

# Direct economic cost of future heat death estimates for India under climate change and population scenarios

## AMS100

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# Heatwaves

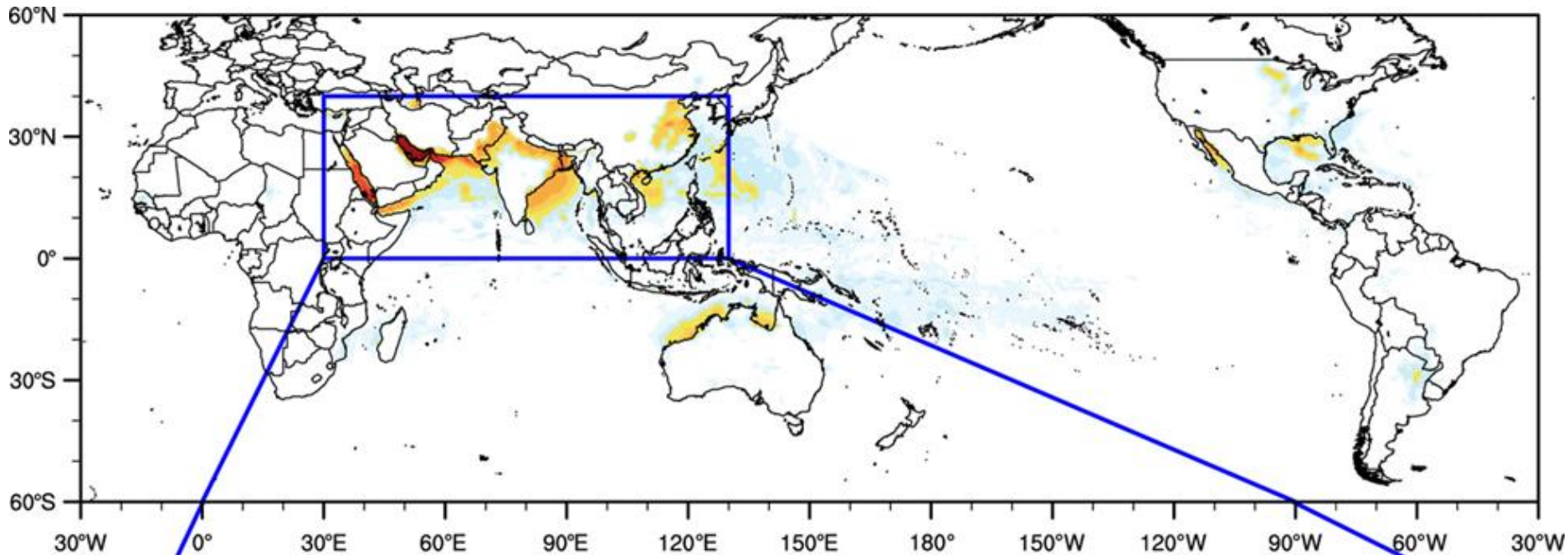
## Now

- European (2003) – 70,000 dead
- Russian (2010) – 56,000 dead (?)
- US - several
  - California
  - Chicago
  - LA
  - Others
- India – almost an annual occurrence now

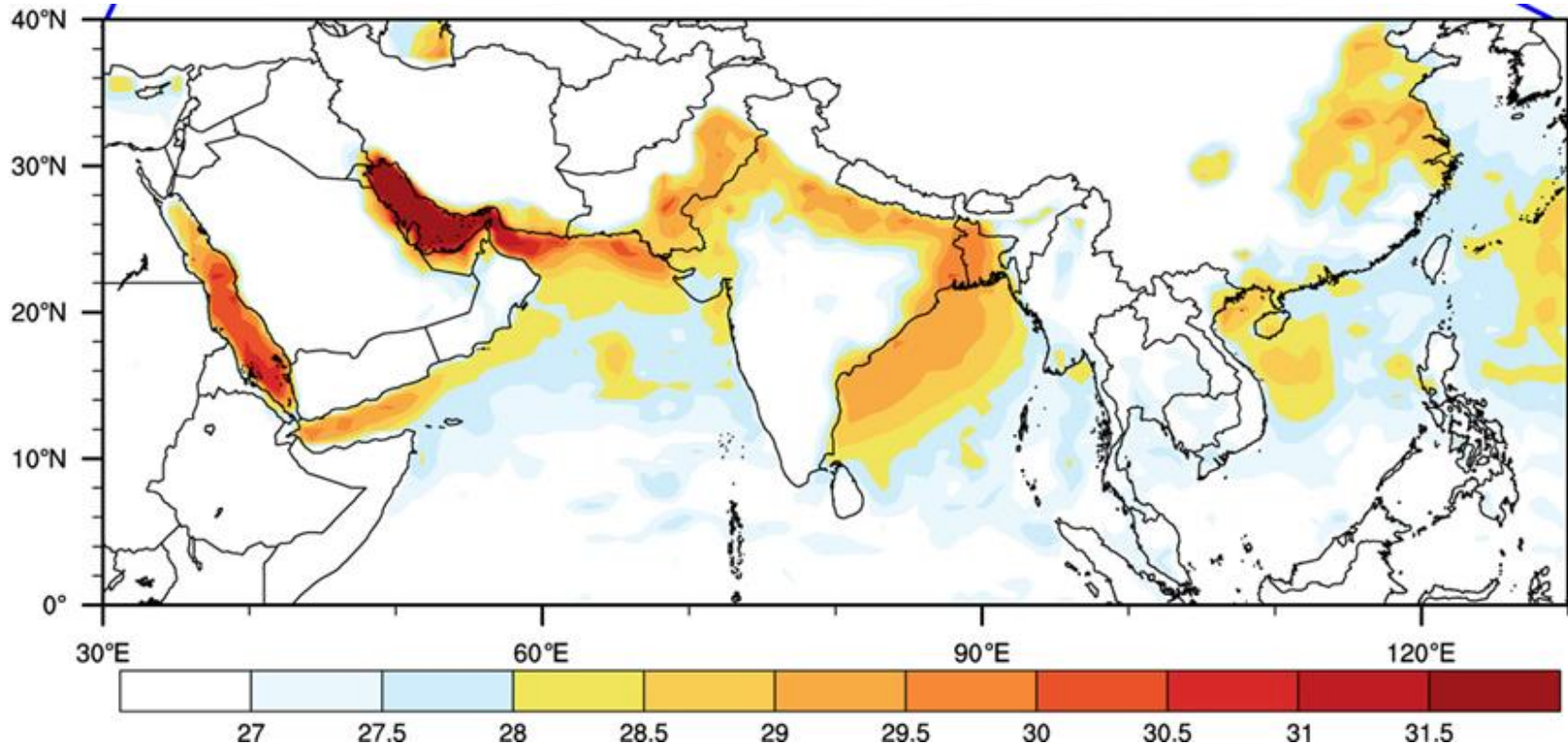
## Future

- Future temperatures in SW Asia are projected to exceed threshold for human adaptability
- Heavily populated cities e.g. Delhi could have temperatures  $> 95^{\circ}$  F ( $35^{\circ}$  C) up to 200 days per year
- Likely to increase:
  - Frequency, Intensity, Duration, Deaths

# Countries at Risk from Heatwaves



# Countries at Risk from Heatwaves



# Mortality estimates and costs

**Aim1**: Estimate future deaths under various climate change scenarios

**Aim2**: Estimate direct economic costs associated with these deaths

# Methods

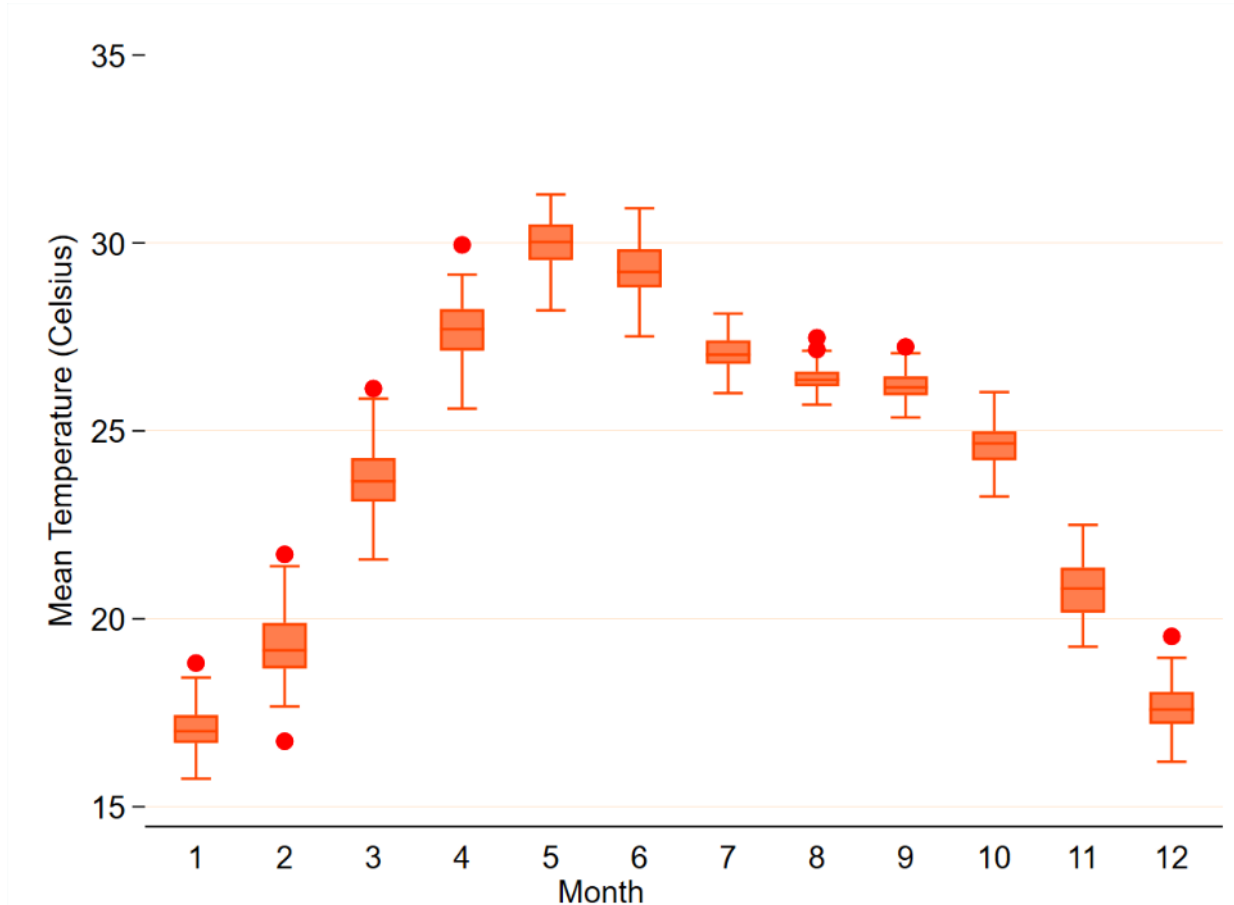
## Data

- Deaths:
  - India's NDMA, NCRB, EM-DAT, Articles
  - GBD
- Temperatures – WB Climate data portal
- Population & mortality - United Nation (UN) population projections

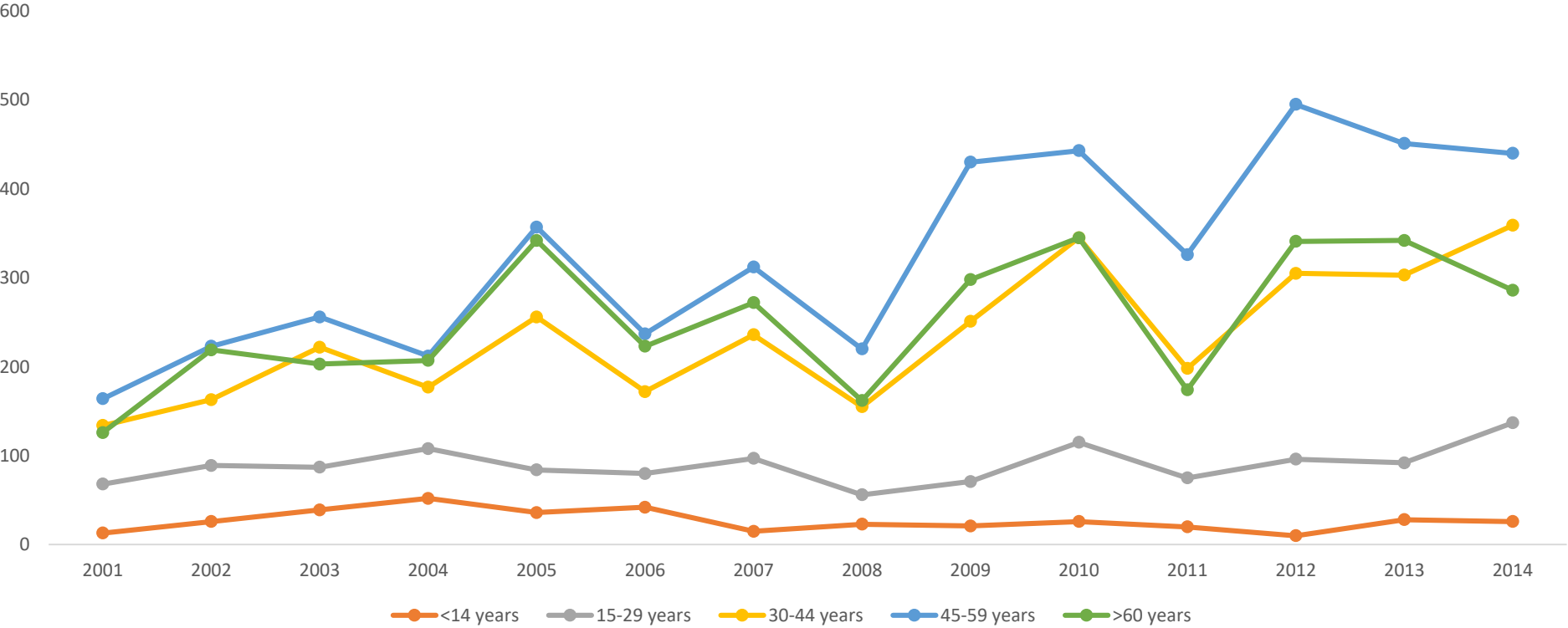
## Analysis

- Descriptive & calculated temp indices
- E-R function using Poisson & Neg Bi models
- Deaths (5-yr) in increments
- Array multiplication with temp increases
- Direct economic costs using VSL

# Monthly Temperatures

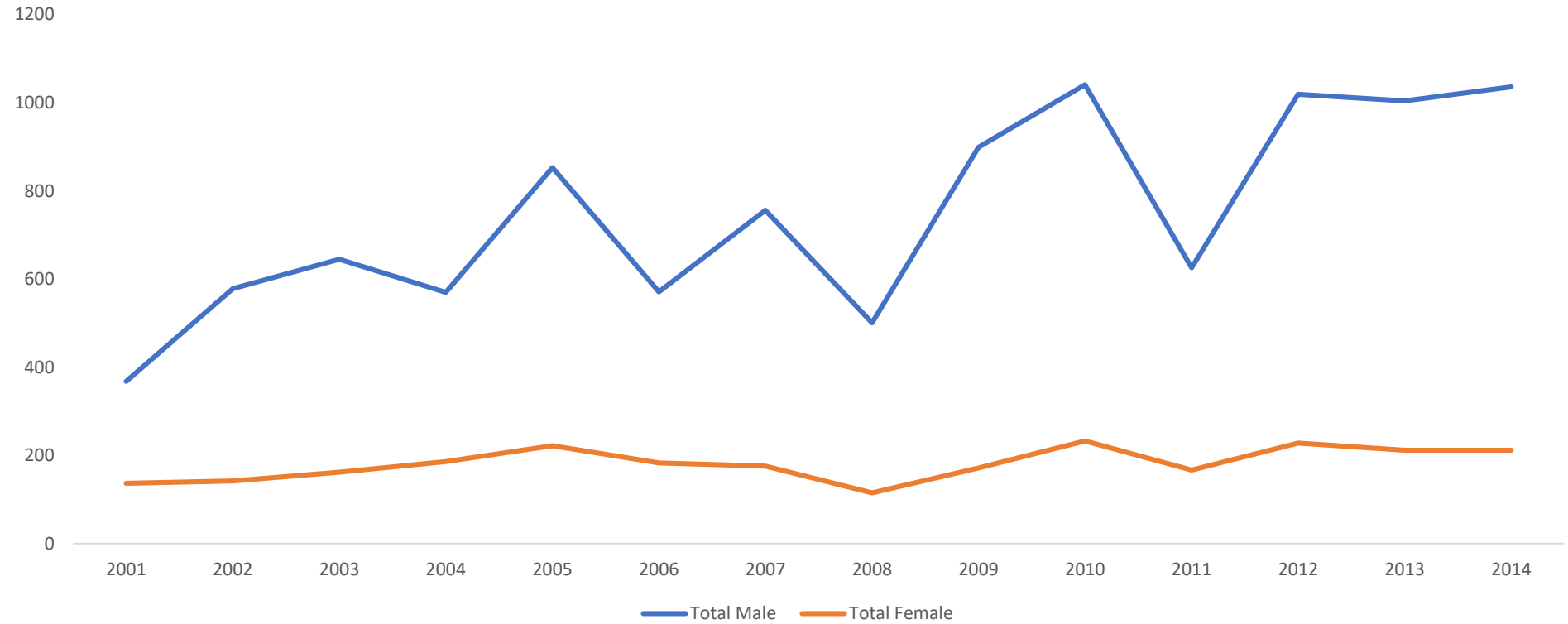


# Annual heat deaths by age-groups





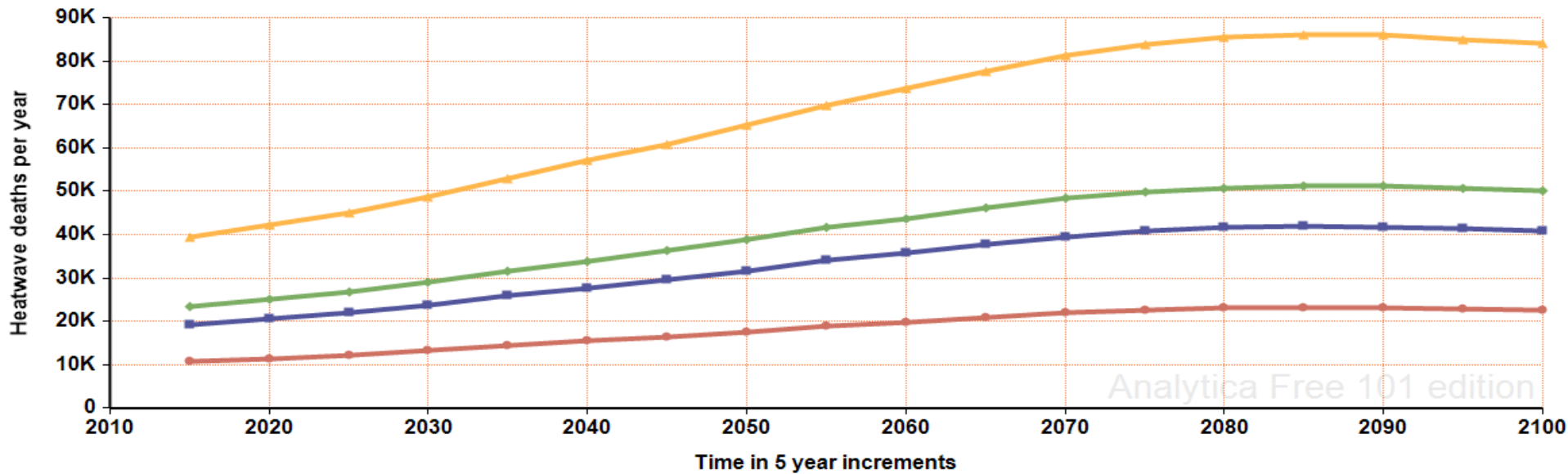
# Annual heat deaths by gender



Regression coefficients calculated for excess heat deaths per °C rise in mean summer temperatures

| Estimates          | OLS           |        | Poisson  |      | Negative Binomial |      |
|--------------------|---------------|--------|----------|------|-------------------|------|
|                    | $\beta$       | SE     | $\beta$  | SE   | $\beta$           | SE   |
| GBD Value          | 1407.000<br>* | 533.04 | 0.095*** | 0.00 | 0.095**           | 0.03 |
| GBD Upper<br>Limit | 1862.477      | 697.56 | 0.100*** | 0.00 | 0.100**           | 0.04 |
| GBD Lower<br>Limit | 109.200       | 71.22  | 0.020*** | 0.01 | 0.020             | 0.01 |

# Projected heat deaths



Analytica Free 101 edition

# Projected heat deaths

| Population<br>Prediction Intervals (PI)<br>(‘000) | Temperature related excess death estimates for RCP 8.5 |                          |                          |                          |
|---|--|--------------------------|--------------------------|--------------------------|
|   | 2025   | 2050                     | 2075                     | 2100                     |
| Lower 95 PI                                       | 43.55<br>(30.6 – 56.5)                                 | 56.18<br>(39.48 - 72.88) | 61.24<br>(43.03 - 79.44) | 48.76<br>(34.26 – 63.25) |
| Lower 80 PI                                       | 44.08<br>(30.98 – 57.19)                               | 59.39<br>(41.73 – 77.04) | 68.55<br>(48.17 - 88.93) | 59.36<br>(41.71 – 77)    |
| Median  | 45.03<br>(31.6 – 58.41)                                | 65.17<br>(45.8 – 84.55)  | 83.85<br>(58.92 - 108.8) | 84.04<br>(59.05 – 109)   |
| Upper 80 PI                                       | 45.95<br>(32.29 – 59.61)                               | 71.18<br>(50.02 - 92.34) | 101.5<br>(71.34 - 131.7) | 114.2<br>(80.27 - 148.2) |
| Upper 95 PI                                       | 46.41<br>(32.62 – 60.21)                               | 74.52<br>(52.37 - 96.68) | 112.9<br>(79.34 - 146.5) | 135.9<br>(95.47 – 176.3) |

**Mid, later, and end of century temperature related excess death direct cost estimates for five population growth scenarios on RCP 8.5 using US VSL estimates (\$9.631 million)**

| Population Prediction Intervals (PI) ('000) | Temperature related excess death direct cost estimates for RCP 8.5 |                   |                     |                     |
|---|--|-------------------|---------------------|---------------------|
|   | 2025   | 2050              | 2075                | 2100                |
| Lower 95 PI                                 | \$419,430,050,000  | \$541,069,580,000 | \$589,802,440,000   | \$469,607,560,000   |
| Lower 80 PI                                 | \$424,534,480,000  | \$571,985,090,000 | \$660,205,050,000   | \$571,696,160,000   |
| Median                                      | \$433,683,930,000  | \$627,652,270,000 | \$807,559,350,000   | \$809,389,240,000   |
| Upper 80 PI                                 | \$442,544,450,000  | \$685,534,580,000 | \$977,546,500,000   | \$1,099,860,200,000 |
| Upper 95 PI                                 | \$446,974,710,000  | \$717,702,120,000 | \$1,087,339,900,000 | \$1,308,852,900,000 |

## Mid, later, and end of century temperature related excess death direct cost estimates for five population growth scenarios on RCP 8.5 using India VSL estimates (\$0.275 million)

| Population Prediction Intervals (PI) ('000) | Temperature related excess death direct cost estimates for RCP 8.5 |                  |                  |                  |
|---|--|------------------|------------------|------------------|
|   | 2025   | 2050             | 2075             | 2100             |
| Lower 95 PI                                 | \$11,976,250,000   | \$15,449,500,000 | \$16,841,000,000 | \$13,409,000,000 |
| Lower 80 PI                                 | \$12,122,000,000   | \$16,332,250,000 | \$18,851,250,000 | \$16,324,000,000 |
| Median                                      | \$12,383,250,000   | \$17,921,750,000 | \$23,058,750,000 | \$23,111,000,000 |
| Upper 80 PI                                 | \$12,636,250,000   | \$19,574,500,000 | \$27,912,500,000 | \$31,405,000,000 |
| Upper 95 PI                                 | \$12,762,750,000   | \$20,493,000,000 | \$31,047,500,000 | \$37,372,500,000 |

# Discussion

- Greater increase in min & mean temp than max temp
- Decreasing temp range
- No respite at night
- People unable to control their thermal environment are more vulnerable
- 9.5% rise in mortality / °C temp
- ~84,000 end-century excess deaths (median pop and RCP 8.5)
- \$13 to \$23 billion direct economic costs
- Considerable range

# Challenges

- Steady state assumption: that the future is an extension of the past
- Possible non-linear relationship
- Absence of district-level, day-wise heatwave deaths (by age and gender) to be correlated with temperature data
- Difficulty in characterizing human adaptation to elevating temp





# Policy Implications

## Where & when to focus

- Some parts of the country will be affected more than others
- Rural and urban poor have unique exposure and vulnerabilities
- Males in the working age groups are dying more
- Deaths will increase in the future and plateau out by the end of the century

## What to do

- Reduce human & economic impacts
- Adaptation requires a combination of strategies
- Subgroups needs special focused measures
- Bottom up ethnographic research needed

# Policy Implications

- We calculated direct economic impacts using Value of Statistical Life measures.
- These deaths to the order of billions of dollars.
- With additional indirect costs included, overall impacts are likely to be much higher.
- There would be impacts on families, migration, etc.
- How our societies internalize these costs and deal with the consequences remains to be seen and investigated

# Acknowledgements

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Dissertation Awards**
- **Horowitz Foundation  
Dissertation Award**

# Questions?!

Heatwaves:

*“Silent and invisible killer of silenced and invisible people.” ~ Eric Klinenberg*



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Image © Outlook India magazine

“Heat waves receive little public attention not only because they fail to generate the massive property damage and fantastic images produced by other weather-related disasters, but also because their victims are primarily social outcasts—the elderly, the poor, and the isolated—from whom we customarily turn away.”

— Eric Klinenberg, *Heat Wave: A Social Autopsy of Disaster in Chicago*

