

# How much has China warmed?



*Photo: F. Zwiars (Lijiang countryside)*

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# Outline

- Introduction
- Urban warming effect
- Previous estimates
- Detection and attribution
- Application to quantifying urban warming
- Conclusions

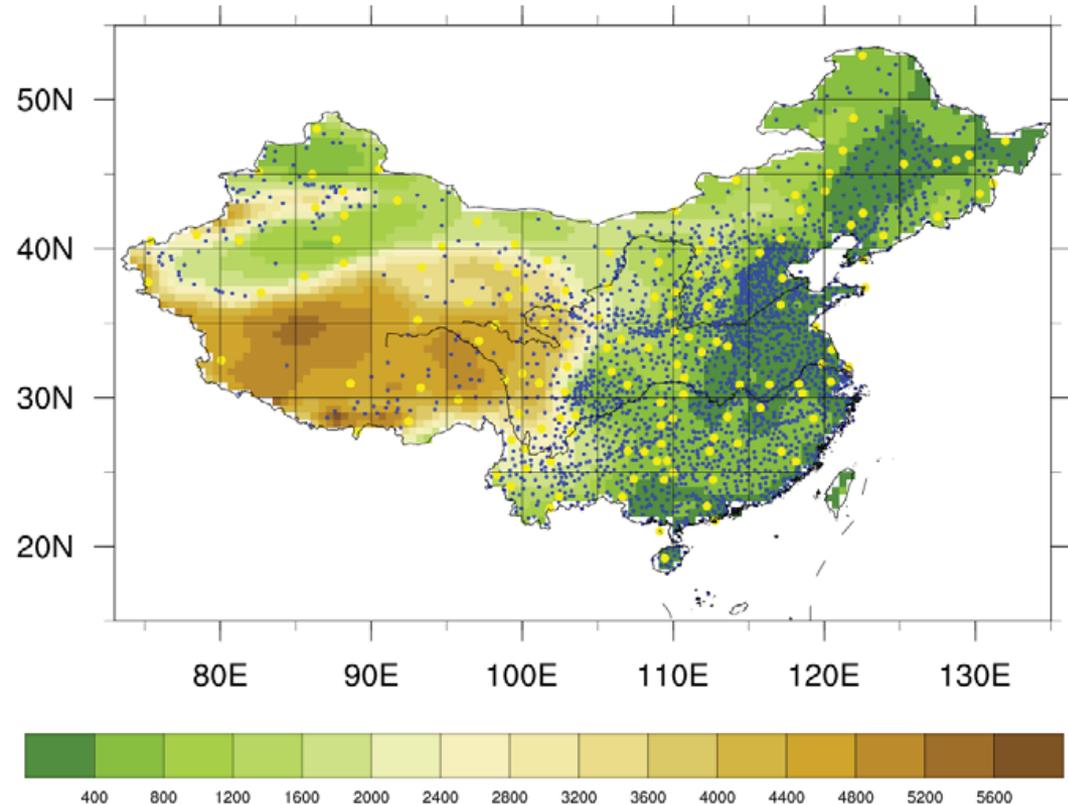


# Introduction

- China's surface temperature record indicates 1.44°C (90% confidence interval [1.22-1.66°C]) of warming over 1961-2013 (53 years)
- The global mean land temperatures warmed 1.09°C [0.86-1.31°C] over 1951-2010 (60 years)
- Why did China warm so much more quickly?
- One possibility is that the Chinese temperature record might be contaminated by the expansion of urban heat islands over this period
- This would lead an over-estimate of the average amount of warming across China

# Introduction

- Urban areas cover <1% of China's land mass
- But most observing stations subject to some kind of urban influence
- China's National Meteorological Information Centre provides 2419 homogenized stations (blue) for 1951-2013
- Ren et al ([2015](#)) identify 143 "rural" reference stations (yellow)
- Usual approach, which compares rural stations with all stations is uncertain and possibly biased low



How much did China really warm, and why?

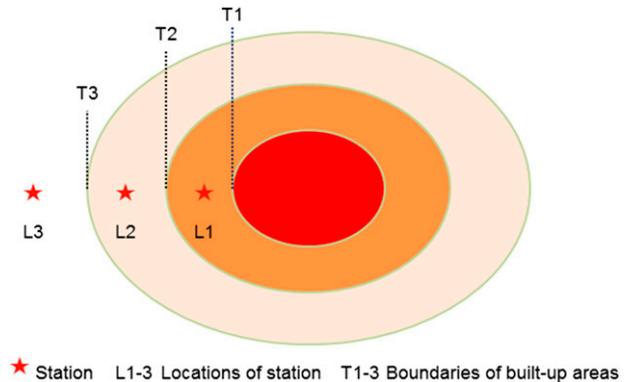
# Urban warming effect



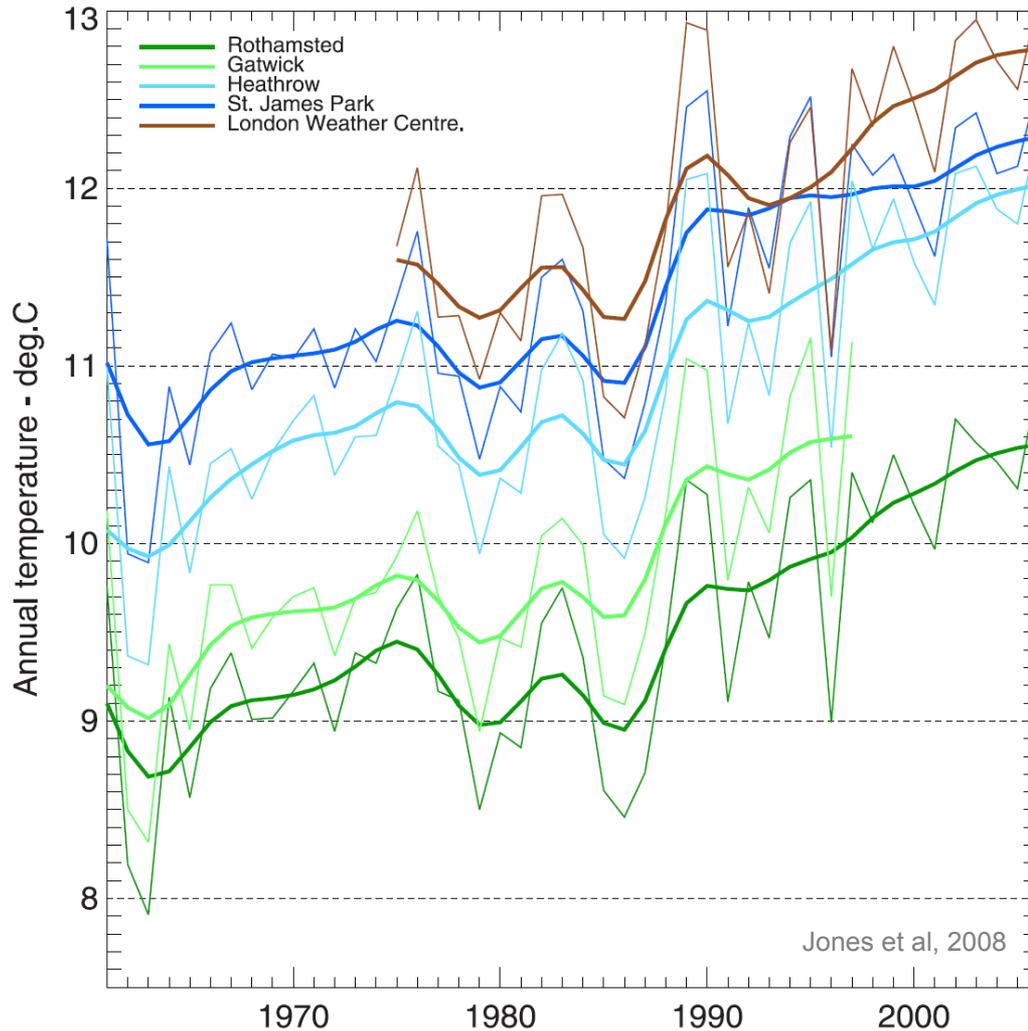
Photo: F. Zwiers (Lanzhou)

# Urban heat island effects

- Long-recognized effect (e.g., Howard, 1833)
- Location and history dependent
- London (Jones et al, 2008)
  - trends similar in urban and rural areas
  - urban region about 1.5-2.0°C warmer.
- New York City (Gaffin et al, 2008)
  - perhaps cause of 1/3 of warming in NYC since 1900
  - suggest skyline development may have played a role
- China (Jones et al, 2008)
  - rapidly developing
  - perhaps more than half of warming since 1954
  - very difficult to isolate UHI intensification from available data (very little rural data available)



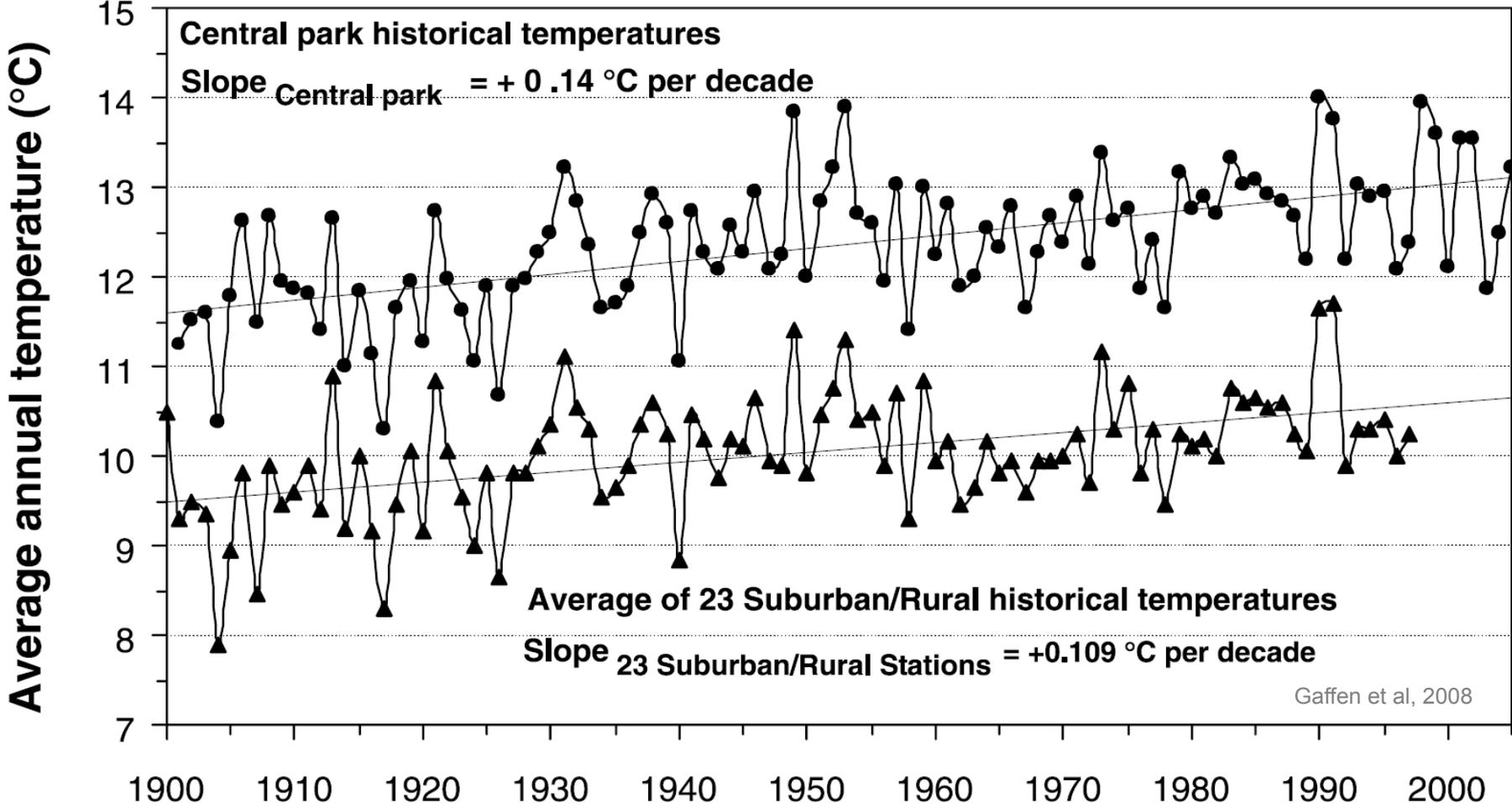
# Urban warming – London, UK



London Weather Centre  
St. James Park  
Heathrow Airport  
Gatwick Airport  
Rothamsted

- Rural, suburban and urban trends similar
- Notice also the common variability

# Urban warming - NYC



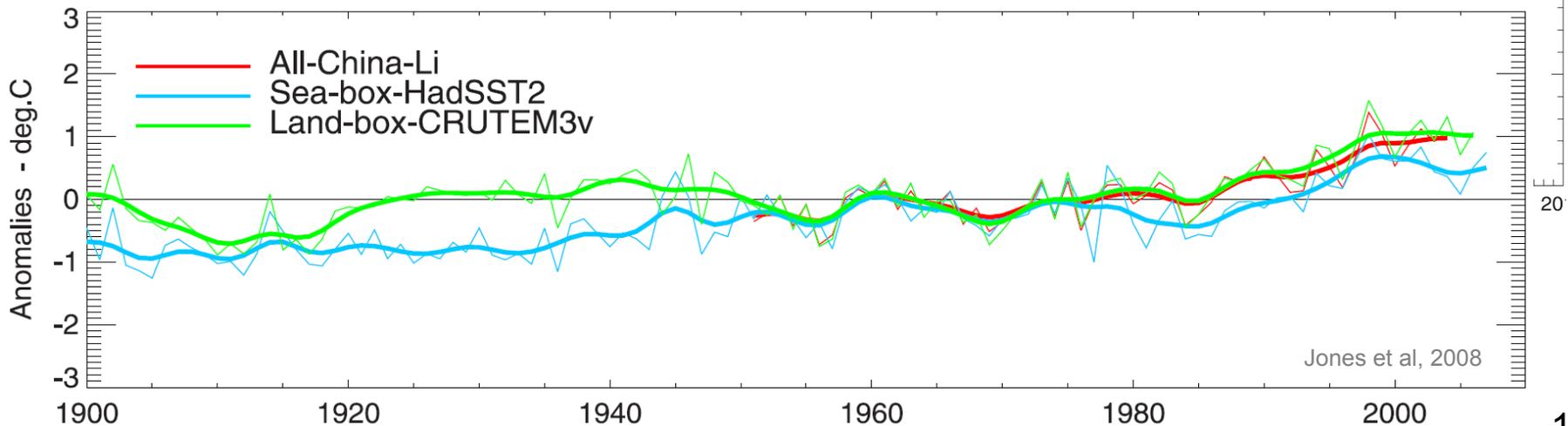
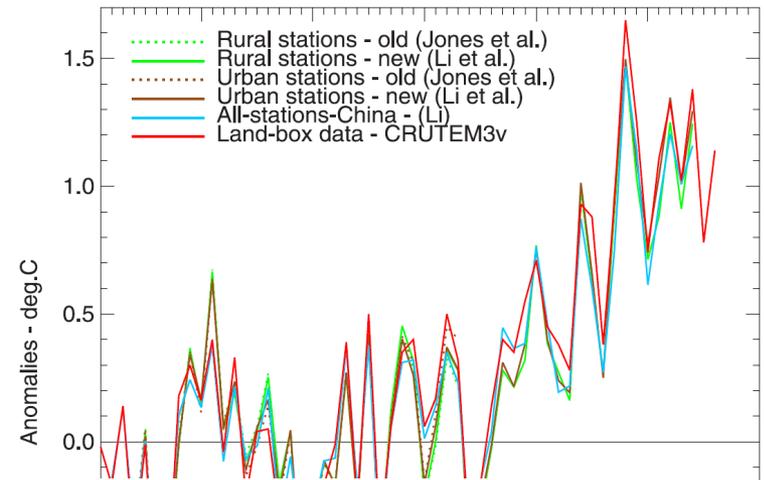
# Previous estimates of urban warming influence on China's temperature record



# Urban warming effects on Chinese data

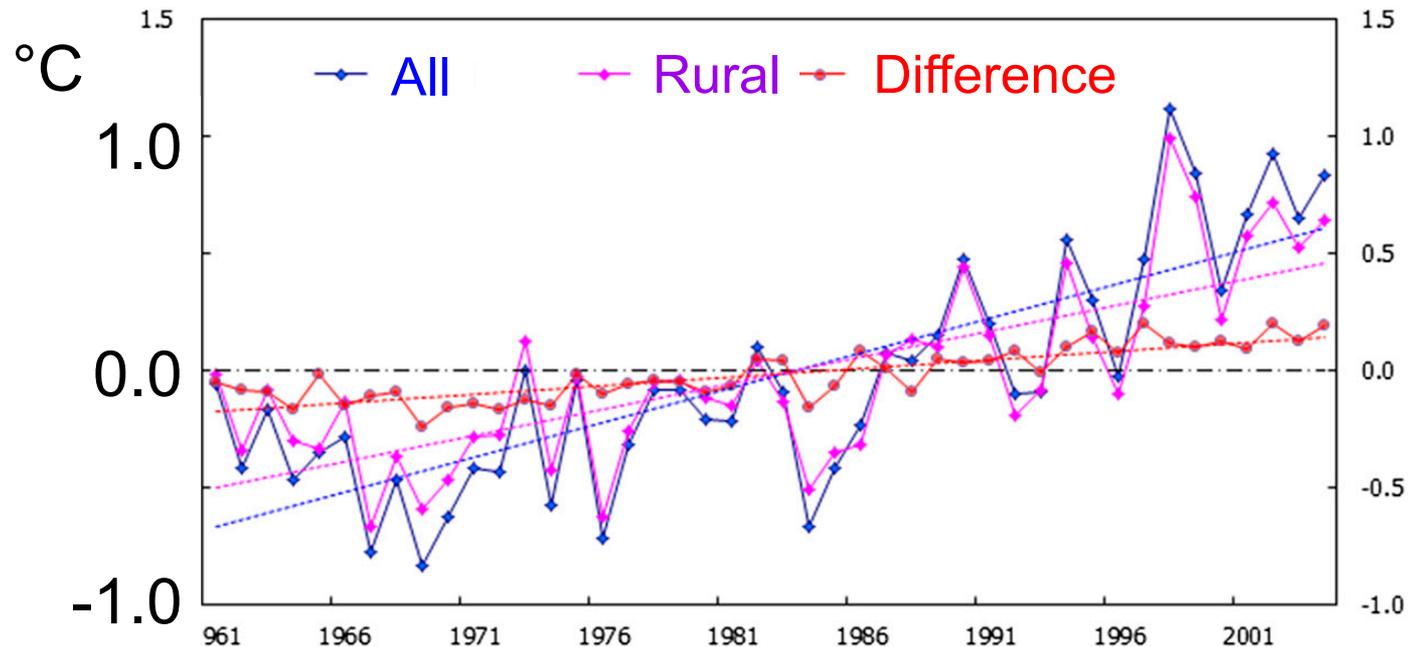
- Jones et al (2008) compare land temperatures with SSTs
- Land temperatures warmed  $1.19^{\circ}\text{C}$  to  $1.35^{\circ}\text{C}$  over 1951-2004 (depending on dataset used)
- Nearby SSTs warmed  $0.76^{\circ}\text{C}$
- Jones et al suggest difference is due to urbanization effect ( $\sim 0.5^{\circ}\text{C}$ , or  $\sim 40\%$  of recorded warming)

## China annual average (relative to 1954-1983)



# Urban warming effects on Chinese data

- Ren et al. (2015) compare rural reference stations with all stations (reference climate network and basic meteorological network) combined



- Difference  $\approx 25\%$  of recorded warming over 1961-2004 (0.32°C of 1.28°C)



# Detection and attribution of Long Term Climate Change

# Some definitions

- *Detection* of change is the process of demonstrating that the climate or a system affected by the climate has changed in some defined statistical sense
- *Attribution* is the process of evaluating the relative contributions of multiple causal factors to a change or event with an assignment of statistical confidence
- Casual factors refer to *external influences*
  - Climate: *anthropogenic* and/or *natural*
  - Systems affect by climate: *climate change*

# Methods

- Involve simple statistical models
- Complex implementation due to data volumes (which are both small and large)

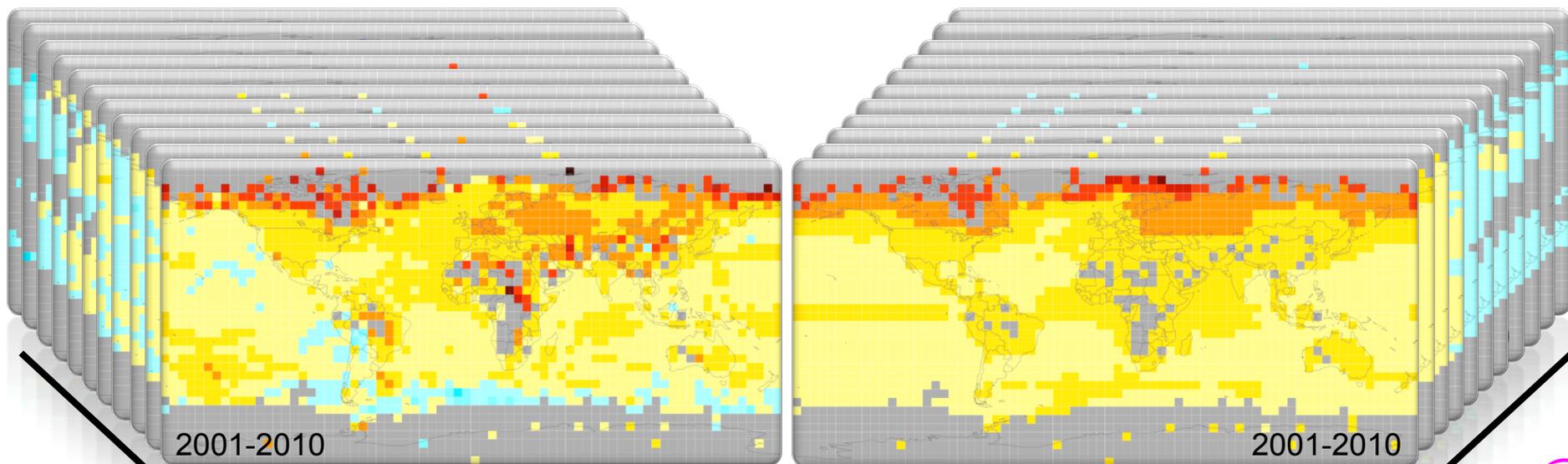
## Usual assumptions

- Key forcings have been identified
- Signals and noise are additive
- Model simulation of large-scale forcing response patterns ok, but signal amplitude is uncertain

→ leads to a regression formulation

Observations (HadCRUT4)

Multi-model mean (ALL forcings)



11 decades (1901-1911 to 2001-2011)

$\mathbf{Y}$

$\mathbf{X}$

$$\mathbf{Y} = \mathbf{X}\boldsymbol{\beta} + \boldsymbol{\varepsilon}$$

Evaluate  
scaling factors

$\hat{\boldsymbol{\beta}}$

$\hat{\boldsymbol{\varepsilon}}$

Evaluate  
residuals

After Weaver and Zwiers (2000)

# That formulation has been evolving

$$Y = \sum_{i=1}^S \beta_i X_i + \epsilon$$

$$Y = Y^* + \epsilon_y$$

$$X_i = X_i^* + \epsilon_{x_i}$$

$$Y^* = \sum_{i=1}^S \beta_i X_i^*$$

$$Y = Y^* + \epsilon_y$$

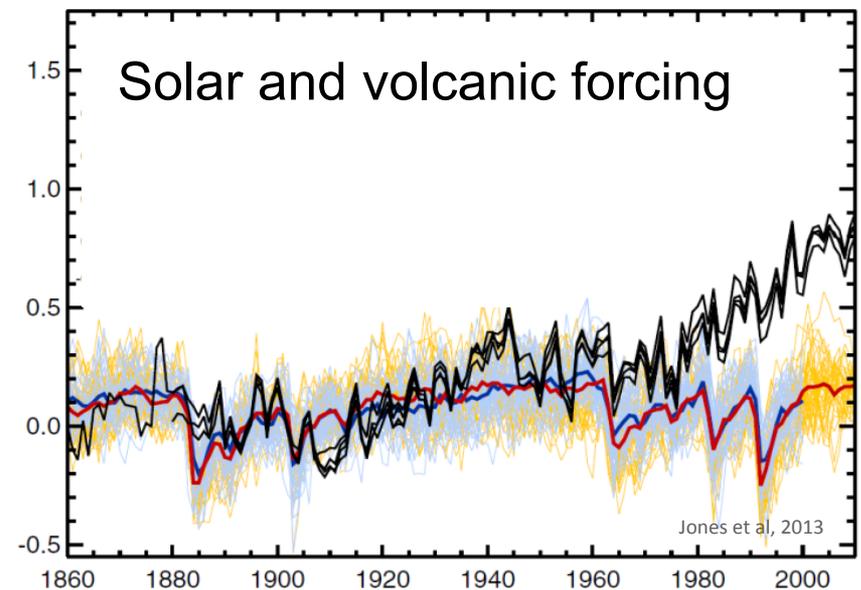
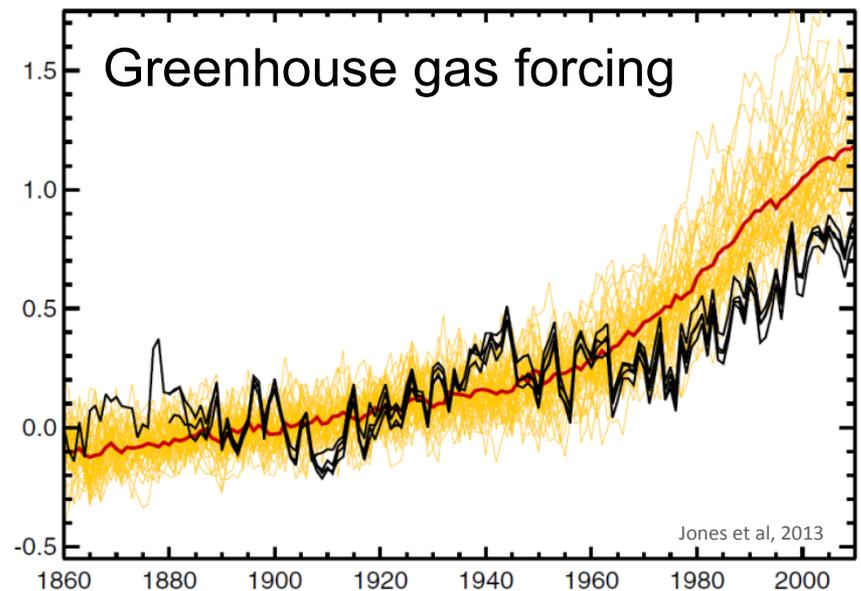
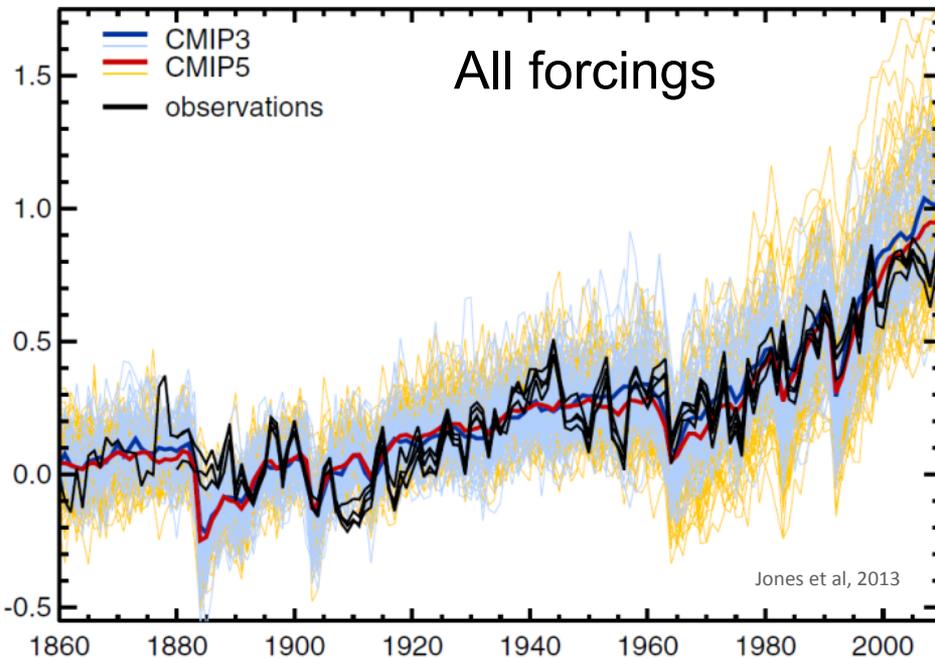
$$X_i = X_i^* + \epsilon_{x_i}$$

$$Y^* = \sum_{i=1}^S X_i^*$$

- Hasselmann (1979, [1993](#))
- Hegerl et al ([1996](#), [1997](#))
- Tett et al ([1999](#))
- Allan and Stott ([2003](#))
- Huntingford et al ([2006](#))
- Hegerl and Zwiers ([2011](#))
- Ribes et al ([2013a](#), [2013b](#))
- Hannart et al ([2014](#))
- Hannart (2015, accepted)

- Ribes et al (in review)

# Global mean temperature anomaly



It is ***extremely likely*** that human influence has been the dominant cause of the observed warming since the mid-20th century.

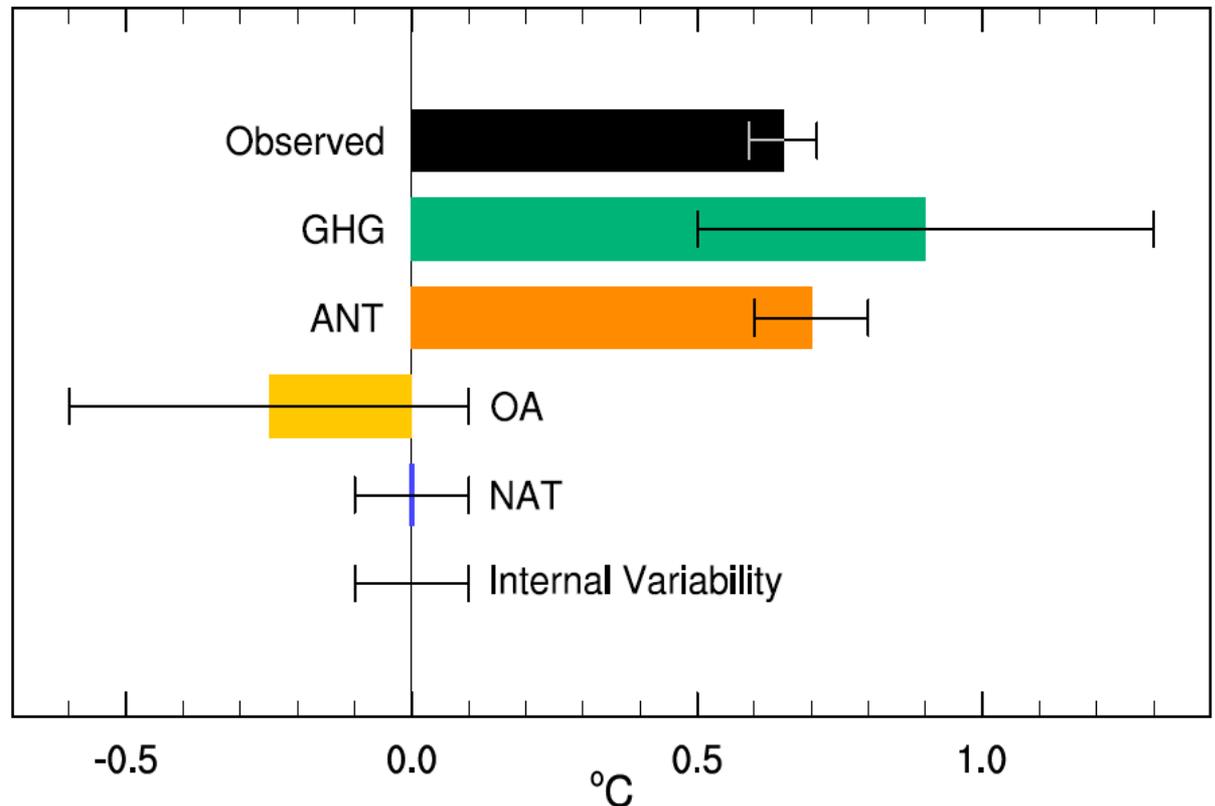
# Mechanics of the attribution process

- Gather observations  $Y$
- Estimate signals  $X_i, i=1, \dots, s$
- Fit the regression model
- Evaluate residuals and  $\beta_i, i=1, \dots, s$
- Calculate trends in  $\beta_i X_i^*$

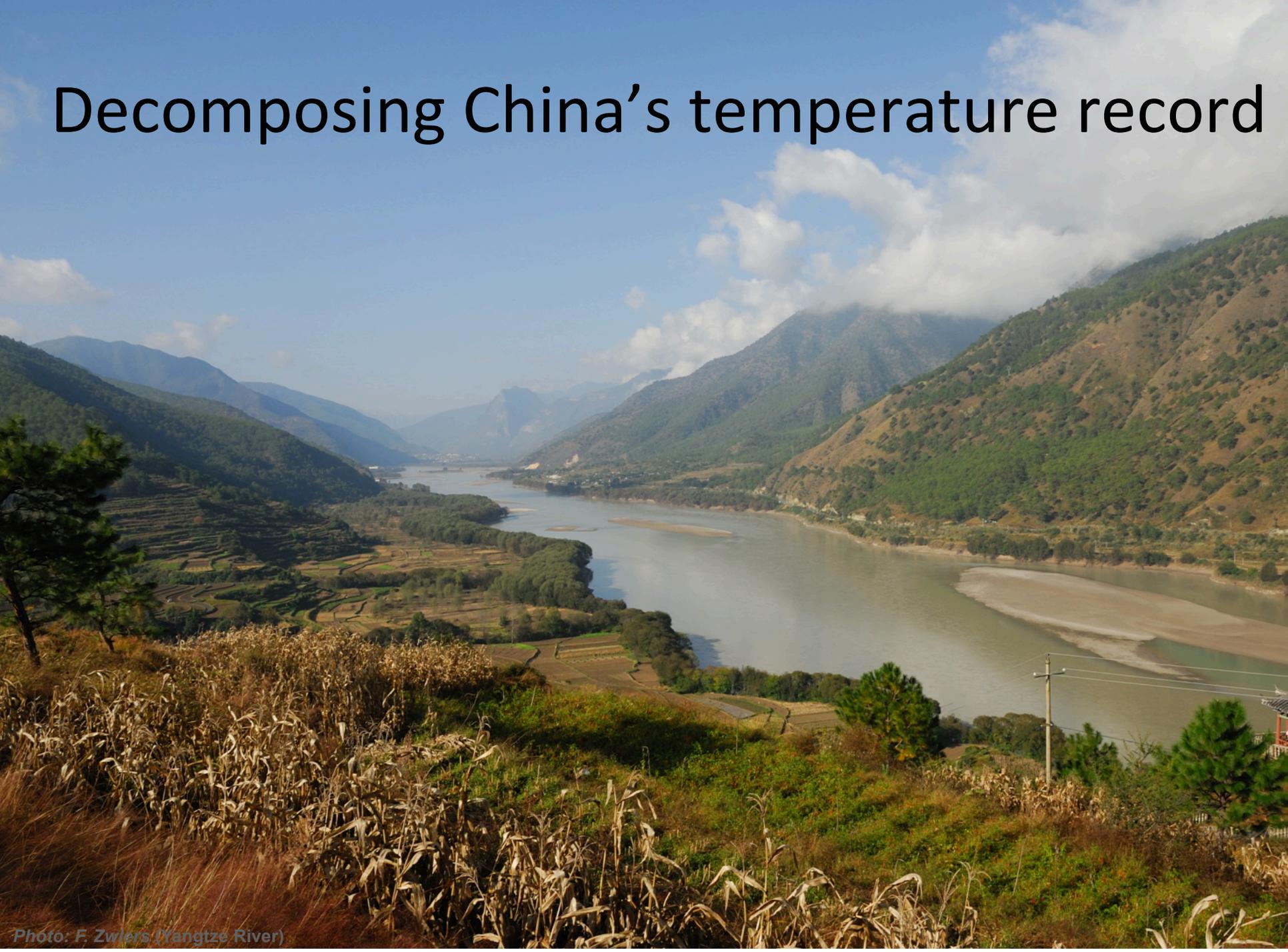
$$Y = Y^* + \epsilon_y$$
$$X_i = X_i^* + \epsilon_{x_i}$$
$$Y^* = \sum_{i=1}^s \beta_i X_i^*$$

Observed warming trend and 5-95% uncertainty range using HadCRUT4 (black).

Attributed warming trends with assessed *likely* ranges (colours) using CMIP5 historical and control simulations



# Decomposing China's temperature record



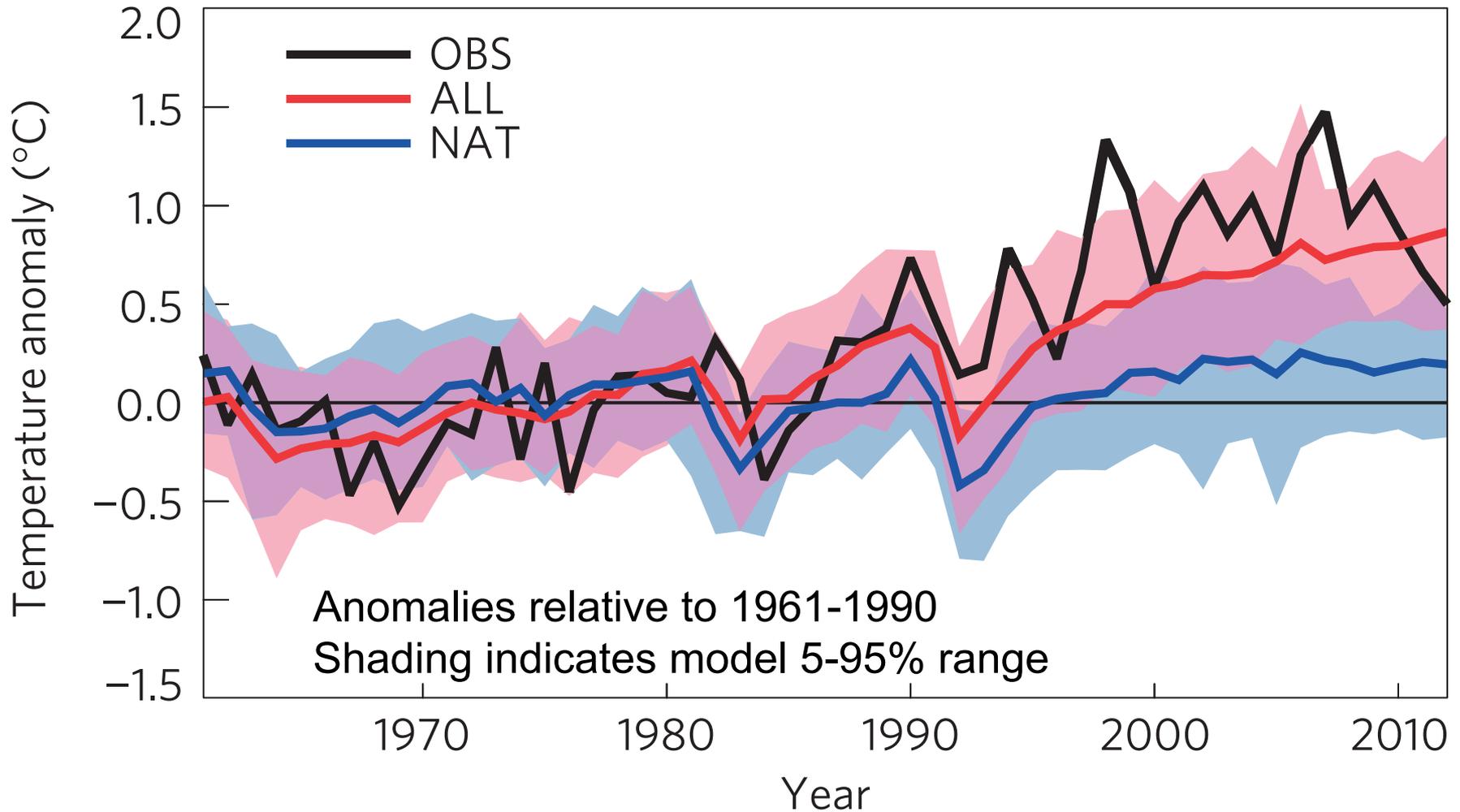
# Idea

- Recorded warming is the result of
  - Response to external forcing
    - Greenhouse gas increases (GHG)
    - Other Anthropogenic influences (OANT)
    - Solar and volcanic influences (NAT)
  - Effect of urbanization (URB)
  - Internal variability (noise)
- Use a detection and attribution method to decompose the observed temperature record into
  - 2 components + noise
    - ALL (GHG+OANT+NAT combined)
    - URB
  - 4 components + noise

# Implementation

- Construct observational vector  $Y$ 
  - Consider the period 1961-2012 (52 years)
  - Divide China into two parts (east and west)
  - Calculate 3-year mean temperature anomalies for each region (17 values for each region, ending with 2009-2011)
  - Append the 2012 anomaly as an 18<sup>th</sup> value to complete the record
  - Total length of  $Y$  is  $2 \times 18 = 36$
- Estimate the ALL, GHG and NAT signals ( $X_{ALL}$ ,  $X_{GHG}$ ,  $X_{NAT}$ ) from CMIP5 simulations
  - ALL: 23 models, 108 simulations
  - GHG: 7 models, 33 simulations
  - NAT: 8 models, 36 simulations
- Estimate internal variability
  - Control simulations (41 models, 346 chunks) and within-ensemble differences

# Observed and simulated mean temperature change in China



# What about the URB signal?

- Use sigmoid functions (continuous, positive, with 0 and 1 as left and right asymptotes)

- 3-parameter logistic function

$$f(t) = L / (1 + e^{-k(t-t_0)})$$

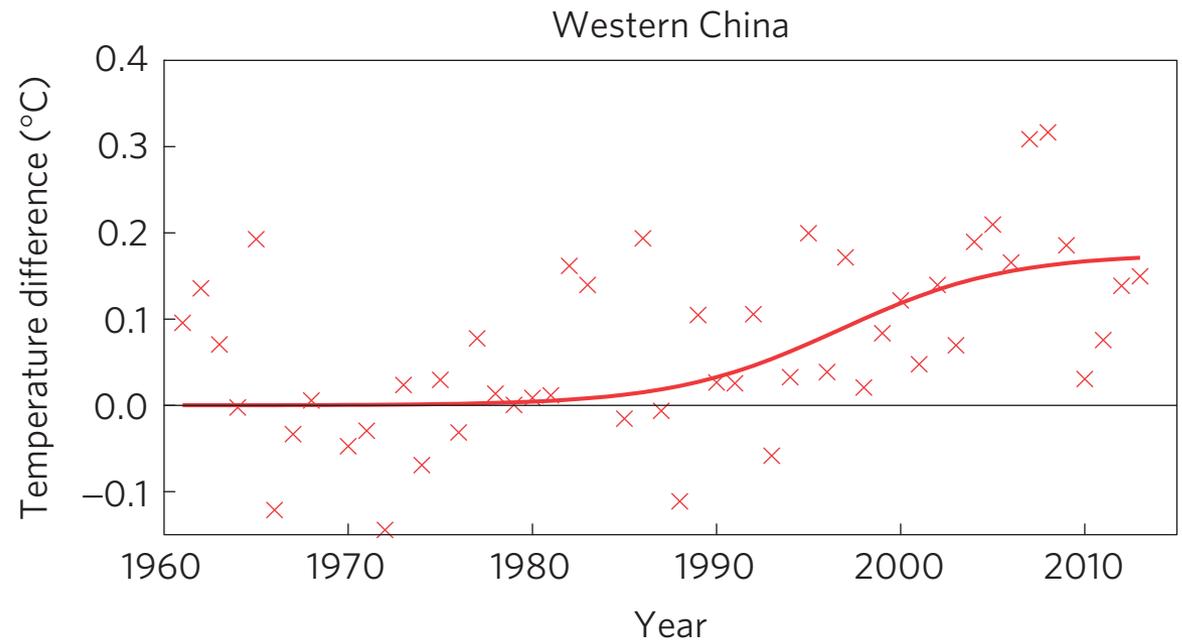
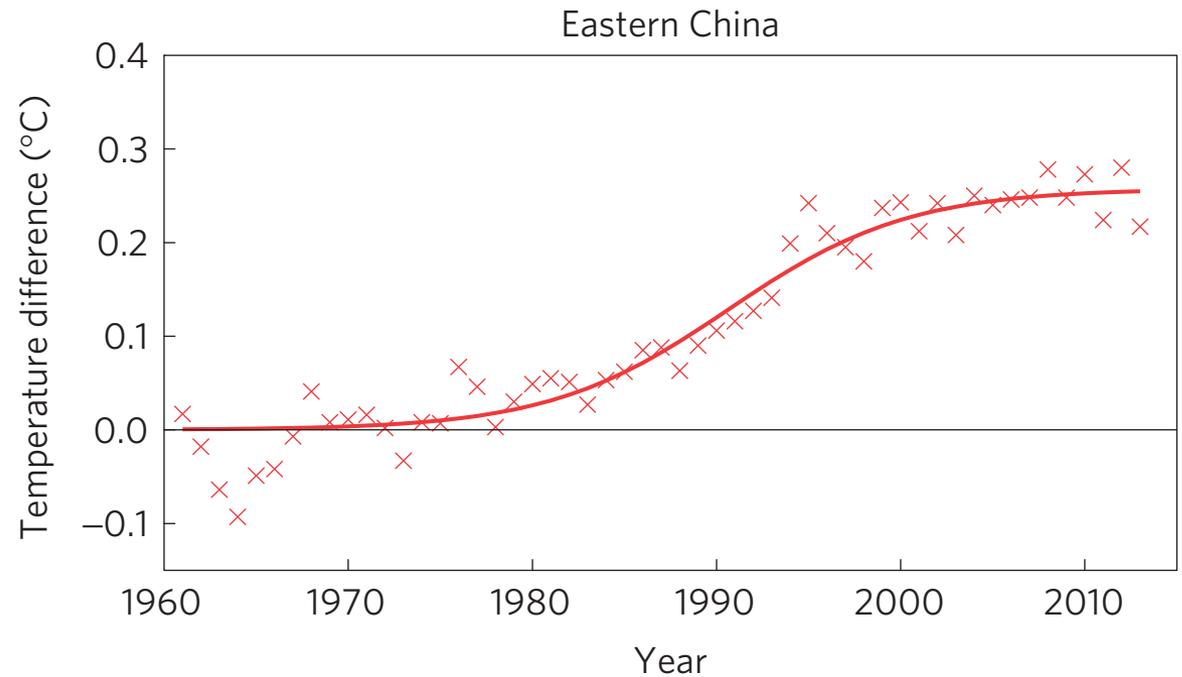
- $t_0$  is the midpoint
  - $L$  is the maximum
  - $k$  is the steepness
- Fit these functions to urban - rural temperature differences
- Separate functions for east and west China

# Why sigmoid functions?

- The urbanization effect is unlikely to be reversed
  - The URB signal should be monotone increasing
- The urbanization effect does not increase temperatures indefinitely
  - The URB signal should asymptote at some level after the urban heat island is established
- The urbanization effect is established slowly as an urban center expands; we assume minimal urbanization effects during the 1960's and 1970's
- The regional URB signal in eastern China will be different from that in western China.

# URB signal estimates

Area weighted combined urban-rural warming is about  $0.27^{\circ}\text{C}$

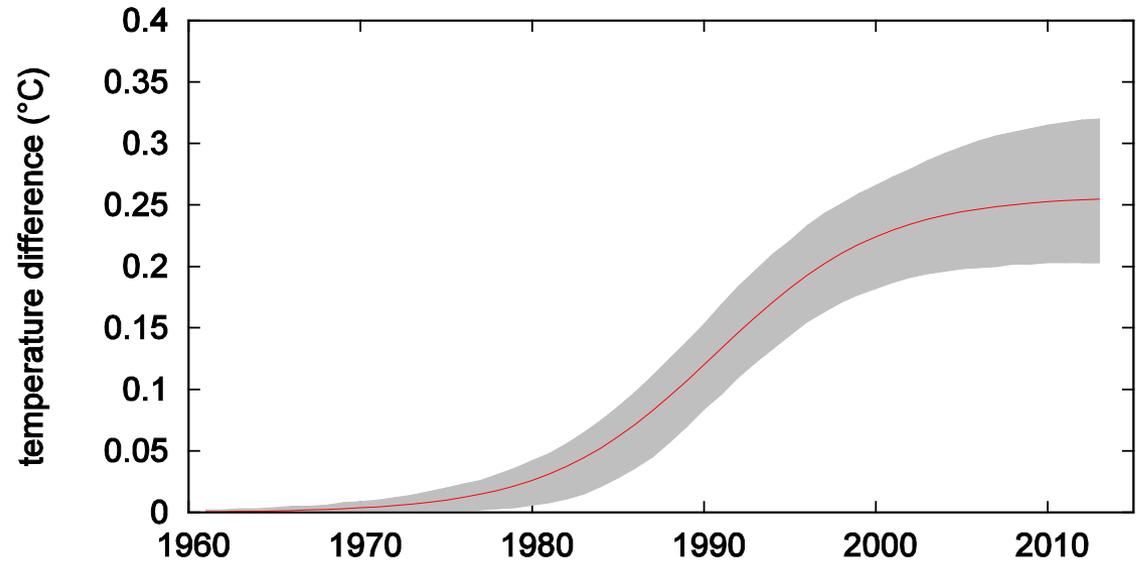


# URB signal uncertainty

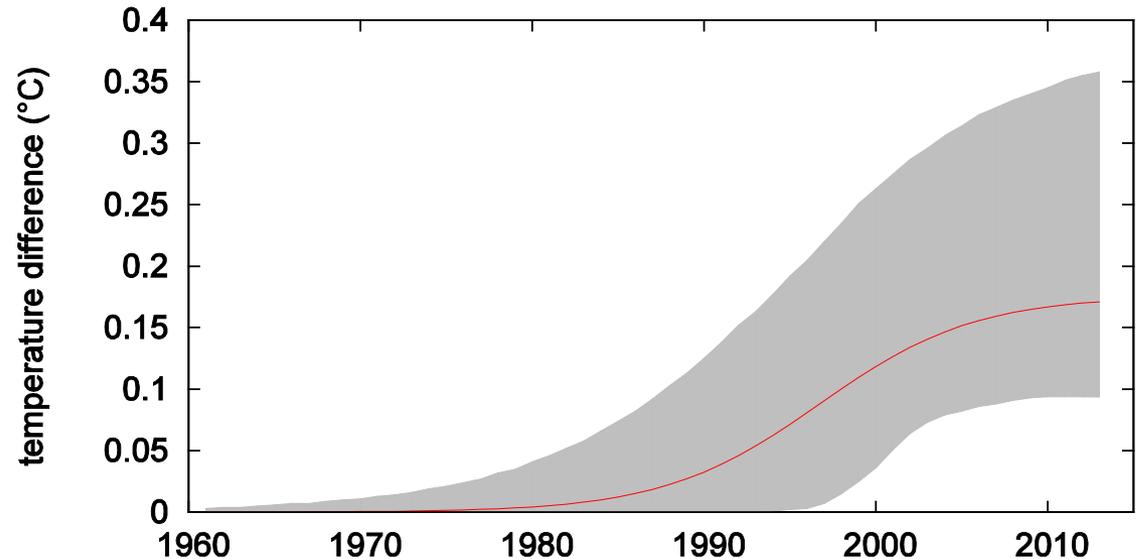
Based on a  
bootstrapping  
approach

Shading indicates  
5-95% amongst  
1000 bootstrap  
samples

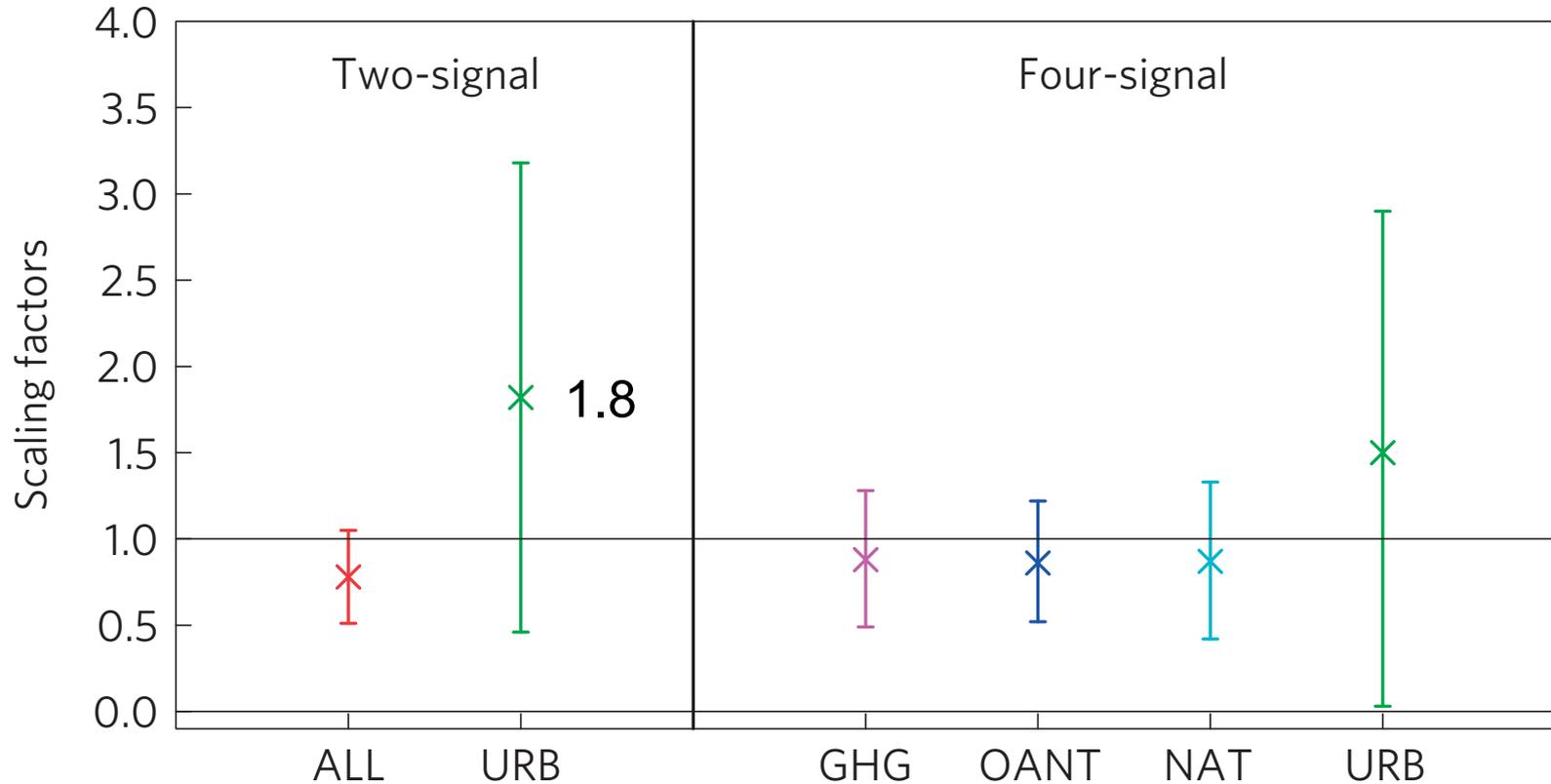
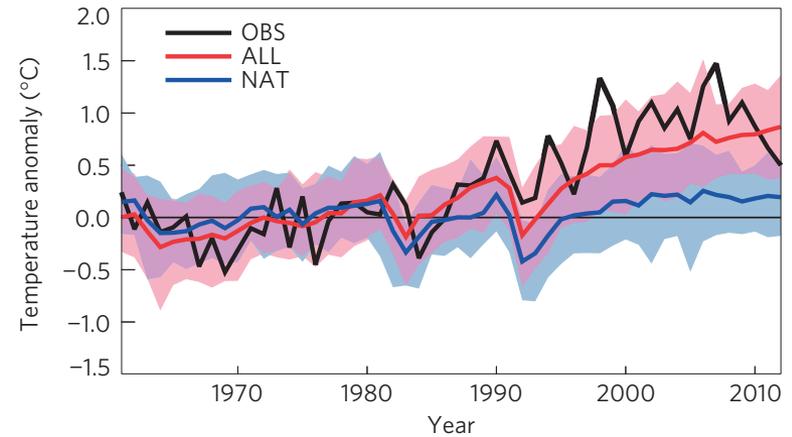
a) Eastern China



b) Western China

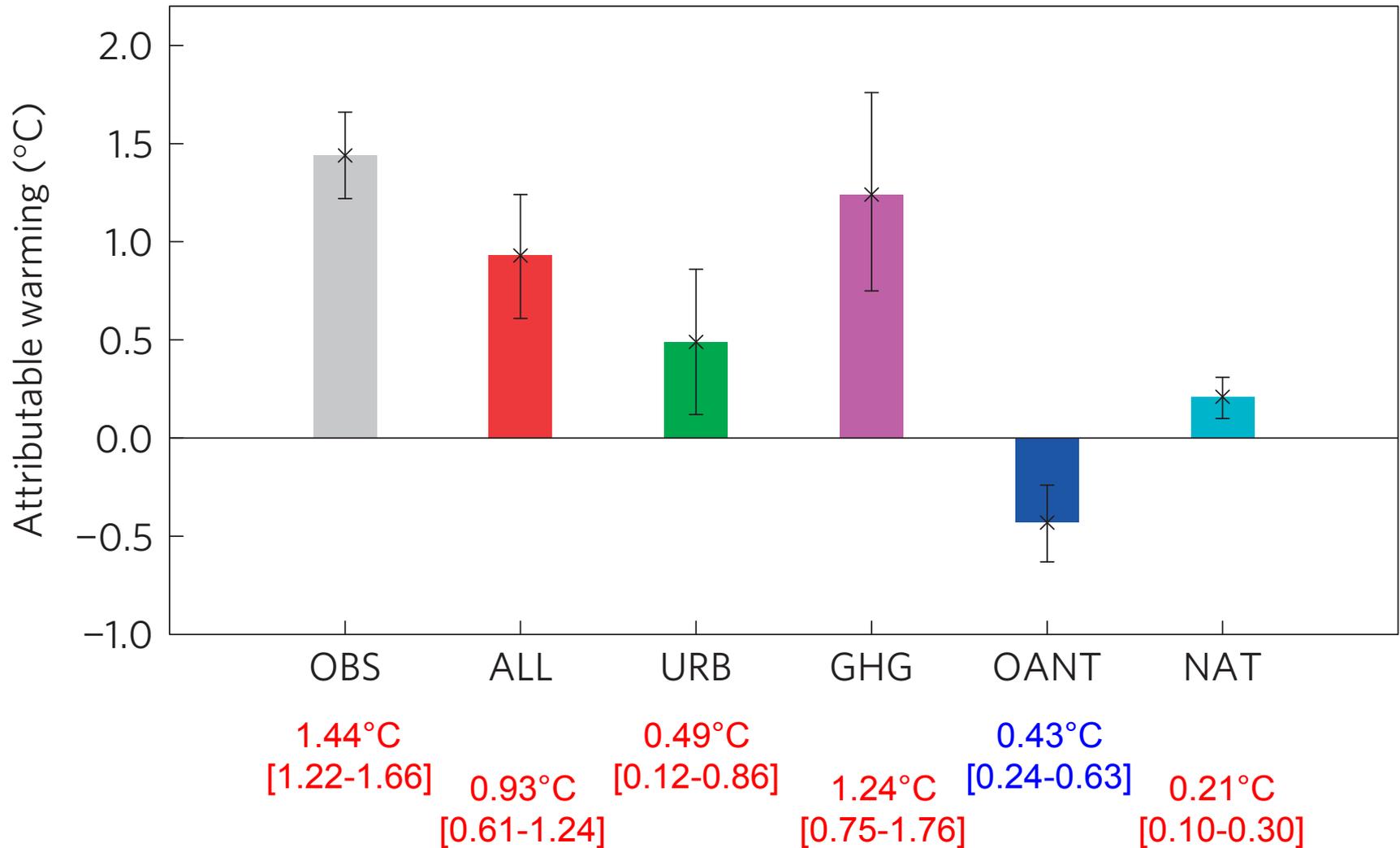


# Results – scaling factors



URB detection is robust to URB signal uncertainty

# Results – warming contributions





# Conclusions

# Conclusions

- China's observing system records temperatures that are broadly influenced by urban warming
- Thus the warming of the Chinese land-mass is likely overestimated
- Comparison between urban and rural stations appears to lead to an underestimate of the strength of the urbanization influence
- A detection and attribution formalism allows decomposition of China's temperature record into externally forced, urbanization induced and internal variability induced components of change
- Results suggest about 1/3<sup>rd</sup> of the recorded warming is due to urbanization
- Anthropogenic and natural external forcing combined are estimated to have caused 0.93°C [0.61-1.24], consistent with the observed global land mean warming 1.09°C [0.86-1.31]

# Questions?



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*Photo: F. Zwiers (Big Trout Lake, Algonquin Park)*