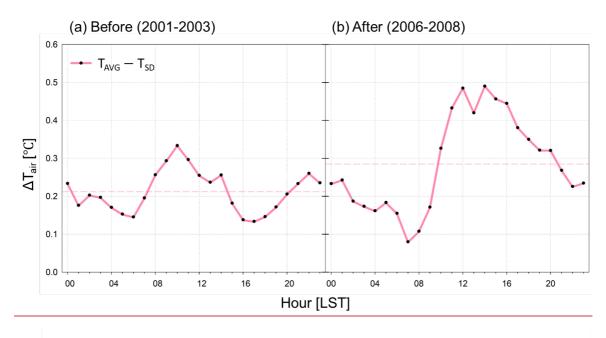


Figure 5. Daily Bowen ratio ( $\beta = \sum Q_H / \sum Q_E$ ; *dots*), monthly Bowen ratio (*lines*), and gap-filled monthly evapotranspiration (ET; *bars*) for two years (SFP; *green*, EP; *brown*).



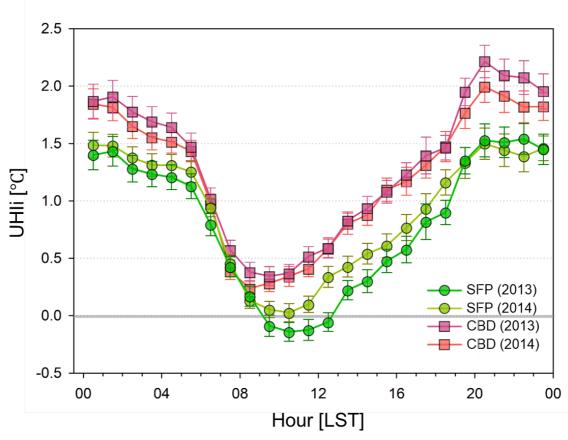


Figure 6. <u>Hourly mean diurnal variation of the urban heat island intensity (UHIi) of the SFP and CBD in the summer of 2013 and 2014.</u> The error bars represent standard errors.

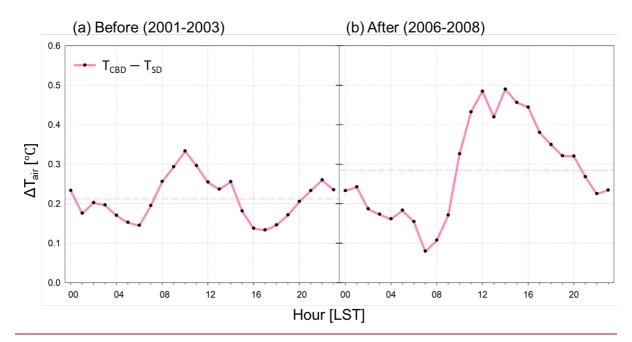


Figure 7. Mean diurnal pattern of air temperature difference ( $\Delta T_{air}$ ) between AVGCBD and SD in summer (a) before and (b) after the construction of the park-in summer. AVG. CBD indicates an average of three automatic weather stations (Gangnam, Seocho, Songpa) in Seoul. The red dash line indicates the mean  $\Delta T_{air}$  before and after the construction of the park-

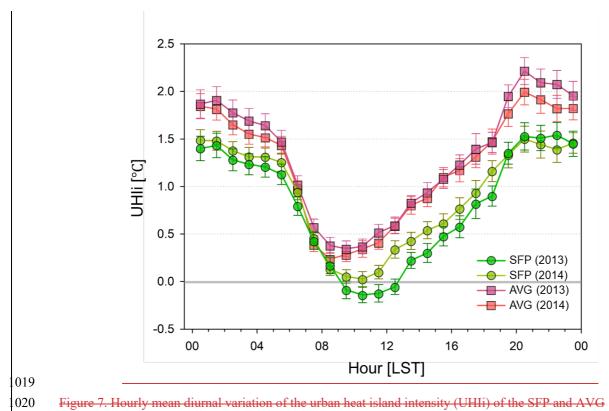
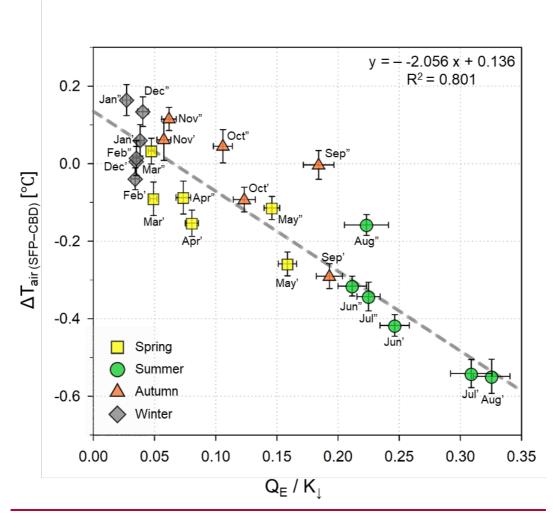


Figure 7. Hourly mean diurnal variation of the urban heat island intensity (UHIi) of the SFP and AVG





in the summer of 2012 and 2014. The arrow here represent standard arrows



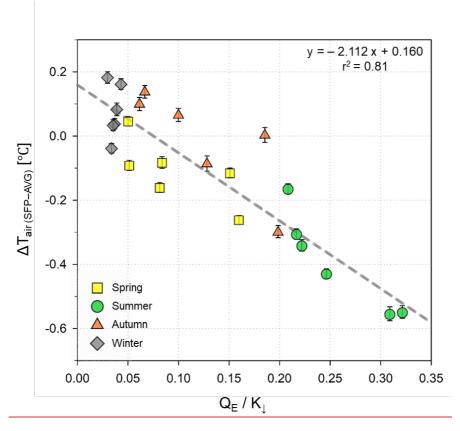


Figure 8. Relationship between the ratio of monthly  $Q_E$  to  $K_{\downarrow}$  and mean air temperature difference between SFP and AVGCBD during the daytime ( $K_{\downarrow} > 120 \text{ W m}^{-2}$ ) for two years. The quotation and double-quotation marks on the scatter indicate the first and second year of the observation period, respectively. The error bars represent standard errors-based on daily values, and the grey dotted line is calculated using linear regression model considering errors in both axes (York et al., 2004).

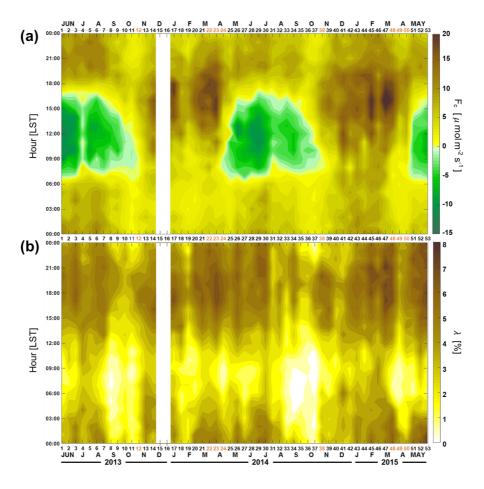
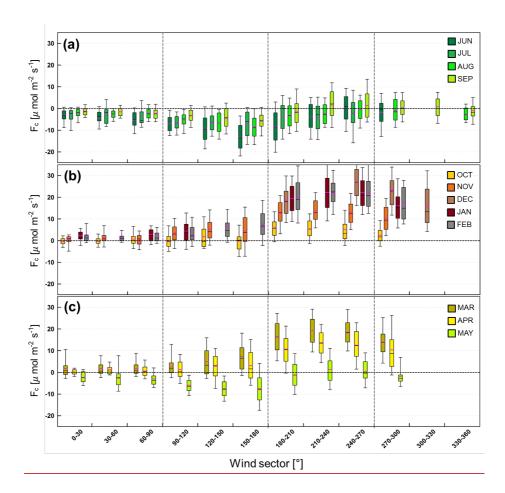


Figure 9. (a) Temporal variation of hourly averaged  $F_C$  and (b) source area-footprint-weighted road fraction ( $\lambda$ ) for as every two-week. The horizontal average (x-axis-indicates: the order of every two-week for two years, and the vertical date, y-axis is the: time of day-). In December 2013, there was a gap for approximately 4 weeks due to the power system failure. The yellow numbers in x-axis indicate the two-week ( $12^{th}$ ,  $22^{nd}$   $24^{th}$ ,  $38^{th}$ , and  $48^{th}$   $50^{th}$ ) having the transition period when the observed  $F_C$  is primarily attributable to traffic emissions ( $E_R$ )-contributes to the observed  $F_C$  significantly.



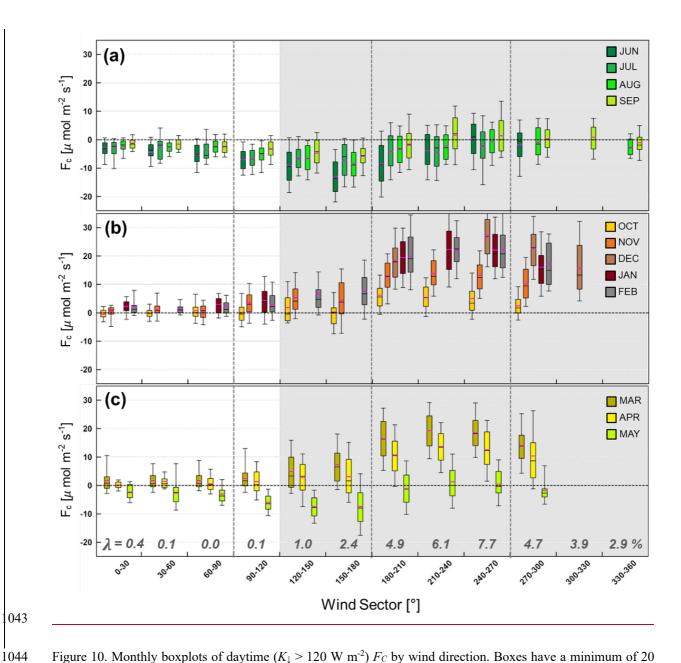


Figure 10. Monthly boxplots of daytime ( $K_{\downarrow} > 120 \text{ W m}^{-2}$ )  $F_C$  by wind direction. Boxes have a minimum of 20 samples. Box limits are upper and lower quartiles, and whiskers are distances of 1.5 times the interquartile range from each quartile. Median and mean values are indicated by the black and pink horizontal lines. The average source area weighted road fractions ( $\lambda$ ) are shown below the graph, and wind sectors with  $\lambda$  greater than 1% are shaded in gray.

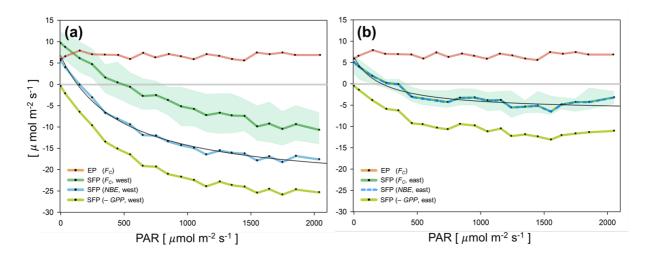


Figure 11. During the growing season (June–August 2013, 2014), when  $E_B$  is negligible, light-response curves as a function of photosynthetically active radiation (PAR, in bins of 100  $\mu$ mol m<sup>-2</sup> s<sup>-1</sup>): (a) for the western sectors (150° <  $\Phi$  < 300°) and (b) for the eastern sectors (30° <  $\Phi$  < 90°). Black line is a rectangular hyperbolic equation fitting net biome exchange ( $NBE = RE - GPP = F_C - E_R$ ) to PAR, and EP (*brown line*) is a light-response curve for the high-rise high-population residential area in Seoul. The shaded areas indicate interquartile range.

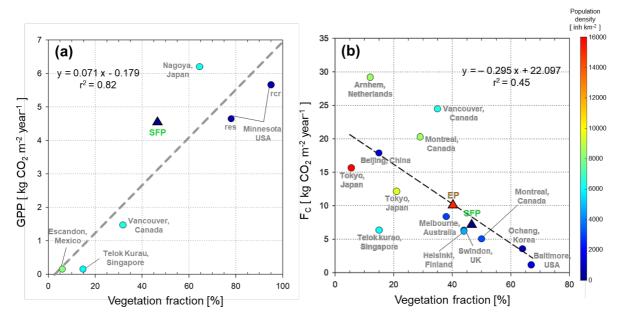
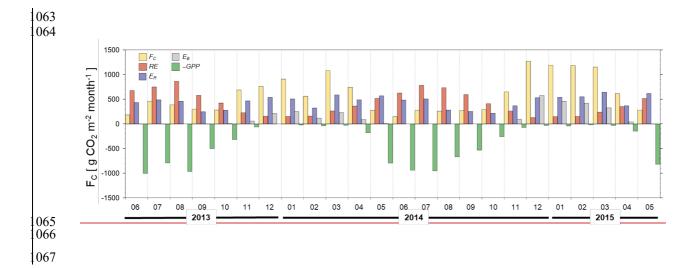


Figure 12. Relationship between vegetation fraction (a) annual GPP and (b) annual  $F_C$  in urban sites (Fig. 12a in Hong et al., 2019b). Dashed line in (a) and (b) indicates a linear regression of GPP in urban sites from Awal et al. (2010), Crawford and Christen (2015), Velasco et al. (2016), and Menzer and McFadden (2017) and NEE from Hong et al. (2019b) and references therein scaled with vegetation fraction, respectively. See main texts for more information.



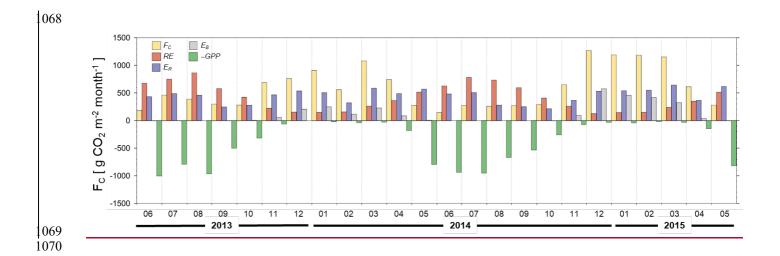


Figure 13. Monthly sums for gap-filled  $F_C$  (*yellow bar*) with RE (*red bar*),  $E_R$  (*blue bar*),  $E_B$  (*gray bar*), and – GPP (*green bar*)