



## Asian megacity heat stress under future climate scenarios: Impacts of Air-conditioning feedbacks

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# Project future climate's urban heat stress

- Future projections of urban heat stress are important to investigate strategies to mitigate urban heat islands and adaptations to urban climate change.
- But, **Human heat stress projections with fine horizontal resolution sufficient to resolve urban climate** (e.g. Kusaka et al. 2012 JMSJ; Doan et al. 2016 UC) **are few**.
- If both temperature and humidity are high, heat stress tends to be high. Such conditions are common in Japan megacities, with high population densities (e.g. Tokyo and Osaka) resulting in high risk of heatstroke during heat waves.
- **Universal Thermal Climate Index (UTCI) allows heatstroke risk with a clear relation to physiological responses (e.g. human body core temperature).**
- **Motivation #1** : to project future climate's UTCI using dynamical downscaling to 1 km horizontal resolution for Asian megacity Osaka.

# How big is the AC-induced feedback on heat stress?

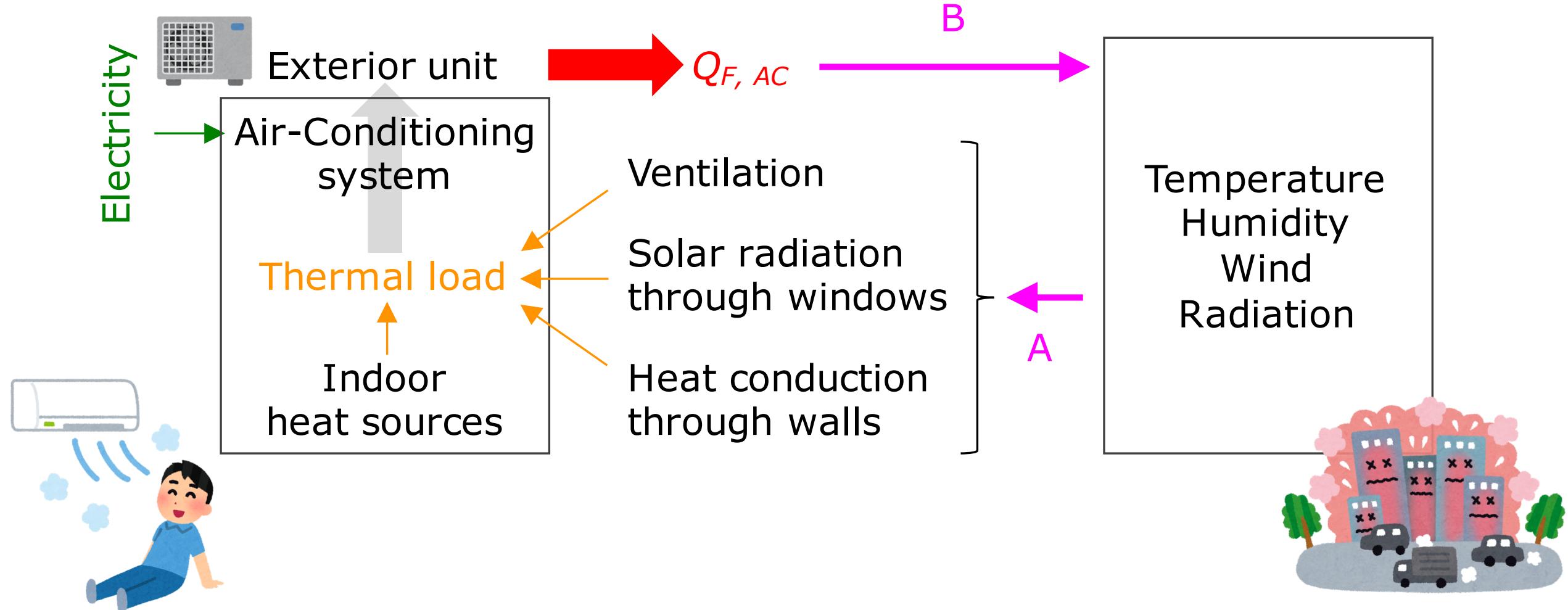
- A human behaviour - **air-conditioning (AC) use - induces positive feedback** could worsen urban thermal environment (produce additional temperature increase of 0.6 °C) in Osaka's August early mornings under the +3.0 °C global warming scenario (Takane et al. 2019 npj Climate and Atmospheric Science)

# AC-induced positive feedback

$\sim +0.6^{\circ}\text{C}$  (Takane et al. 2019)

Buildings (indoor)

Atmosphere (outdoor)



# How big is the AC-induced feedback on heat stress?

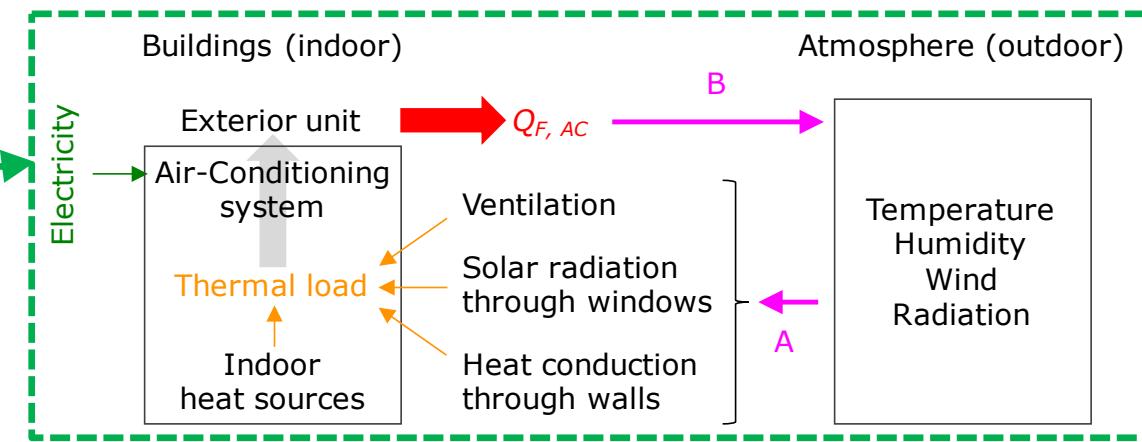
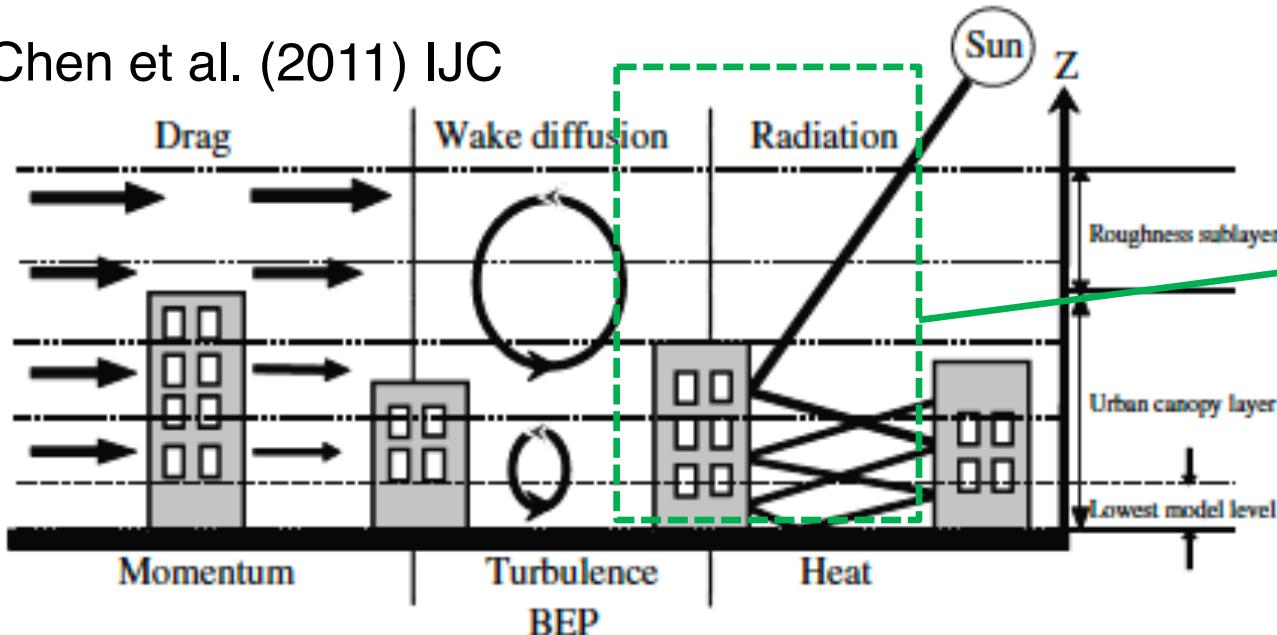
- A human behaviour - **air-conditioning (AC) use - induces positive feedback** could worsen urban thermal environment (produce additional temperature increase of 0.6 °C) in Osaka's August early mornings under the +3.0 °C global warming scenario (Takane et al. 2019 npj Climate and Atmospheric Science)
- But **impact on heat stress remains unknown**. Understanding the impact is important.
- **Motivation #2**: to clear how big the feedback impact on heat stress (UTCI) is.

# WRF with modified BEP+BEM parameterisation

Salamanca et al. (2010) TAC

Takane et al. (2017) IJC

Chen et al. (2011) IJC



$$Q_{F,AC} = (H_{out} + E_{out}) + E_C = \frac{COP + 1}{COP} (H_{out} + E_{out})$$

- Residential grids

- Office grids (consider cooling tower)

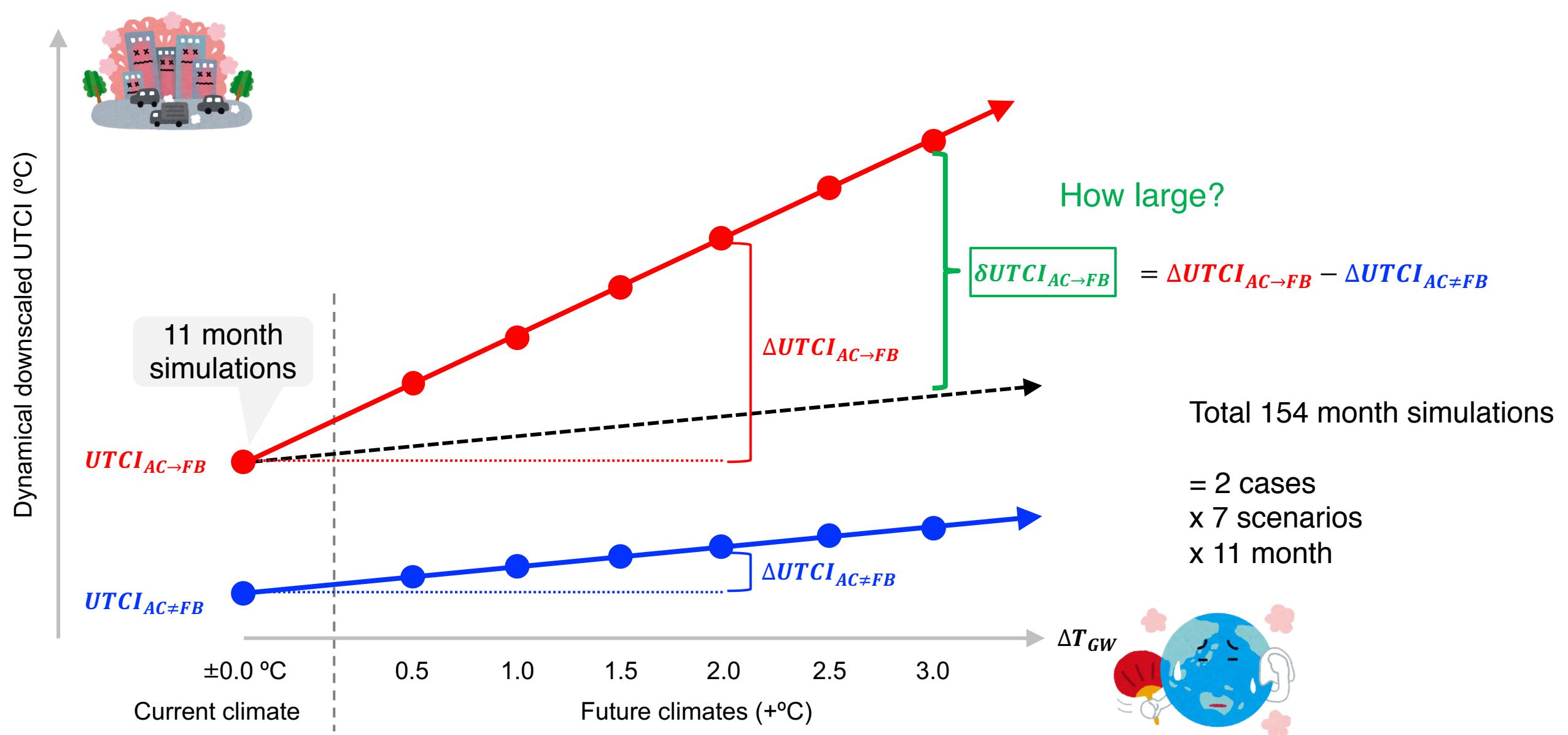
$$Q_{F,AC,S} = Q_{F,AC}$$

$$Q_{F,AC,L} = 0$$

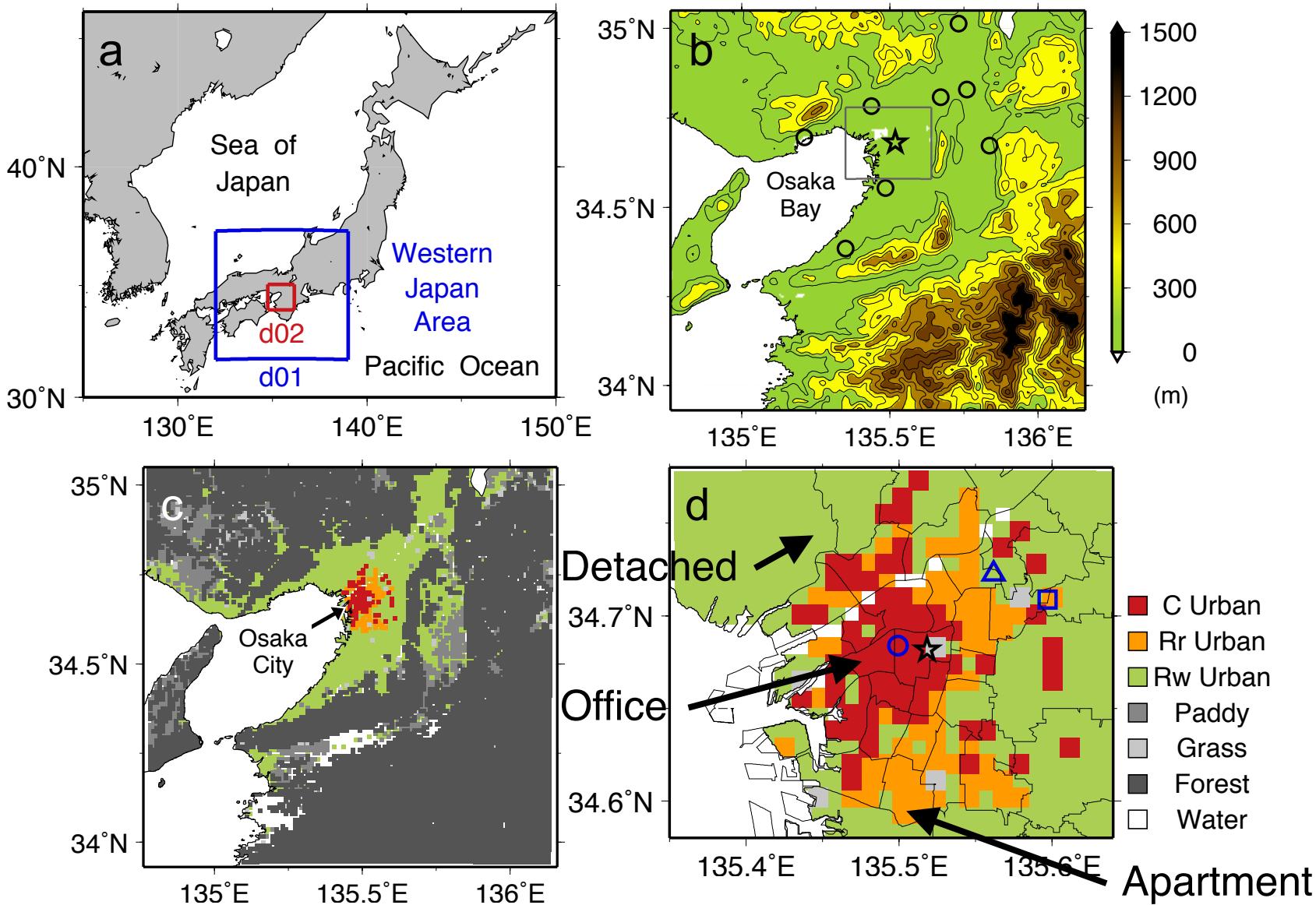
$$Q_{F,AC,S} = 0.722 Q_{F,AC}$$

$$Q_{F,AC,L} = 0.278 Q_{F,AC}$$

# How to estimate the feedback impact



# Osaka City (with 20 million population)



- (Olympic game 2020)
- World exposition in 2025



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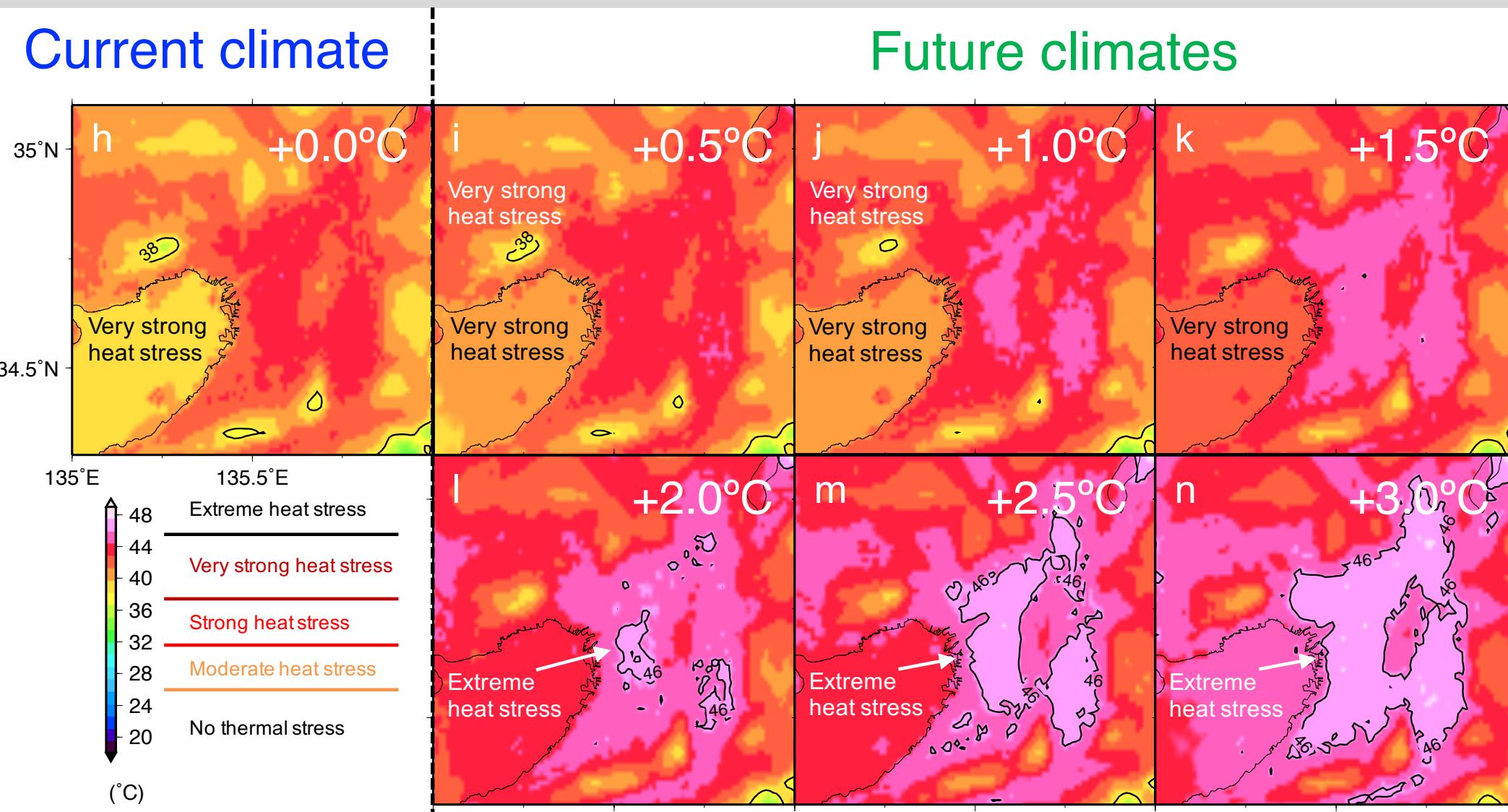
緯度 34.675385° 経度 135.503508° 標高 16 m 高度 1.15 km

Google Earth



2003

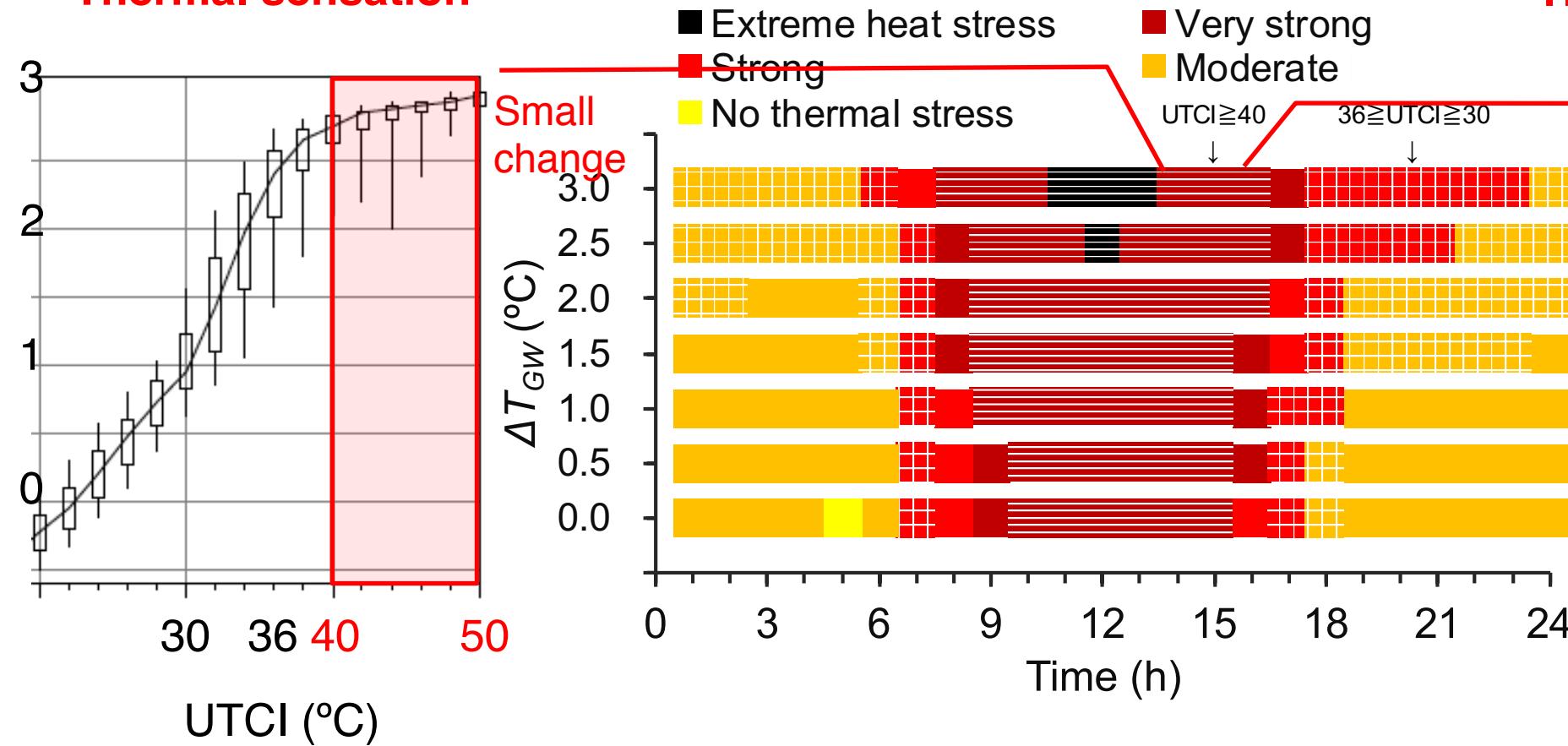
# The UTCl increase with $\Delta T_{GW}$



# Daytime is dangerous with non-linear increases in body core temp and without thermal sensation change

## Motivation #1

### Thermal sensation



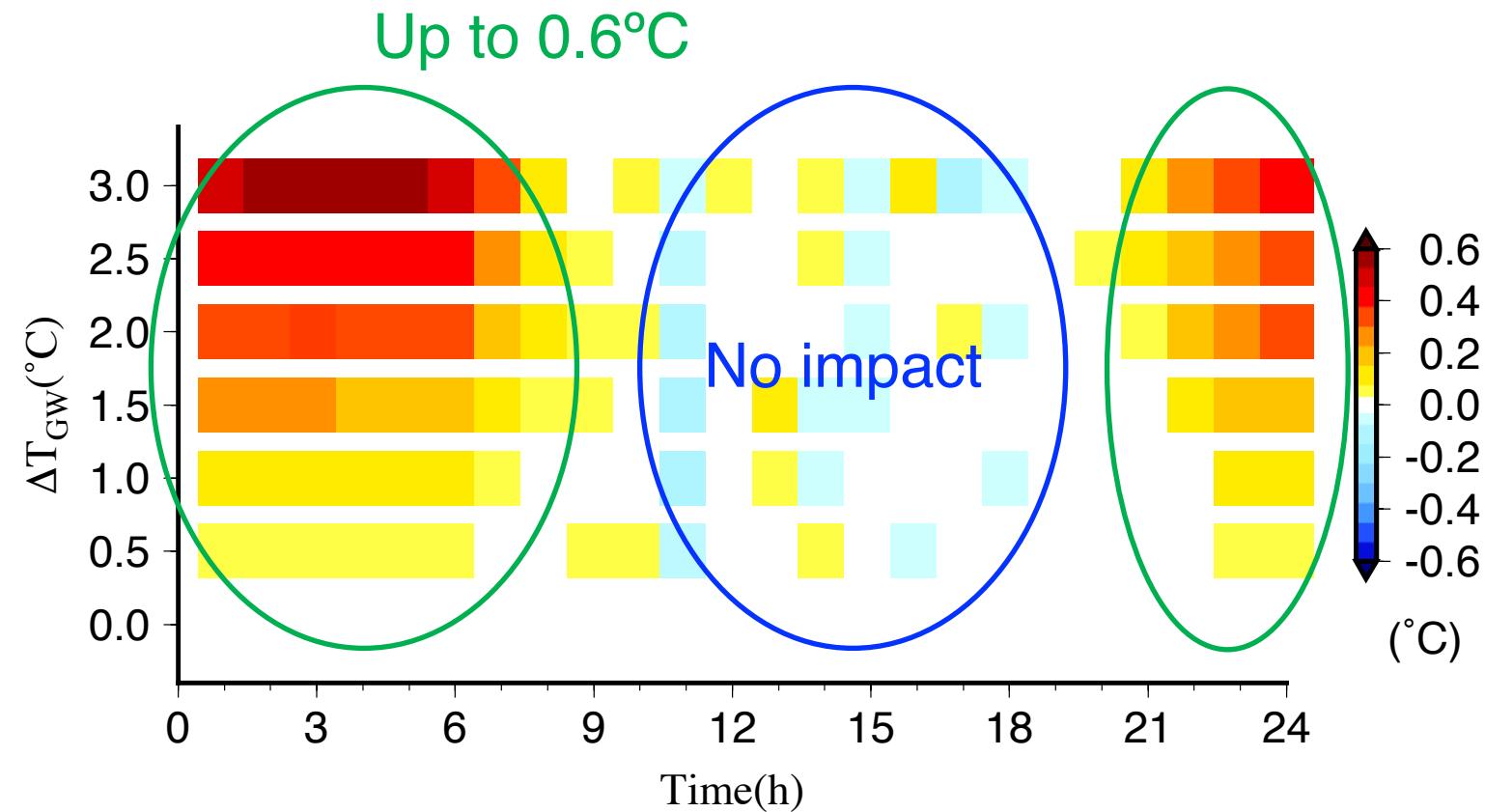
Bröde et al. (2012) IJB

Bröde et al. (2012) IJB

Takane et al. (2020) Environ. Res. Commun.

# Impact of AC induced feedback on UTCI reaches $0.6^{\circ}\text{C}$

## Motivation #2



The AC induced feedback impact is comparable to suggested benefits from urban heat island mitigation techniques in the literature

# Conclusion - novelty

## Motivation #1

- **UTCI increases with  $\Delta T_{GW}$  and AC feedbacks.** An ‘extreme’ heat stress area appears when +2.0 °C (+2.5 °C) warming scenario. These are dangerous conditions for people outdoors as they may experience large increases in body core temperature.

## Motivation #2

- **Impact of AC induced feedback on UTCI** increase roughly linearly with  $\Delta T_{GW}$ . At +3.0 °C warming scenario, this reaches **+0.6 °C (12% of UTCI increase)**.
- This size is comparable to suggested benefits from urban heat island mitigation techniques in the literature. Therefore, **the feedbacks are significant and potentially could cancel other mitigation benefits in the future, especially where AC use is large**. Hence, this feedback should not be neglected in future urban climate projections.

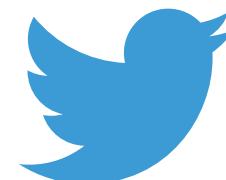
**Take-home message**

# Acknowledgments

- JSPS Overseas Research Fellowships
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- Newton Fund/Met Office WCSSP programme
- The ‘Interdisciplinary Computational Science Program’ in the Center for Computational Sciences, University of Tsukuba

# Thank you!

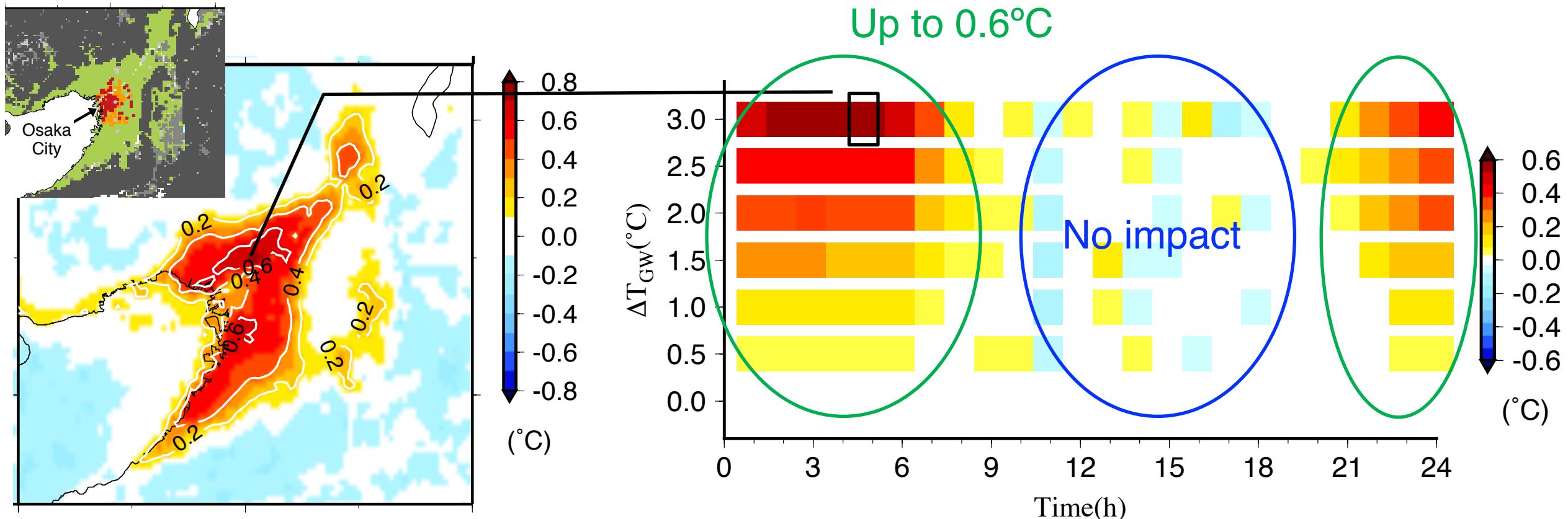
- Verification the model against **high-reso electricity consumption** – [Takane et al \(2017, Int. J. Climatol.\)](#)
- Impact of AC induced feedback on **temp & electricity demand** – [Takane et al. \(2019, npj Climate Atmos. Sci.\)](#)
- Impact of AC induced feedback on **heat stress** – [Takane et al. \(2020, Env. Res. Commun.\)](#)



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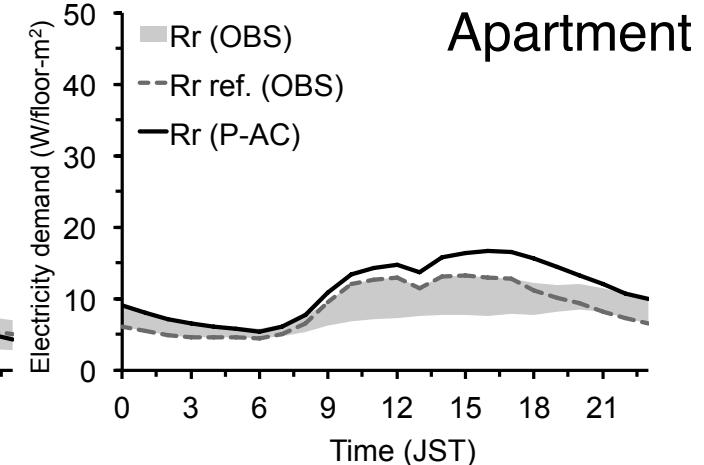
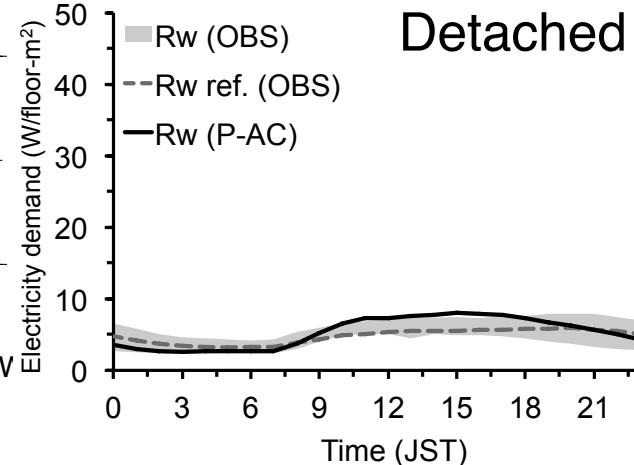
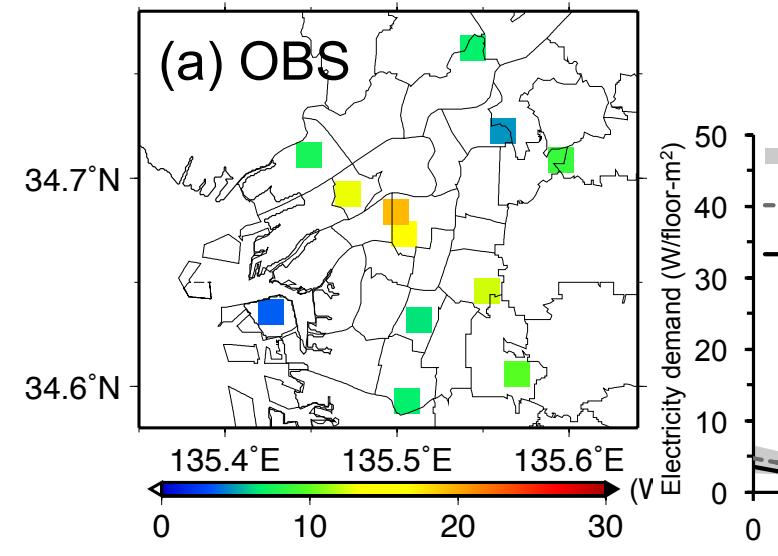
# Impact of AC induced feedback on UTCI reaches 0.6°C



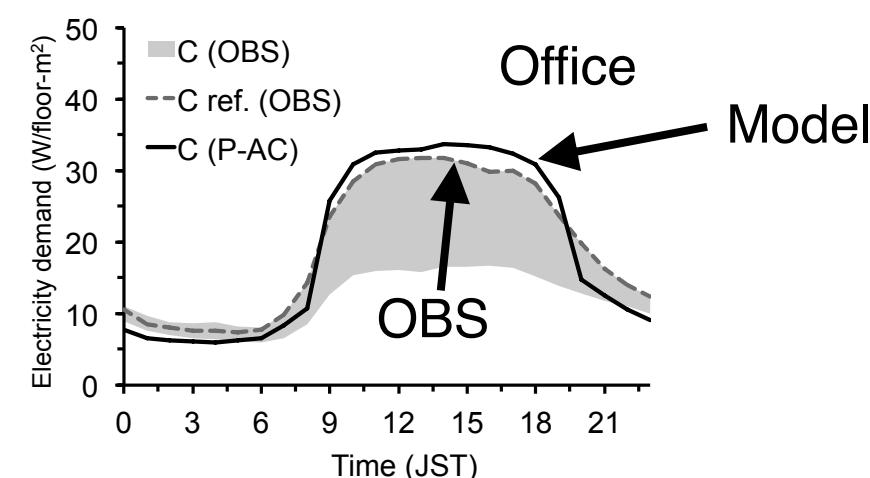
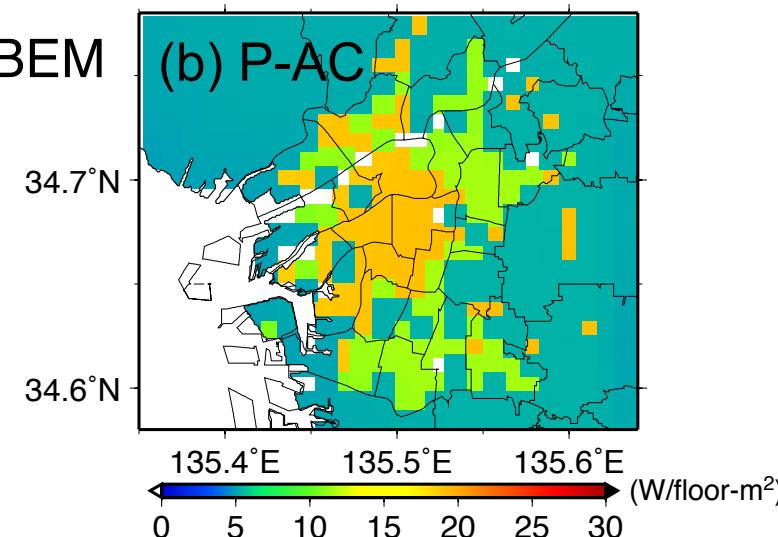
The AC induced feedback impact is comparable to suggested benefits from urban heat island mitigation techniques in the literature

# Reproducibility – Electricity consumption

Monthly mean  
August 2013

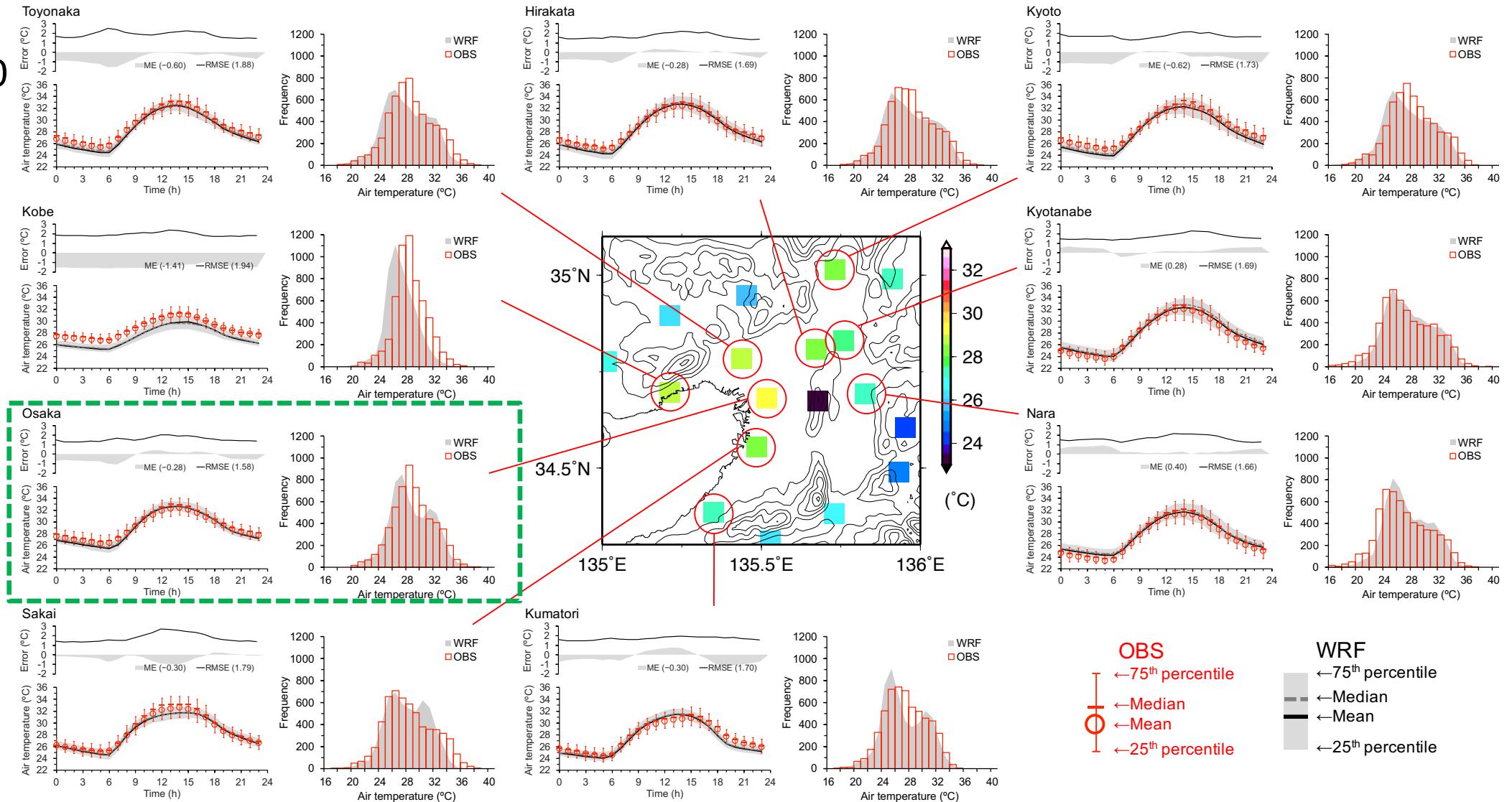


Modified BEP+BEM



# Reproducibility – 2-m temperature

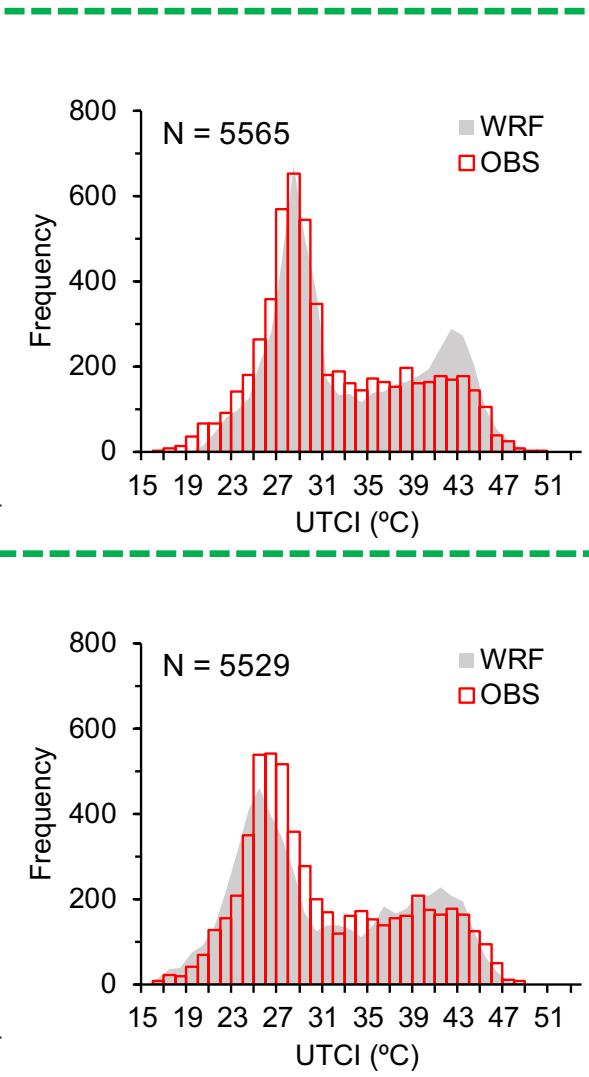
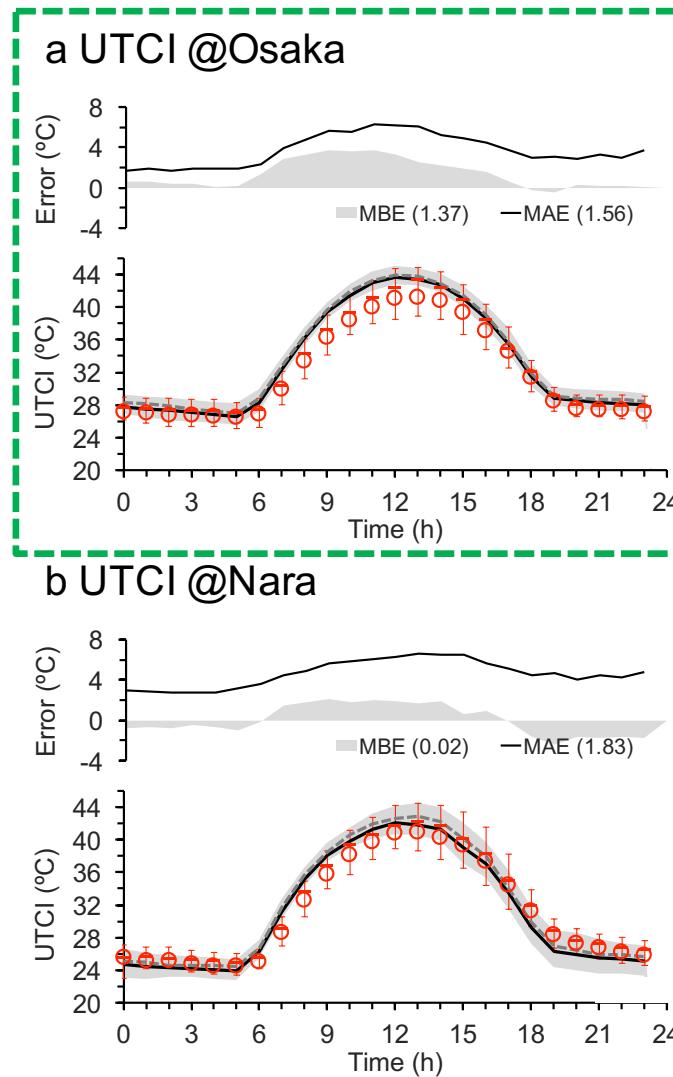
August  
2000-2010



# Reproducibility – UTCI

August  
2000-2010

Osaka



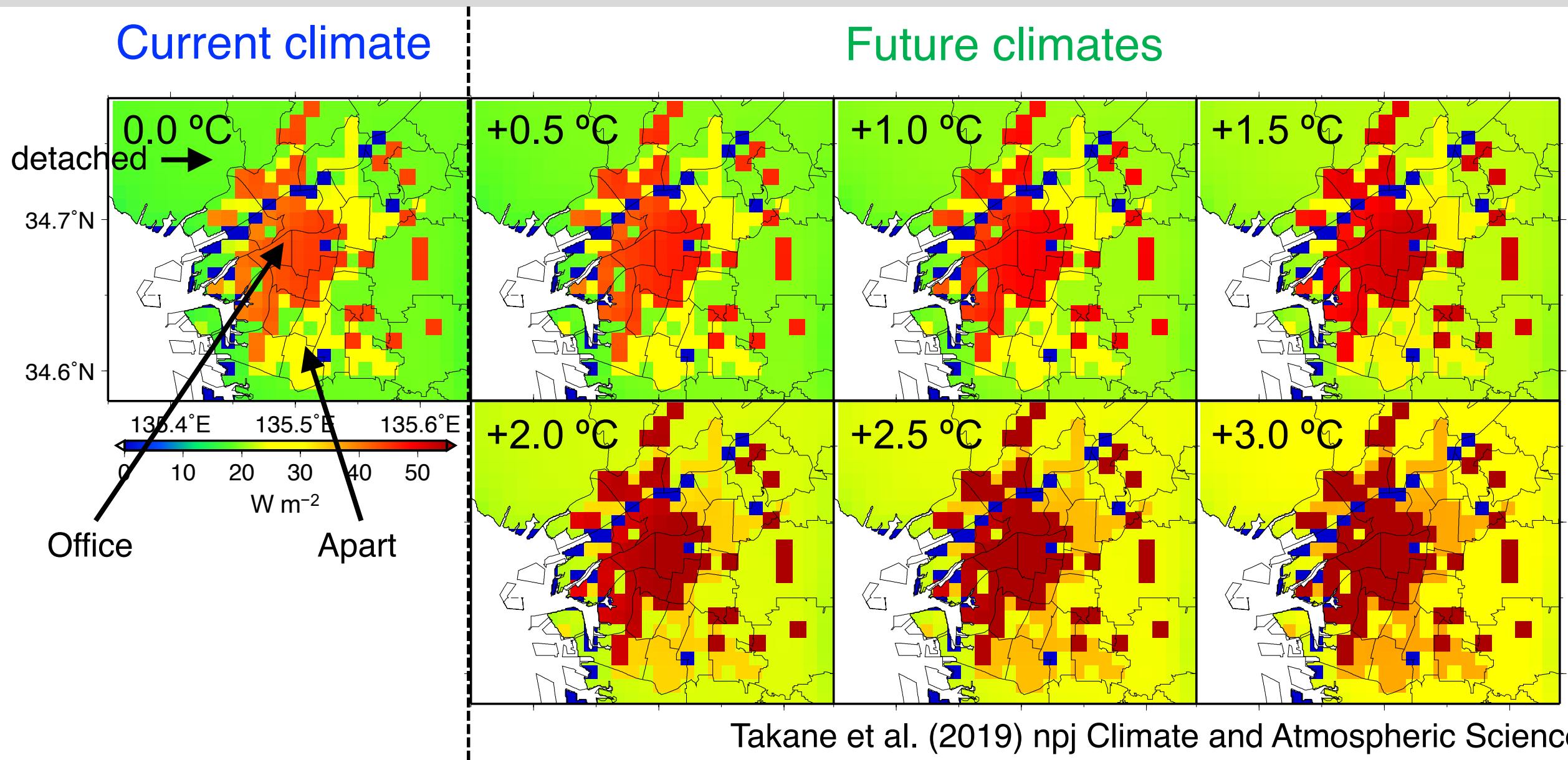
OBS

- ← 75<sup>th</sup> percentile
- ← Median
- ← Mean
- ← 25<sup>th</sup> percentile

WRF

- ← 75<sup>th</sup> percentile
- ← Median
- ← Mean
- ← 25<sup>th</sup> percentile

# The $Q_{F, AC}$ increase with $\Delta T_{GW}$ (14 LT)



# How to estimate the UTCI

## 2.3 UTCI calculation

The hourly UTCI is calculated for 11 years for each climate scenario using the polynomial parameterisation of the Fiala human physiology model (Fiala *et al.* 2012; Błażejczyk *et al.* 2013) in Bröde *et al.* (2012a). This parameterisation is frequently used because of its computational efficiency (e.g. Bröde *et al.* 2012b; Błażejczyk *et al.* 2013; Provençal *et al.* 2016; Ohashi *et al.* 2018). It is forced with the near surface air temperature (2-m simulations or 1.5-m observations), relative humidity, black globe temperature ( $T_g$ ), and wind speed (within the urban canopy layer). The mean radiant temperature ( $T_{mrt}$ ) is estimated from  $T_g$ , air temperature, and wind speed (Kinouchi 2001):

$$\varepsilon_h \sigma (T_{mrt} + 273.15)^4 = C_g + R_g \quad (1)$$

$$R_g = \varepsilon_g \sigma (T_g + 273.15)^4 \quad (2)$$

where  $C_g$  is the sensible heat flux from the globe surface ( $\text{W m}^{-2}$ ),  $R_g$  is the longwave radiation emitted from the globe surface averaged for the surface area ( $\text{W m}^{-2}$ ), and  $\varepsilon_g$  and  $\varepsilon_h$  are

the emissivities of the globe thermometer (assumed to be 1.0) and human clothing (0.98), respectively.  $C_g$  is a function of globe temperature and air temperature (Yuge 1960):

$$C_g = h_{cg}(T_g - T_a) \quad (3)$$

$$\frac{h_{cg}D}{\lambda} = 2 + 0.55Re^{0.5} \left( \frac{c_p \mu}{\lambda} \right)^{\frac{1}{3}} \quad (10 < Re < 1.8 \times 10^3) \quad (4)$$

$$\frac{h_{cg}D}{\lambda} = 2 + 0.34Re^{0.566} \left( \frac{c_p \mu}{\lambda} \right)^{\frac{1}{3}} \quad (1.8 \times 10^3 < Re < 1.5 \times 10^5) \quad (5)$$

where  $Re$  is the Reynolds number ( $UD/\nu$ ),  $U$  is the wind speed,  $D$  the diameter of the globe ( $=0.15$  m),  $\nu$  is the kinematic viscosity of air ( $\text{m}^2 \text{s}^{-1}$ ),  $\gamma$  is the viscosity coefficient of air (Pa s),  $\lambda$  is the thermal conductivity of air ( $\text{W m}^{-1} \text{K}^{-1}$ ), and  $c_p$  is the specific heat under a constant pressure ( $\text{J K}^{-1} \text{kg}^{-1}$ ).

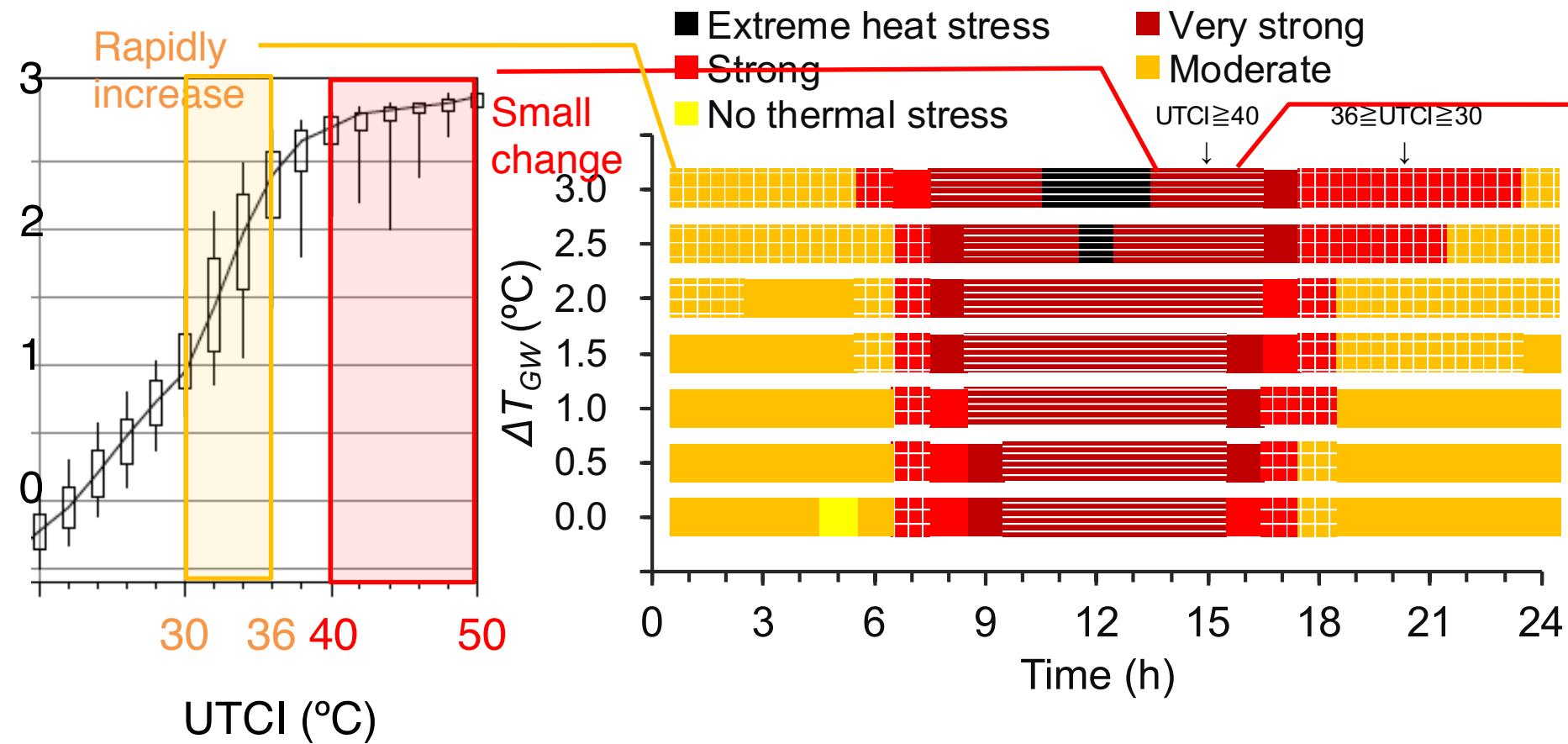
$T_g$  is estimated using the improvement to Okada and Kusaka (2013) in Okada *et al.* (2013):

$$T_g = \frac{(S_0 - 38.5)}{(0.0217S_0 + 4.35U + 23.5)} + T_a \quad (6)$$

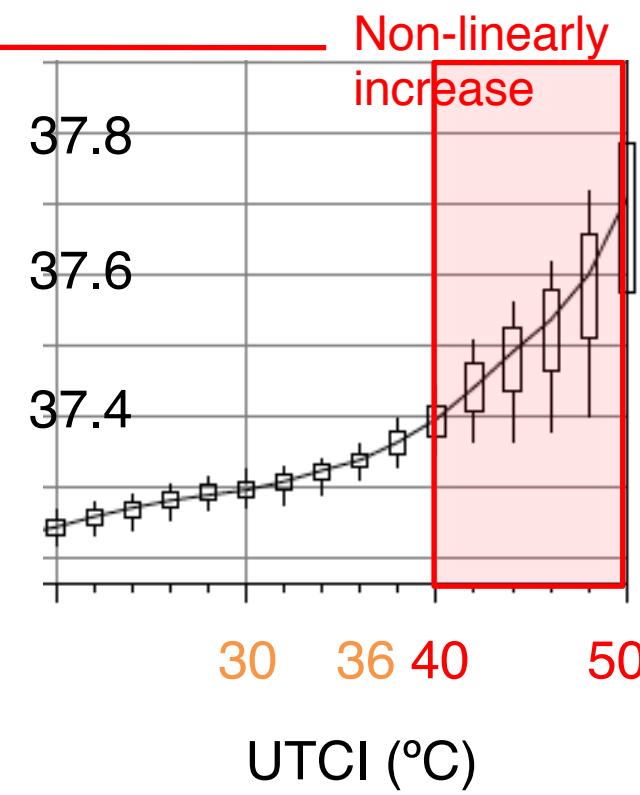
where  $S_0$  is the incoming shortwave radiation ( $\text{W m}^{-2}$ ). An evaluation for one site surrounded by office buildings in Osaka using hourly observations for June to August 2006–2012 reported a root mean square error of  $2.15^\circ\text{C}$ . This equation is applicable for urban environments under all weather conditions, including clear skies and overcast and rainy days (Okada and Kusaka 2013). More detail is given in Section S1 of the Supplementary material.

# Daytime is dangerous with non-linear increases in body core temp and sweat production and without thermal sensation change

**Thermal sensation**



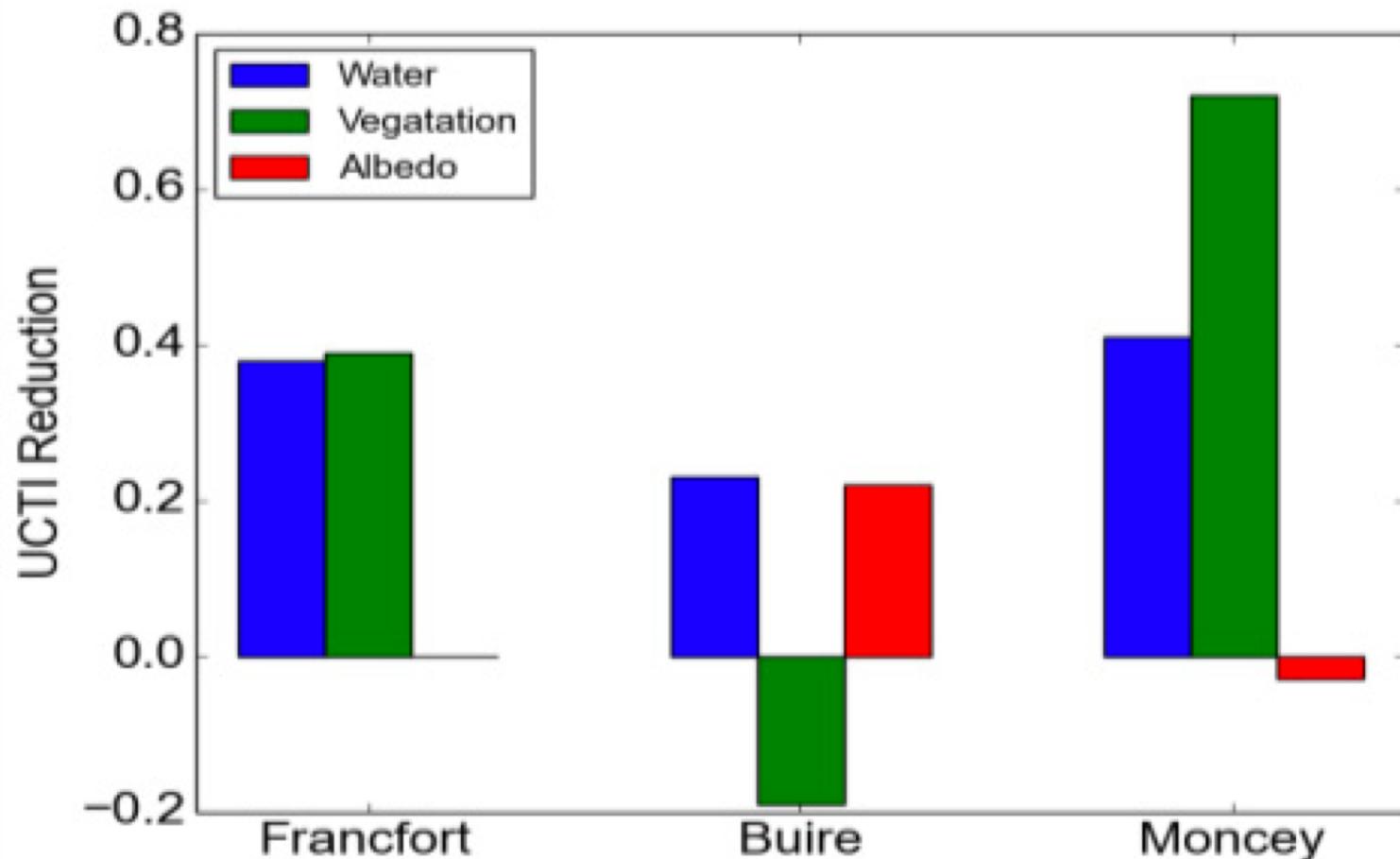
**Human body core temp ( $^{\circ}\text{C}$ )**

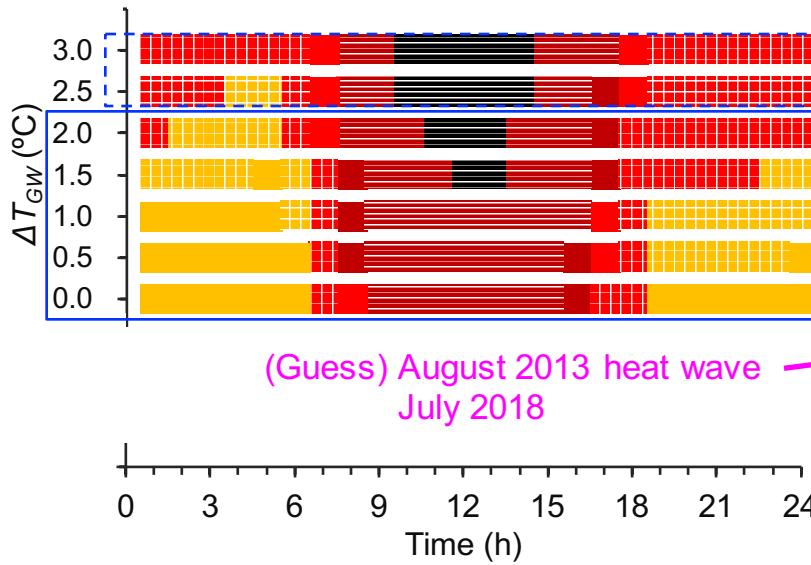
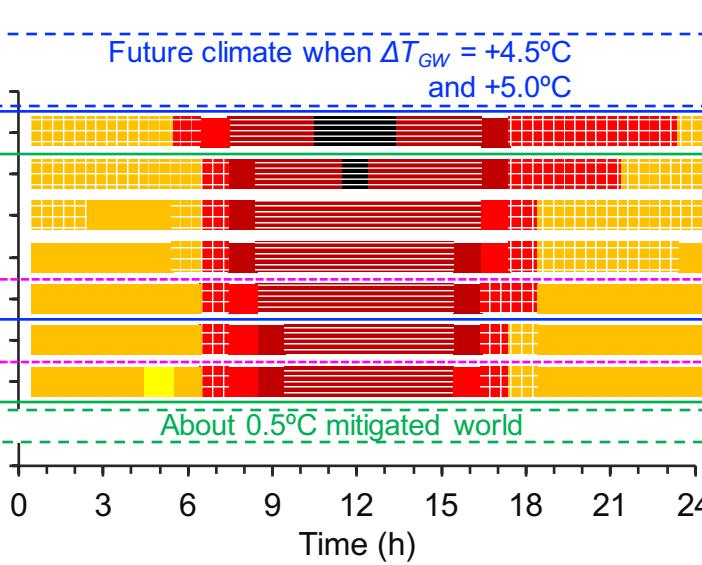
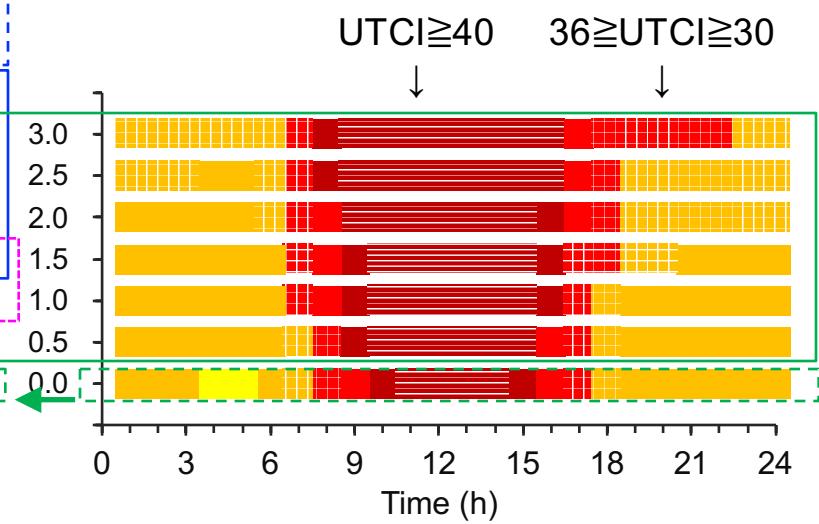


Bröde et al. (2012) IJB

Bröde et al. (2012) IJB

# The AC feedback impact is comparable to benefits from urban heat island mitigation techniques<sup>24</sup>



**a UTCI<sub>AC→FB</sub> categories (hot summer)****b (mean summer)****c (cold summer)**

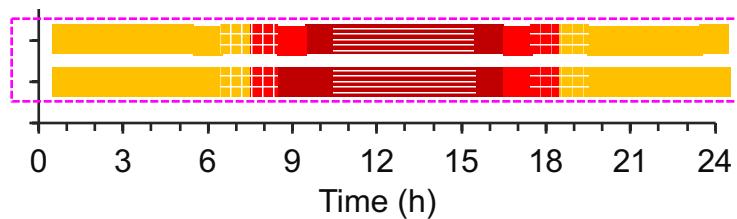
(Guess) August 2013 heat wave  
July 2018

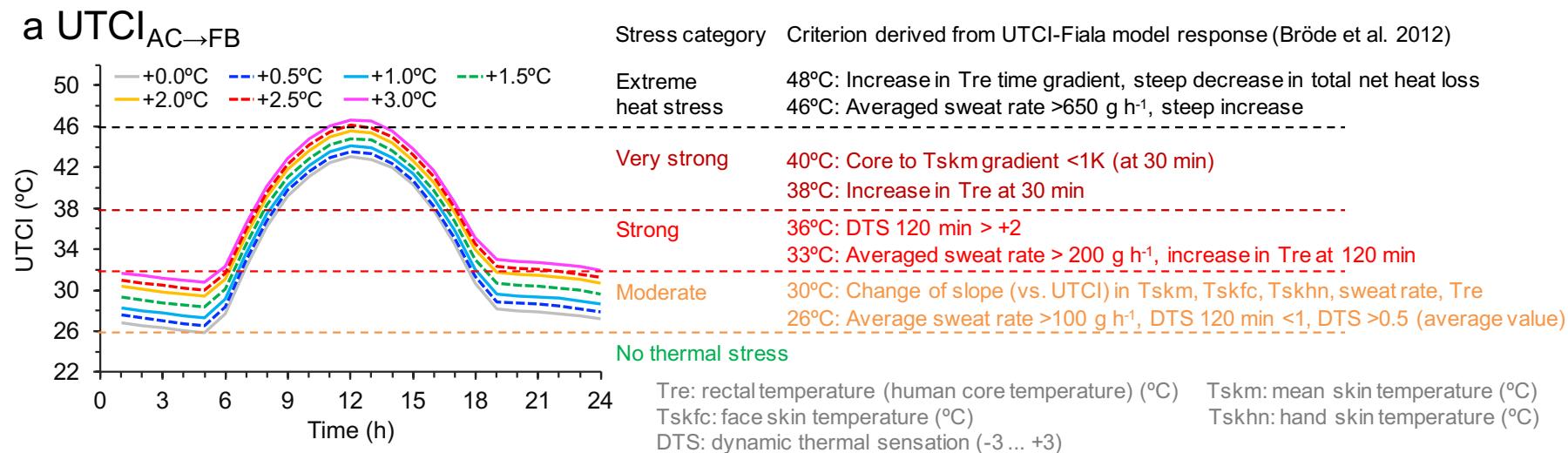
Future climate when  $\Delta T_{GW} = +4.5^{\circ}\text{C}$   
and  $+5.0^{\circ}\text{C}$

About  $0.5^{\circ}\text{C}$  mitigated world

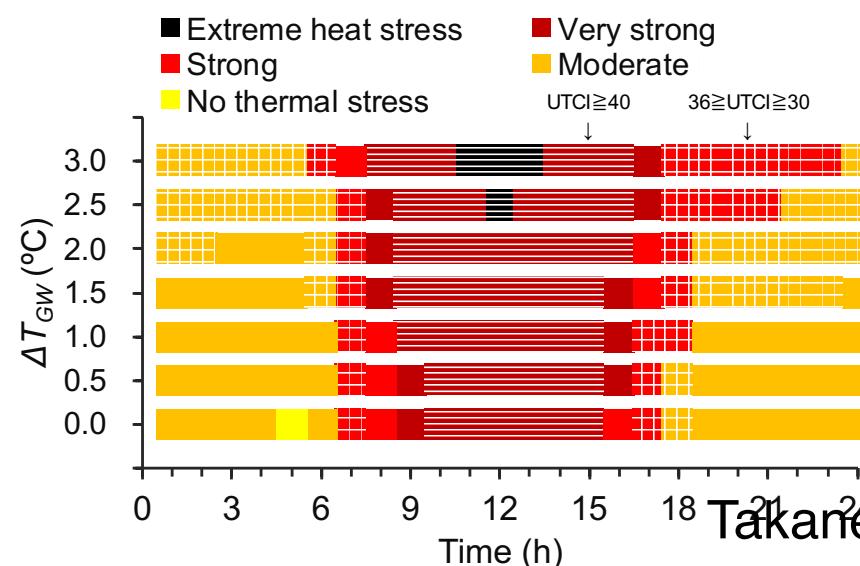
- Extreme heat stress      ■ Very strong heat stress
- Strong heat stress      ■ Moderate heat stress
- No thermal stress

(Actual) August 2013 heat wave  
July 2018

**d (Observation)**



### b UTCI<sub>AC→FB</sub> stress categories



# How to project future climate (Pseudo Global warming method)

Current climate simulation

NCEP / NCAR

Reanalysis  
(at 0Z)

Reanalysis  
(at 6Z)

Reanalysis  
(at 12Z)

0

6

12

→ (hours)

NCEP / NCAR

Future climate projection

CCSM4

Reanalysis  
(at 0Z)  
+  
Monthly PGW  
component

Reanalysis  
(at 6Z)  
+  
Monthly PGW  
component

Reanalysis  
(at 12Z)  
+  
Monthly PGW  
component

CESM1-CAM

Average  
of 4GCMs

0

6

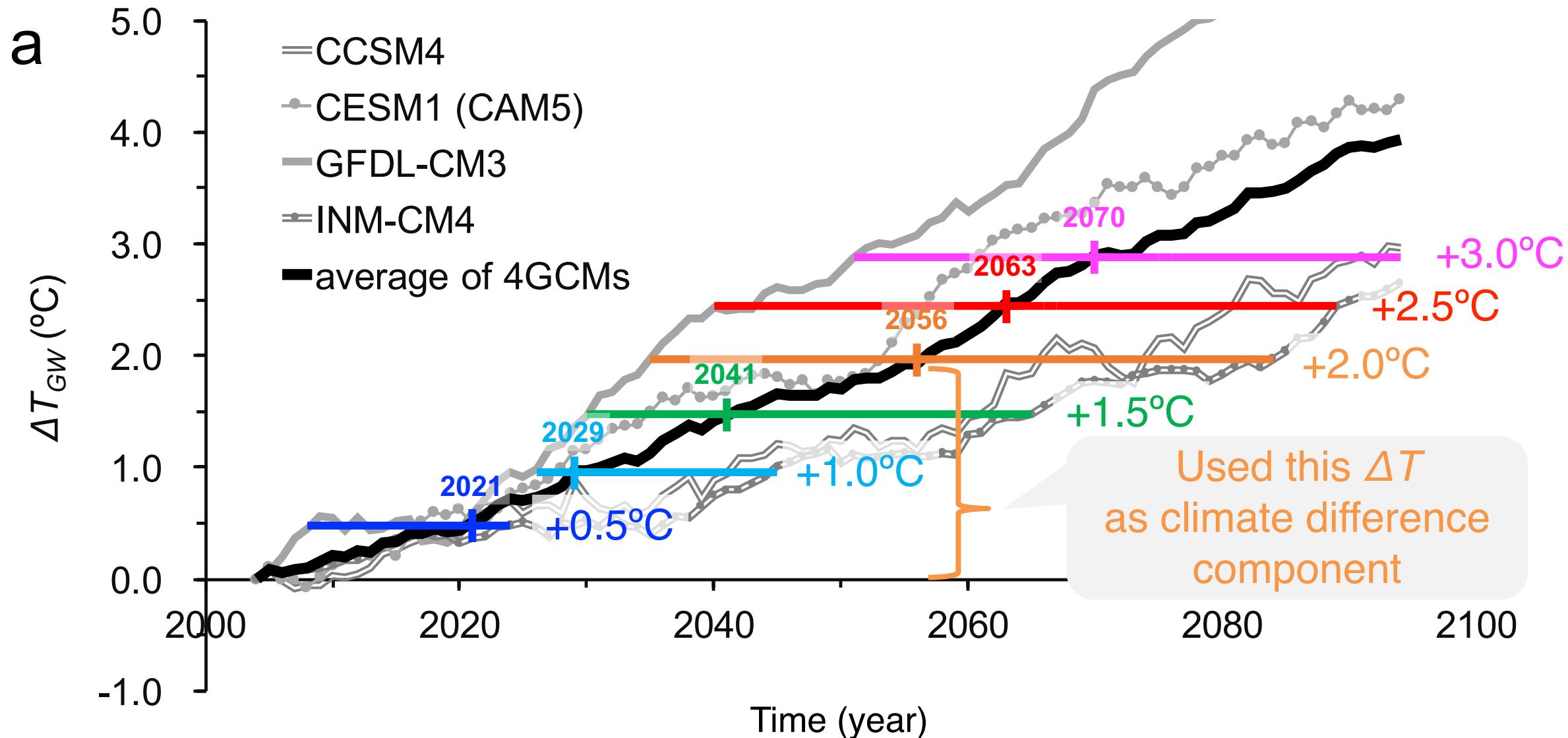
12

→ (hours)

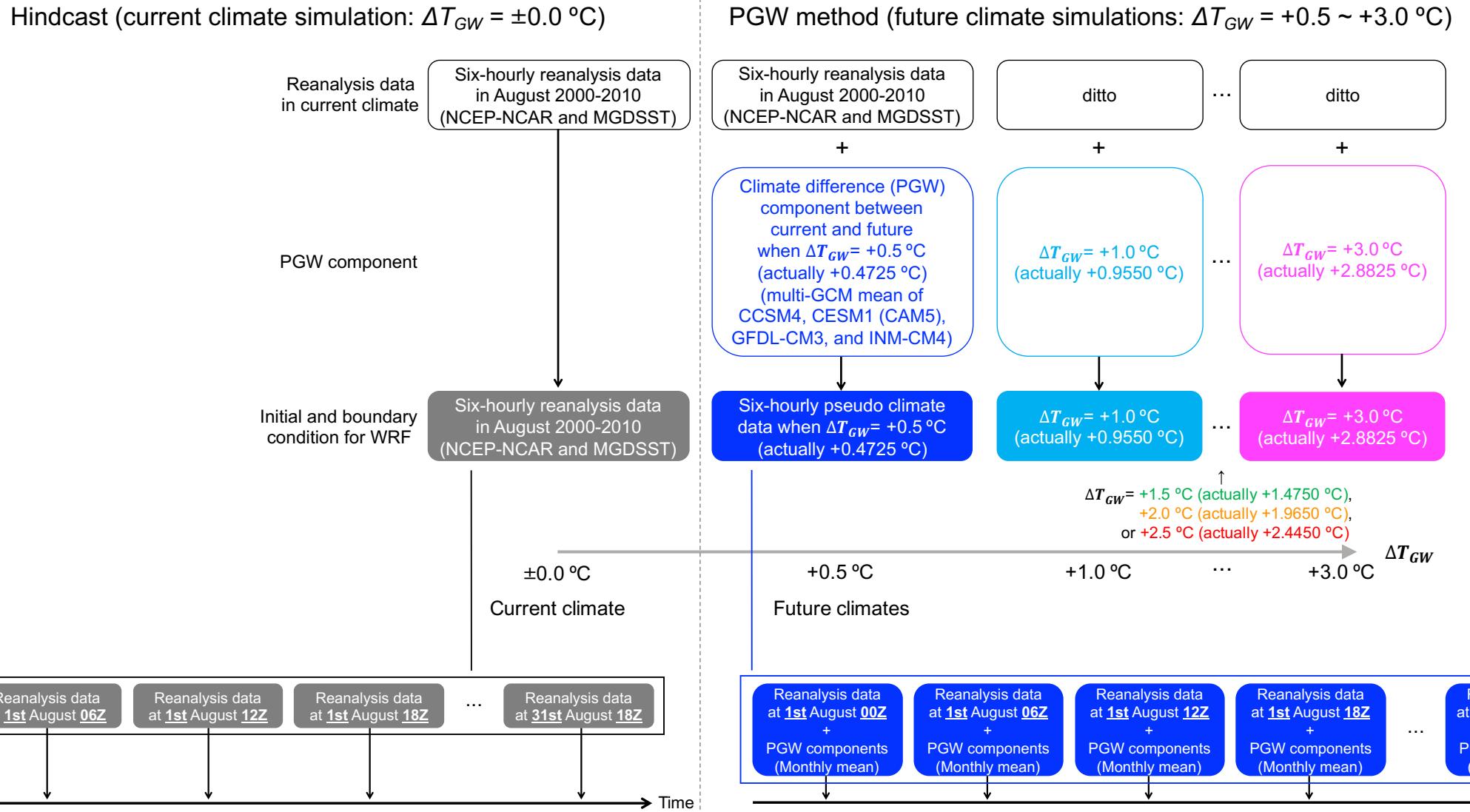
GFDL-CM3

inmcm4

# How to project future climate

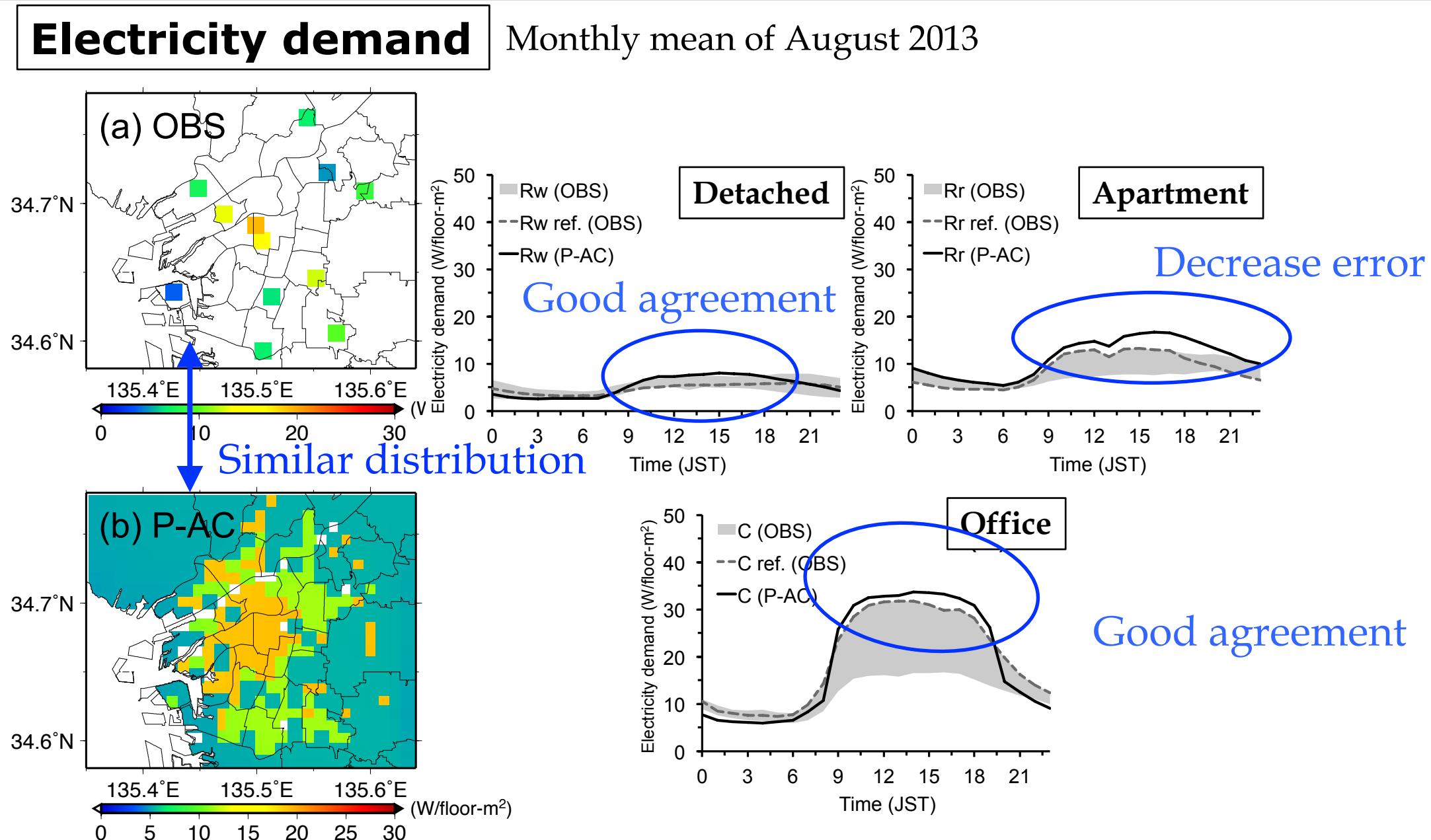


# How to project future climate

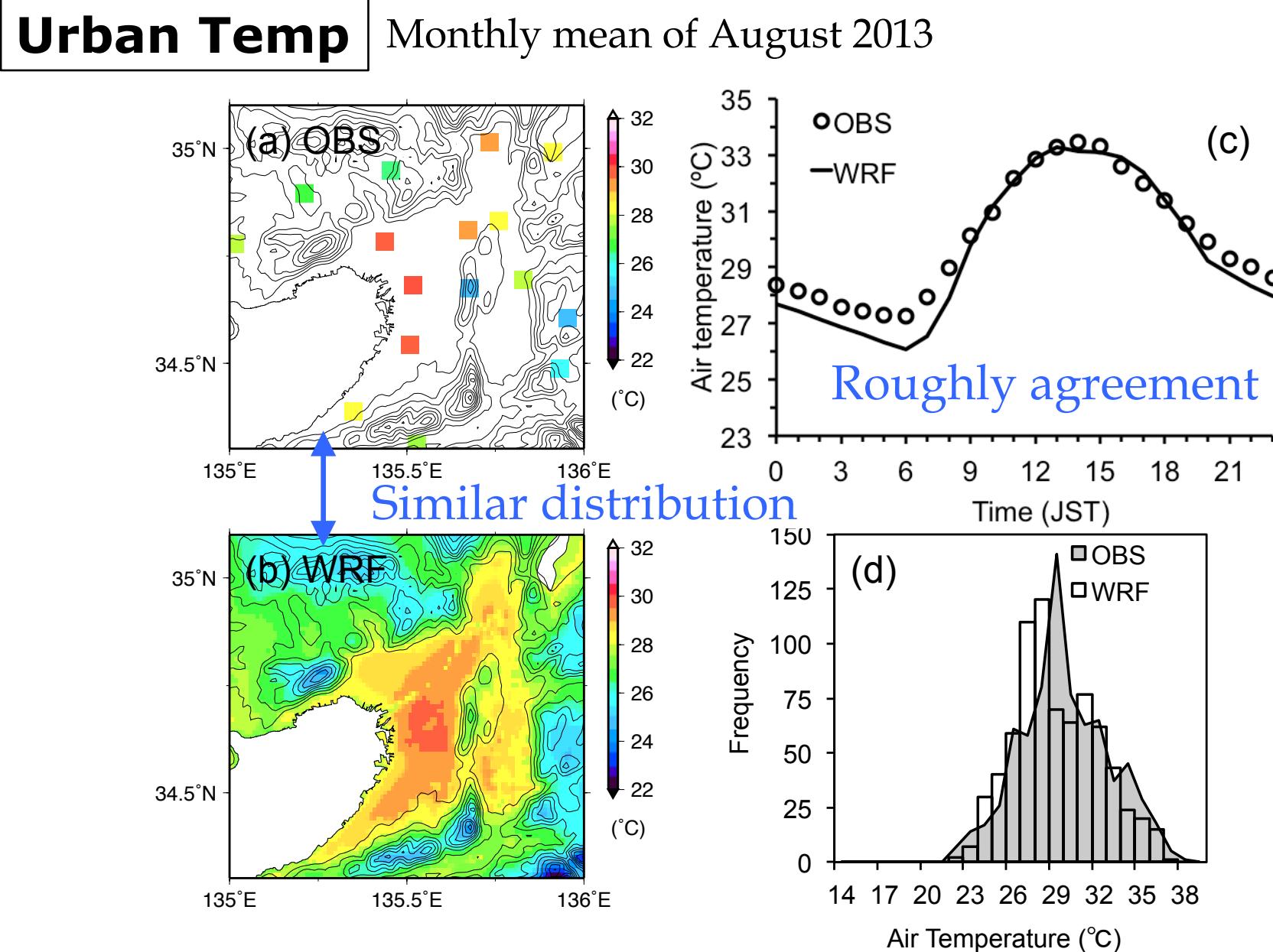


Urban categories	Facet Thickness (m) Number of layers	Material	Thermal conductivity (W m <sup>-1</sup> K <sup>-1</sup> )	Volumetric heat capacity (×10 <sup>6</sup> J m <sup>-3</sup> K <sup>-1</sup> )	Surface albedo (-)	Surface emissivity (-)
Commercial and office (C)	Roof 0.03 m 10 layers	Lightweight concrete /concrete/rock-wool board (ex 3 <sup>rd</sup> to 4 <sup>th</sup> layers)	0.520	1.4650	0.20	0.97
		Insulation (air gap/styrene foam) (3 <sup>rd</sup> to 4 <sup>th</sup> layers)	0.014	0.09346	-	-
		Tile/mortar/concrete/sealed air gap/plasterboard (ex 9th layer)	0.710	1.6950	0.20	0.97
		Insulation (air gap/styrene foam) (9th layer)	0.019	0.06675	-	-
		Window (glass)	Area fraction on the walls: 0.33			
	AC system	Electric air-source heat-pumps (rated COP=3.58 (cooling)): 100%				
		- Target room temperature: 27 °C (for cooling)				
		- Initial and end local times of AC system: 0800-1900 (LT)				
		Concrete/styrene foam/asphalt (ex 3 <sup>rd</sup> layer)	0.897	1.8150	0.20	0.97
		Insulation (air gap/styrene foam) (3 <sup>rd</sup> layer)	0.030	0.04376	-	-
Fireproof apartment (Rr)	Wall 0.0234 m 10 layers	Concrete/plasterboard (ex 9 <sup>th</sup> layer)	1.050	1.9340	0.20	0.97
		Insulation (air gap/styrene foam) (9 <sup>th</sup> layer)	0.042	0.03126	-	-
		Window (glass)	Area fraction on the walls: 0.18			
		Electric air-source packaged air conditioners (rated COP=5.03): 100%				
		- Target room temperature: 28 °C (for cooling)				
	AC system	- Initial and end local times of AC system: 0000-2400 (LT)				
		Slate/plywood/plasterboard (ex 5 <sup>th</sup> to 8 <sup>th</sup> layers)	0.181	0.5281	0.20	0.97
		Insulation (air gap/styrene foam) (5 <sup>th</sup> to 8 <sup>th</sup> layers)	0.032	0.02616	-	-
		Mortar/plywood/plasterboard (ex 5 <sup>th</sup> to 8 <sup>th</sup> layers)	0.323	0.9983	0.20	0.97
		Insulation (air gap/styrene foam) (5 <sup>th</sup> to 8 <sup>th</sup> layers)	0.032	0.02616	-	-
Wooden detached dwellings (Rw)	Roof 0.0095 m 10 layers	Window (glass)	Area fraction on the walls: 0.18			
		Electric air-source packaged air conditioners (rated COP=5.03): 100%				
		- Target room temperature: 28 °C (for cooling)				
		- Initial and end local times of AC system: 0000-2400 (LT)				

# The model successfully reproduced electricity demand



# The model successfully reproduced urban temperature



# AC settings

AC		COP	Target room temp
C	Electric air-source heat-pumps	3.58	27 °C
Rr	Electric air-source packaged air conditioners	5.03	28 °C
Rw	Electric air-source packaged air conditioners	5.03	28 °C

Energy demand

Sensible heat load of the build.

$$E_C = \frac{1}{COP} (H_{out} + E_{out})$$

coefficient of performance

Latent heat load of the build.

$$Q_A = (H_{out} + E_{out}) + E_C$$

