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# Cool Roofs in Guangzhou, China: Outdoor Air Temperature Reductions During Heat Waves and Typical Summer Conditions

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1	Cool Roofs in Guangzhou, China: Outdoor Air
2	Temperature Reductions During Heat Waves and Typical
3	Summer Conditions
4 5 6 7	Meichun Cao <sup>1</sup> , Pablo Rosado <sup>2</sup> , Zhaohui Lin <sup>1</sup> , Ronnen Levinson <sup>2</sup> , and Dev Millstein <sup>2</sup> *
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9	
10	Abstract
11	In this paper we simulate temperature reductions during heat-wave events and during
12	typical summer conditions from the installation of highly reflective "cool" roofs in the
13	Chinese megacity, Guangzhou. We simulate temperature reductions during six of the
14	strongest historical heat-waves events over the past decade, finding average urban
15	midday temperature reductions of 1.2 °C. In comparison, we simulate 25 typical
16	summer weeks between 2004 and 2008, finding average urban midday temperature
17	reductions of 0.8 °C, indicating that air temperature sensitivity to urban albedo in
18	Guangzhou varies strongly based on meteorological conditions. We find that roughly
19	three-fourths of the variance in air temperature reductions across all episodes can be
20	accounted for by a linear regression including only three basic properties related to
21	the meteorological conditions: mean daytime temperatures, humidity, and ventilation
22	to the greater Guangzhou urban area. While these results highlight the potential for
23	cool roofs to mitigate peak temperatures during heat waves, the temperature
24	reductions reported here are based on the upper bound case where all roofs are
25	modified to be more reflective (but does not include changes to road or wall
26	reflectivity).

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#### 28 TOC/Abstract Art.



30

#### 31 1 Introduction

32 Increasing the solar reflectance (albedo) of roofs can cool buildings, reducing air 33 conditioning use, 1'2'3'4 and lower city-wide outdoor air temperatures. 5'6'7'8'9'10 34 From a global perspective, increasing the average albedo of existing urban areas 35 (roughly 2% of total land area)11 is studied as a potential strategy to partially 36 counteract climate change by reducing the net radiation absorbed by the 37 Earth.12<sup>,</sup>13<sup>,</sup>14<sup>,</sup>15<sup>,</sup>16 Furthermore, meteorological modeling of North America 38 indicates that urban expansion alone, in the absence of adaptations to reduce heat gain, 39 may cause regional temperature increases that are similar in magnitude to greenhouse gas driven warming.17 To encourage adoption of high-albedo ("cool") roofs, a 40 41 number of state and local governments around the world are considering or already 42 mandate the use of cool roofing materials for certain building types.18,19,20 Since 43 2010 the governments of the United States and China have been coordinating building 44 energy efficiency research efforts within the U.S.-China Clean Energy Research 45 Center Building Energy Efficiency (CERC-BEE) Consortium.21 As a product of this 46 joint effort, we explore the potential for reflective roofs to cool Guangzhou, one of the 47 most populous urban areas in southern China. Related work from CERC-BEE 48 investigated the building energy use implications of switching to cool roofs across 49 various regions in China.20

50

In China, mitigation of urban heat islands could benefit the large population living in
cities with hot summers. Despite this potential benefit, only a limited number of
studies have simulated air temperature reductions due to the deployment of cool roofs

in cities in China. For example Wang et al22 and Ma et al23 simulated the potential
for cool roofs to mitigate heat-wave events in Beijing. Li et al24 explored synergies
between urban heat islands and heat waves in Beijing and explicitly recommended
studying white and green roofs as a mitigation strategy.

58

59 In general, heat waves can pose significant public health problems.25 Additionally, 60 electricity grids are typically under the most stress during heat waves.26'27 In 61 southern China Yang et al.28 found that a 2005 heat wave had a significant impact on 62 mortality rates in Guangzhou. In summer, southern China is located between the 63 Western Pacific subtropical high and the Inter-Tropical Convergence Zone, and the 64 climate is often influenced by tropical weather systems such as typhoons. High 65 temperature events in this region are primarily caused by the adiabatic compression 66 heating of the downdraft in west of the typhoon periphery and are occasionally caused 67 from subtropical high subsidence airflow.29

68

69 In the U.S. and Europe many studies have evaluated potential air temperature 70 reductions as a result of cool roof deployment by modeling a single brief (2 - 4 day)71 episode, often an unusually hot episode. A logical follow up question: Are the 72 temperature reductions found during a single hot episode representative of 73 temperature reductions that would be found over a whole season? Taha30 simulated 74 the effects of increased albedo across a range of meteorological conditions associated 75 with varying ozone conditions in central and southern California, but did not find 76 strong correlation between daily maximum temperatures and simulated temperature 77 reductions. Mihalakakou et al.31, however, found that synoptic conditions strongly 78 determined the heat island intensity in Athens, Greece, and Zhao et al.32 found that 79 the intensity of urban warming depends on local background climate in cities across 80 the United States.

81

82 This paper breaks new ground on two fronts. It is one of a limited number of studies
83 to evaluate potential air temperature reductions from cool roof deployment in Chinese
84 cities. It is also the first study to directly compare the potential air temperature

85 reductions during historic Southern China heat-wave events to the potential air

temperature reductions during typical summer time periods. To make this comparison

- 87 we model six of the strongest historical heat waves in Southern China over the past
- decade, as well as 25 randomly sampled summer weeks between 2004 and 2008.
- 89

90 Finally, the scope of this paper is limited to modeling the meteorological effects of 91 cool roofs. The combination of air temperature reductions and reduced boundary layer 92 height, commonly found when simulating cool roof adoption, can have either positive 93 or negative impacts on air quality depending on the local meteorological conditions 94 and the relative concentrations of air pollutants.33 We leave for future research the 95 necessary emission and air quality modeling required to accurately assess the 96 potential air quality impacts of cool roofs.

97

#### 98 2 Methods

#### 99 2.1 Modeling setup

100 Meteorological simulations were performed using the Weather Research and 101 Forecasting model, WRF version 3.6.34 A triple-nested domain was used (Fig. 1), 102 with grid resolutions of 36-, 12-, and 4-km. The outermost domain, centered at  $23.17^{\circ}$ N and  $113.33^{\circ}$ E, with horizontal dimensions of 2520 km × 2520 km and 103 104 individual grid cells with 36 km horizontal resolution, encompasses the hot summer 105 and cold winter regions of southern China.35 The intermediate domain provides a 106 resolution of 12 km and covers an area of 840 km × 840 km. The innermost domain 107 covers a 316 km  $\times$  280 km area and resolves the Guangzhou megacity area and the local surrounding hills in high resolution (4 km). Figure 1 shows the ground elevation 108 109 across the three nested domains, and a close up view of the inner most domains. The 110 vertical grid contains 38 levels from the surface to 50 hPa, of which the lowest 7 levels are below 1 km to show a finer resolution in the planetary boundary layer. Each 111 112 modeling episode was run with a single day of spin-up time. 113

- 114
- 115





Figure 1. (a) Elevation map showing the two-way triple-nested simulation domains and the terrain height above sea level (m) in each domain: the two rectangles are the intermediate and inner domain, respectively. (b) The inner most modeling domain: the red line bounds the greater Guangzhou urban area, while the portions in black are rural areas with altitudes less than 200 m above the sea level.

123 Both the initial and the boundary conditions were from the six-hourly National

124 Centers for Environmental Predictions (NCEP) operational Global Final (FNL)

125 Analyses on a  $1^{\circ} \times 1^{\circ}$  grid. Land use was derived from the Moderate Resolution

- 126 Imaging Spectroradiometer (MODIS) 20-category land dataset in 2001~2004. Sea
- surface temperature is updated daily based on the AVHRR product from NOAA.36
- 128 Instead of leaf area index (LAI) information from a static table, we use the 12-
- 129 monthly, 30-second LAI dataset derived from MODIS. We also use the monthly
- 130 background surface albedo inputs from the Advanced Very High Resolution
- 131 Radiometer (AVHRR) on a polar orbiting satellite.37
- 132
- 133 The urban area in and around Guangzhou was represented in WRF using the Noah
- 134 land surface model coupled with the single-layer Urban Canopy Model (UCM)38 and
- the modified Zilitinkevich relationship for thermal roughness length
- 136 parameterization 39. Road, roof and building dimensions in U.S. and European cities
- are smaller than those in Beijing40'22, and we employed the high-intensity residential
- 138 parameterizations reported by Wang et al.22 to characterize the urban dimensions in

the UCM. Selected parameters used in the UCM are shown in Table 1. We note that 139 due to a lack of detailed urban morphology data we characterized all urban area as the 140 high-intensity residential category within the UCM model. For non-urban cells we use 141 142 the Noah mosaic method to represent the land surface heterogeneity, which allows 143 three tiles to coexist within a grid cell.41 Surface layer physics was modeled with the 144 MM5 similarity surface layer scheme42 and the planetary boundary layer was modeled with the Yonsei Unversity (YSU) scheme43. Atmospheric radiative transfer 145 146 (both shortwave and longwave) was modeled with the Rapid Radiative Transfer 147 Model for GCMs (RRTMG).44 Ozone and aerosol properties relative to radiative 148 transfer were based on the climatological values that vary spatially and temporally (monthly). The cloud microphysics processes were modeled with the Lin et al. 149 150 scheme45. The Grell-Freitas cumulus parameterization46 was employed in the two 151 outer domains; no cumulus parameterization was used in the inner most domain.

152

**Table 1.** Selected parameter values for the single-layer UCM.

Parameter	Value	Unit
Urban anthropogenic heating	50	W m <sup>-2</sup>
Road width	15	m
Roof width	20	m
Fraction Building or Road	0.8	none
Building height	13	m
Standard deviation of building height	3	m
Heat capacity of roof	$1.2 \times 10^{6}$	$J m^{-3} K^{-1}$
Heat capacity of building walls	$1.2 \times 10^{6}$	$J m^{-3} K^{-1}$
Heat capacity of ground	$1.5 \times 10^{6}$	J m <sup>-3</sup> K <sup>-1</sup>
Thermal conductivity of roof	0.4	$W m^{-1} K^{-1}$
Thermal conductivity of building walls	1.0	$W m^{-1} K^{-1}$
Thermal conductivity of ground	0.8	$W m^{-1} K^{-1}$
Albedo of roof	0.12	none
Albedo of building walls	0.12	none
Albedo of ground	0.12	none

154

#### 155 2.2 Experimental design

We designed our experiment to explore two questions: (1) what are the average 156 157 summertime meteorological effects of adopting cool roofs across Guangzhou; and (2) 158 how do those effects differ during summer heat-wave events? We modeled 31 159 episodes, each four to six days long, in two scenarios: a 'control' case with roof 160 albedo equal to 0.12, and a 'cool' case with roof albedo equal to 0.55. The cool case 161 albedo corresponds to the aged albedo of currently available white roofing 162 products.47 Although some field applied roofing products are installed with initial 163 albedo much higher than 0.55, Sleiman et al48 show that, in hot and humid or 164 polluted regions in the U.S., the aging process lowers albedo to about 0.6. Similar 165 experimental results are not yet available in China.

166

Building wall and pavement albedo were held constant at 0.12 across both scenarios.
The average albedo across the greater Guangzhou urban area (including all horizontal
surfaces, not just roofs) was 0.12 in the control case and 0.30 in the cool case. We
believe this represents a realistic upper bound to potential albedo enhancement from
cool roofs in Guangzhou.

172

173 Out of 31 total episodes, six episodes, referred to hereafter as 'heat-wave' episodes, 174 were extreme heat-wave events during the last decade (from 2001 to 2010). Heat 175 waves in Guangzhou are commonly associated with one of two types of atmospheric 176 circulation patters, namely Subtropical high-Typhoon-dominated (ST) and 177 Subtropical high (S)-dominated.49 We have not attempted to compile a complete 178 database of heat wave events and have simply chosen to simulate a sample of major 179 heat waves. We chose three episodes of each type that have been identified and 180 studied in previous published research50'51'52'53, and where each episode met the 181 most simple heat wave warning criteria designed by the China Meteorological 182 Administration of three consecutive days with temperatures above 35° C. For ST-183 dominated type, the episodes are 29 June - 3 July 2004, 14-18 July 2005, and 11-15 184 July 2007. For S-dominated type, the episodes are 21-25 August 2001, 14-18 July 185 2003, and 1-5 August 2004. The other 25 episodes, referred to hereafter as 'normal' episodes, were selected from the summers of 2004-2008 to provide a representative 186 187 sample of the average effects of cool roofs during summertime. The normal episodes 188 were chosen simply based on a consistent calendar starting day so the episodes did not overlap with any of the 6 historic heat waves. The normal episodes covered the 19<sup>th</sup>24<sup>th</sup> of each month May through September. Those dates cover the hottest period of
the year in Guangzhou. Each of the 31 episodes was begun at 00:00 UTC, with the

- 192 first 24h discarded as spin up.
- 193

#### 194 2.3 Theory and analysis framework

195 In the results and discussion section, simulated 2-meter air temperature change in the 196 greater Guangzhou urban area is presented as a function of control scenario air 197 temperature (Equation 1); as a function of control scenario air temperature and urban 198 ventilation (Equation 2); and finally as a function of control scenario air temperature, urban ventilation, and humidity (Equation 3). These regressions were developed to 199 200 quantify the sensitivity of ambient air temperature to roof albedo under the hot and 201 stagnant conditions associated with Guangzhou's heat waves. We compare the results 202 of the regressions to show how much more variance in temperature change can be 203 explained with these additional key meteorological properties.

204 
$$\Delta T_{\text{cool-control}} = a_0 + a_1 \times T_{\text{control}} \quad (\text{Eq. 1})$$

205 
$$\Delta T_{\text{cool-control}} = a_0 + a_1 \times T_{\text{control}} + a_2 \times V_{\text{control}} \quad (\text{Eq. 2})$$

206 
$$\Delta T_{\text{cool-control}} = a_0 + a_1 \times T_{\text{control}} + a_2 \times V_{\text{control}} + a_3 \times H_{\text{control}} \quad (\text{Eq. 3})$$

207 T and H are the episode average simulated 2-meter air temperature (° C) and 2-meter 208 humidity (g water vapor per kg air), respectively, from 10:00 – 18:00 LST over the 209 greater Guangzhou urban area (see the outline in Figure 1b). V is a measure of the 210 ventilation of Guangzhou, calculated as the average mass air flow (Gtonnes air per 211 hour) across the boundary and into the greater Guangzhou urban area from 10:00 -212 18:00 LST for each episode. Note we did not calculate net air flow; we simply calculated the mass air flow only where and when the flow was directed into the city 213 214 volume either horizontally or downwards into the first layer within the urban 215 boundary. The horizontal boundary of the city volume was defined as the border 216 shown in Figure 1b. The height of the city volume was defined as simply the first 217 model layer. In the supplemental material we report alternate regression results where 218 ventilation into the city was calculated based on the boundary layer height as opposed to simply the first model layer. The subtext "control" indicates the value was 219 220 calculated based on a control simulation.  $\Delta T_{\text{cool}-\text{control}}$  was calculated as the difference

- between average 2-meter temperatures in the cool scenario and the control scenario;
- thus, a negative value of  $\Delta T_{\text{cool}-\text{control}}$  indicates that the enhancement of urban albedo
- lead to a cooling of average air temperature across Guangzhou. We also note that
- adding the additional variable of solar insolation to Eq. 3 did not materially increase
- the amount of variance explained by the regression and thus we chose to exclude solar
- insolation from Eq. 3.
- 227

#### 228 3 Results and discussion

#### 229 3.1 Comparison of the control scenario simulations to observations

We compared control scenario simulated 2-meter air temperature to available 230 231 corresponding observations from NOAA Global Summary of the Day (GSOD) 232 data.54 Available temperature observations in the GSOD data include daily mean, 233 maximum and minimum, but not hourly temperature recordings. We found all 234 available GSOD observations close to the greater urban area of Guangzhou as defined as within the latitude-longitude box (22.46, 113.05) to (23.24,114.22). Across most 235 236 episodes, only three GSOD observation locations were found within this location, two 237 in the southern portion of the urban region and one just north of the urban region. To 238 compare these point observations to modeled output, we averaged the observations 239 across both time and space to yield one observed mean, maximum and minimum 240 value per episode. We compared these averaged observations to the corresponding modeled values developed by selecting only grid cells within which we found GSOD 241 242 observations. The comparison of modeled and observed values averaged over each 243 episode is analogous to how we report results in this paper: that is, we also present 244 result values as an average value over each episode.

- 245
- a)



Figure 2. Comparison of modeled and observed episode averages of (a) mean, (b)
daily maximum, and (c) daily minimum 2-meter air temperatures.

248

249 The model can explain 76%, 72%, and 67% of the variation (calculated as the

- 250 coefficient of determination) in episode average mean, average daily maximum, and
- average daily minimum temperatures, respectively (see Figure 2). The mean bias for
- the mean, maximum and minimum values is -0.18 °C, -0.39 °C, and 0.21 °C,
- 253 respectively. The mean error for the mean, maximum and minimum values is 0.82 °C,
- -1.24 °C, and 0.80 °C, respectively. The previous statistics are taken across all
- episodes. Isolating the six heat wave events, we find mean bias for the mean,
- 256 maximum and minimum values to be -0.75 °C, -1.09 °C, and -0.82 °C, respectively.
- 257 The mean error values are identical in magnitude to the mean bias values, but positive.
- 258 Compared to the mean biases across the full set of episodes, the biases for the heat
- 259 wave episodes are larger and all negative, indicating the model is not able to fully
- 260 capture the temperature increases associated with the heat waves. However, the model
- 261 can still explain much of the variation across the heat wave episodes, as the
- coefficient of determination calculated across the six episodes is equal to 0.97, 0.69,
- and 0.59 for the episode average mean, maximum, and minimum temperatures,
- respectively.
- 265

# 3.2 Simulated cool roof air temperature effects during heat waves and average summer conditions

268 Maps of mean 2-meter air temperatures and differences between the control and cool 269 scenarios for the hours 10:00 - 18:00 LST are shown in Figure 3. The left column 270 (Figure 3a-c) shows mean results of the normal summer episodes while the right column (Figure 3d-f) shows mean results from the heat-wave episodes. The greater 271 272 urban area of Guangzhou is outlined in the center of each figure. A midday urban heat 273 island effect can be clearly seen in Figure 3a. Figure 3b indicates that the simulated 274 increase to roof albedo reduces the difference in average temperatures between urban 275 Guangzhou and the surrounding area. High region-wide temperatures with peak 276 temperatures centered in the urban area of Guangzhou can be seen in Figure 3d. 277 Figures 3c and 3f show the simulated mean reduction to temperature with roof-278 albedo-increase under the normal episodes and heat-wave episodes, respectively.



Figure 3. Mean temperature (a,b,d,e) and mean temperature change (c, f), 10:00 –
18:00 LST. Left column shows normal weeks, right column shows heat-wave events.
The dotted line bounds the greater urban area of Guangzhou.

We found the cool simulations had reduced urban heat island intensity compared to the control simulations. To quantify this effect we define a heat island effect for each urban grid cell (536 cells) as the difference in temperature between that cell and the temperature averaged over all non-urban land based cells outside the greater Guangzhou urban area and located at an elevation under 200 meters (see Figure 1b for a map of the regions meeting these conditions). We averaged the temperatures average from 10:00 – 18:00 LST across all episodes (normal and heat-wave
separately).

291

Under both the normal and heat-wave episodes, the cool simulations exhibit lower
average urban temperatures and reduce the maximum heat island effect by roughly
1.0 °C. This can be seen in Figures 4a and b, which show histograms of the heat
island effect during normal and heat-wave episodes. The larger cooling effect
simulated during heat-wave episodes can be seen in Figure 4c, which shows a
distribution of the temperature differences between the cool and control scenarios
across the urban area of Guangzhou for both normal and heat-wave episodes.



Figure 4. Panels (a) and (b) show the distribution of the heat island effect in the
greater Guangzhou urban area during normal episodes and heat-wave episodes,
respectively. Panel (c) shows the difference in temperature between the cool and
control scenarios for normal and heat-wave episodes.

303

304 Examining the diurnal cycle of the mean differences in 2-meter temperature between

305 the control and cool scenarios (calculated as the average temperatures across all grid

306 cells within the greater Guangzhou urban area) we see that temperature reductions

307 peak midday at 0.8 °C and 1.2 °C for the normal and heat-wave episodes, respectively

308 (see Figure 5). We note the simulated cool roof effect on air temperatures at night is

negligible with temperature changes averaging only -0.06 °C from 22:00 - 6:00 LST

during normal episodes. Detailed data related to Figure 5 can be found in Tables S1and S2.



Figure 5. Diurnal cycle of mean temperature difference (± 1 standard deviation)
between baseline and cool scenarios for (a) normal episodes and (b) heat-wave
episodes.

316

#### 317 **3.3** Sensitivity of cool roof air temperature effects to meteorological conditions

318 We saw in Figures 3, 4 and 5 that average temperature reductions were greater during

319 the heat-wave episodes. Here we investigate how the sensitivity of urban air

320 temperature to roof albedo might vary under different meteorological conditions.

- 321 Figure 6 shows a scatter plot of mean temperature reductions versus mean
- 322 temperature of the control scenario, averaged across the greater Guangzhou urban
- area over the hours 10:00 18:00 LST. Following Equation 1 from section 3.2, we
- have regressed the data in Figure 6 finding  $a_0 = 1.42$  and  $a_1 = -0.068$  and a coefficient

325 of determination  $(R^2)$  of 0.59.

326

- 327 We can explain more of the variance across these episodes by including other
- 328 independent variables from the control scenario such as ventilation and humidity (see
- 329 section 3.2 for details). Based on the full set of episodes (normal and heat-wave) we
- find coefficients  $a_0$ ,  $a_1$ , and  $a_2$  for Equation 2 of 1.125, -0.062 and 0.129, respectively,
- and coefficients  $a_0$ ,  $a_1$ ,  $a_2$ , and  $a_3$  for Equation 3 of 1.084, -0.086, 0.120, and 0.046,
- respectively. Here,  $a_1$ ,  $a_2$ , and  $a_3$  are associated with temperature, ventilation and

humidity, respectively. We find that by including these three meteorological 333 properties we can account for greater than three fourths of the variance ( $R^2 = 0.77$ ) in 334 335 temperature response to albedo increase. By including ventilation in addition to 336 temperature (compare Equation 2 to Equation 1) we are able to reduce the root-mean-337 square errors (RMSE) of the heat wave episodes but not the normal episodes. By 338 including all three variables (Equation 3 compared to 1), we were able to reduce rootmean-square errors across both normal and heat-wave episodes. See Table 2 for the 339 340 above results, and see Tables S3 and S4 for the results based on the ventilation into 341 the full boundary layer, as discussed in Section 3.2.

342

343 This solution quantifies how increased ventilation and humidity attenuate the cool 344 roof temperature effects. On average, compared to normal episodes, heat-wave 345 episodes in Guangzhou were hotter (34.1 °C vs. 31.4°C) and had much lower midday 346 ventilation (0.6 Gt/h vs. 0.9 Gt/h, a 33% decrease) but only slightly higher midday humidity (18.0 g/kg vs. 17.8 g/kg, a 1.2% increase). Running these average conditions 347 through Equation 3, we find that cool roofs provide 0.26° C more cooling during heat 348 waves compared to normal conditions, of which 0.23, 0.04 and -0.01 °C of cooling is 349 350 associated with temperature, ventilation, and humidity differences, respectively. Thus, 351 while the inclusion of ventilation and humidity can help explain some of the variation 352 in cooling effects between heat-wave and normal episodes, the majority of the effect 353 is associated with temperature differences.



Figure 6. Mean (10:00 – 18:00 LST) temperature vs. mean temperature difference for
 normal and heat-wave episodes.

**Table 2.** Root-mean-square errors of  $\Delta T$  calculated across normal, heat-wave and all episodes.

	Root-mean-square error (° C)			All episode
	Normal	Heat-wave	All	coefficient of
Linear regression	episodes	episodes	episodes	determination (R <sup>2</sup> )
Eq. 1	0.077	0.138	0.092	0.59
Eq. 2	0.078	0.122	0.088	0.60
Eq. 3	0.055	0.098	0.065	0.77

<sup>359</sup> 

#### 360 **3.4 Research and policy implications**

361 We have shown through meteorological simulations that a policy of enhancing roof

albedo in Guangzhou could reduce average midday summer temperatures by 0.8 °C.

363 Furthermore those temperature reductions could be larger during the hot and stagnant

364 conditions of heat waves in Guangzhou reaching 1.2 °C. The increased air

365 temperature sensitivity to urban roof albedo during heat waves is important since heat

366 waves can pose significant public health problems and electricity grids are typically

367 under the most stress during heat waves. Our results highlight the need to evaluate

368 cool roof meteorological effects under both average conditions as well as during heat

369 waves in order to fully characterize potential urban cooling benefits. We note,

- 370 however, these results are based on a scenario assuming the upper limit of feasible
- 371 roof albedo enhancement. Given the challenge of changing the average roof albedo
- across an entire city, future modeling efforts might assist policy design by describing
- the minimum urban albedo change, in city area and in magnitude, required to provide
- 374 measureable local benefits. Such efforts might also support a localized experiment
- that could help verify these simulations.
- 376

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389

### 390 Conflict of Interest Disclosure

391 The authors declare no competing financial interest.

392

# 393 Supporting Information

- 394 Supporting information includes tables of the average and standard deviation of
- temperature reductions by hour and simulation period. This material is available free
- 396 of charge via the Internet at http://pubs.acs.org.

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