

# Spatially optimal targeting of interventions to reduce air pollution

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# Motivation

- Air pollution (PM2.5, PM10) increases mortality
- Cities in North India typically rank among the lowest in the world in air quality
- Crop residue burning is an important contributor during the late fall
- Various interventions proposed to reduce residue burning such as conditional payments to farmers
- **This paper:** Given limited resources, which places should be targeted for interventions to reduce air pollution?

# Overview

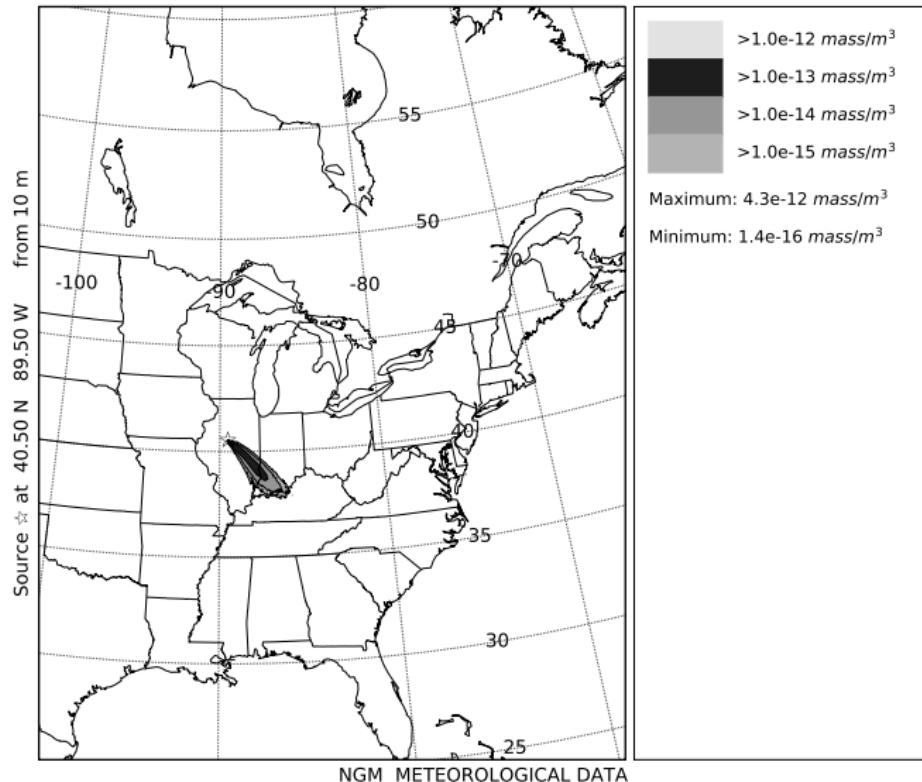
- **Goal:** Target the interventions into places where the greatest impact can be achieved
- Modeling of two main aspects:
  1. Harm
    - On average, how much harm would additional emissions from a given location cause?
    - Depends on the weather patterns (wind direction, strength, etc.) and spatial distribution of the population
    - I will use an air pollution transport model (HYSPLIT) to estimate the overall impact
  2. Costs
    - How much we would have to spend to reduce the pollution in a given location

# Modeling air pollution transport

- HYSPLIT dispersion model
  - Hybrid Single-Particle Lagrangian Integrated Trajectory model
  - One of the most extensively used atmospheric transport and dispersion models in the atmospheric sciences
  - Applications include tracking and forecasting the release of wildfire smoke, wind-blown dust, volcanic ash, and crop residue burning
- Main output of interest
  - Source-receptor matrix:  $SRM_{ij}$
  - Fraction of emissions from source  $i$  that are transported into  $j$
  - Average over 5 days after release

### Contributions from the selected Source

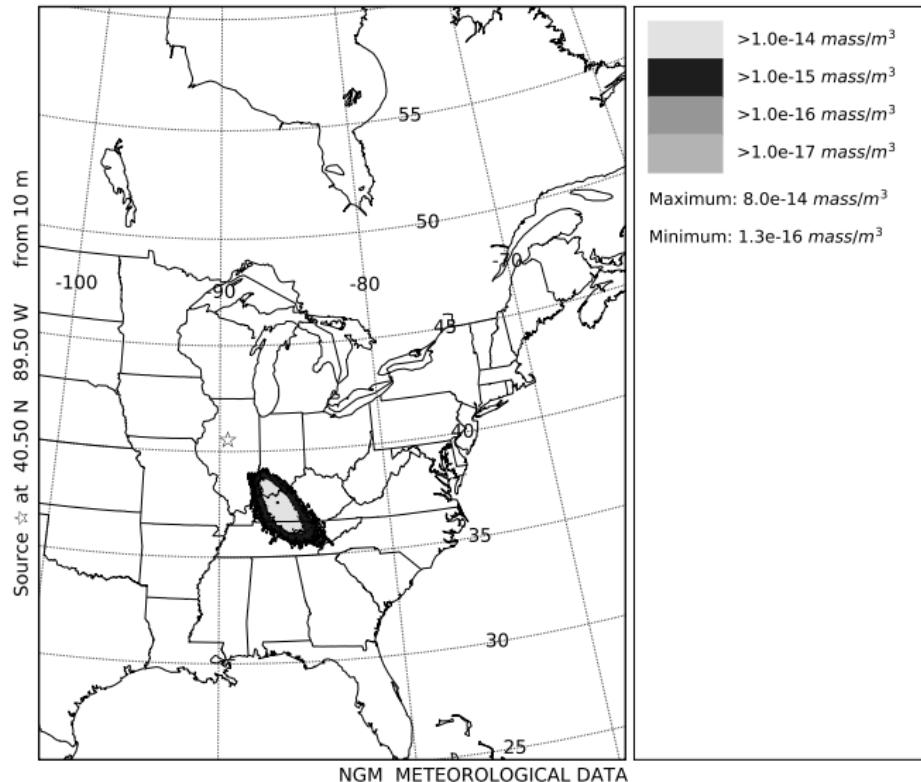
Air Concentration ( $\text{mass}/\text{m}^3$ ) averaged between 0 m and 100 m  
Integrated from 0000 16 Oct to 1200 16 Oct 1995 (UTC)  
C(R) Release started at 0000 16 Oct 1995 (UTC)





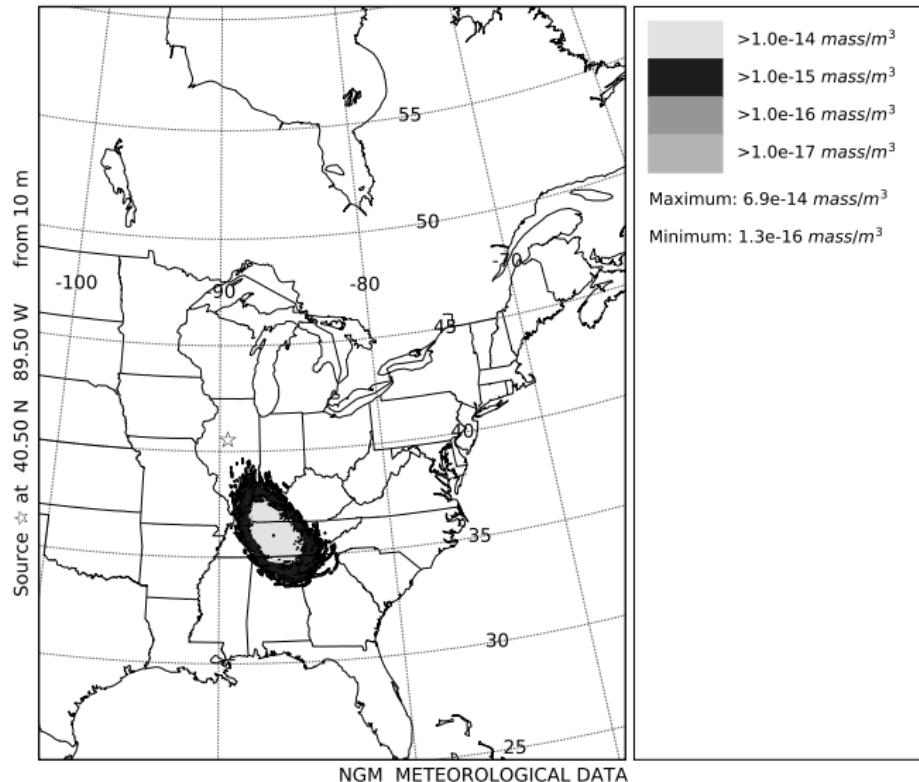
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Air Concentration ( $\text{mass}/\text{m}^3$ ) averaged between 0 m and 100 m  
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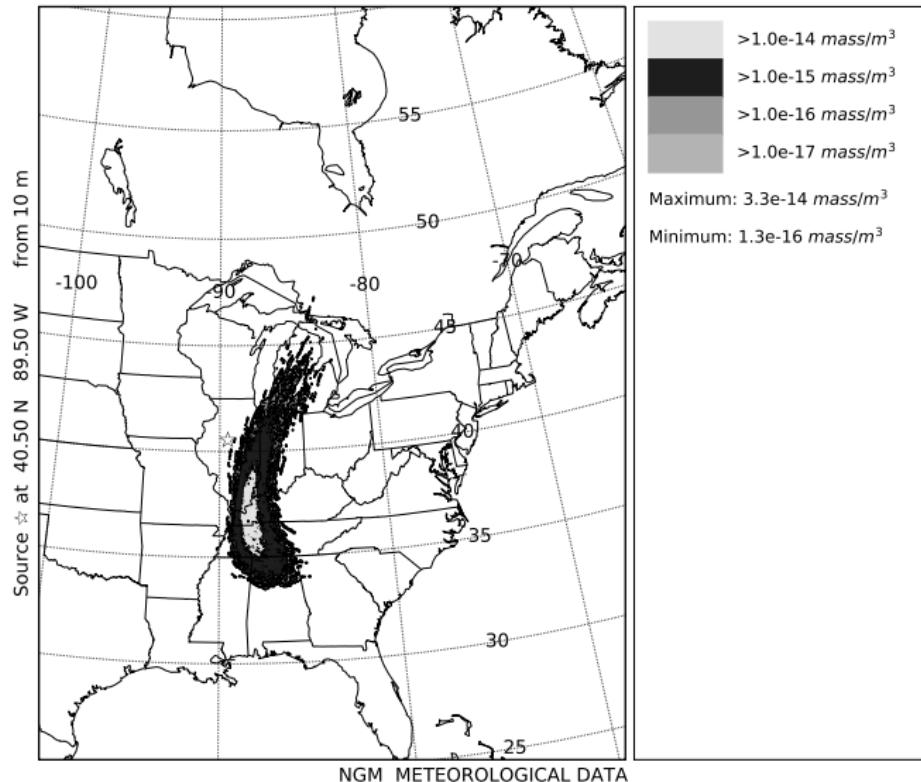
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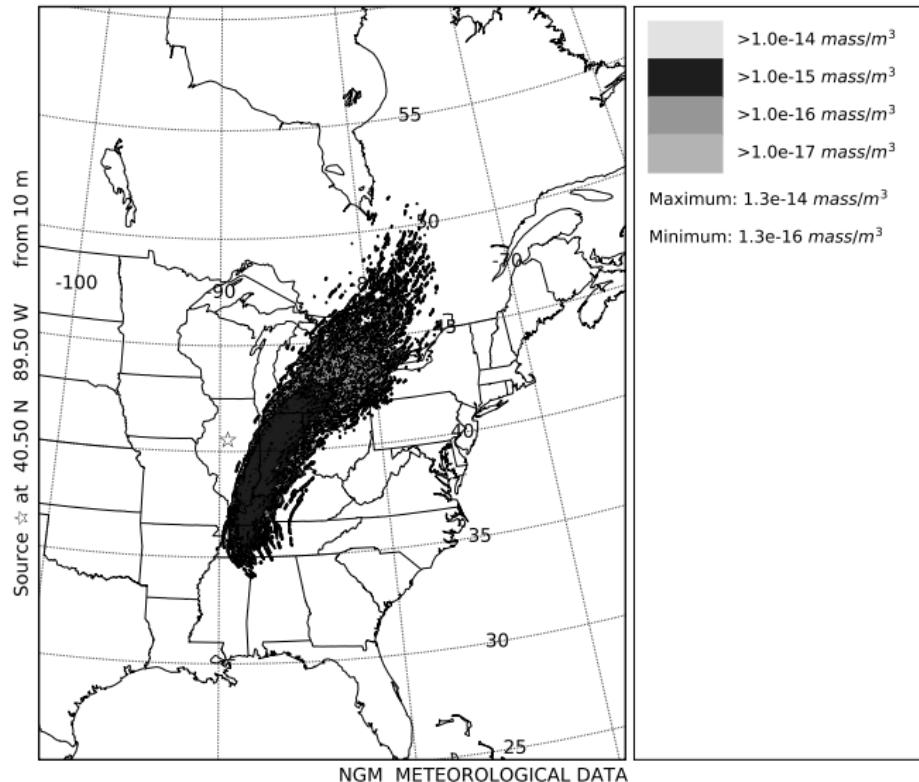
### Contributions from the selected Source

Air Concentration ( $\text{mass}/\text{m}^3$ ) averaged between 0 m and 100 m  
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Air Concentration ( $mass/m^3$ ) averaged between 0 m and 100 m  
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## Measuring the impact - definitions

- $SRM_{ij}$  ... fraction of emissions from source  $i$  that are transported into  $j$
- $E_i$  ... total air pollution emitted from location  $i$
- $P_j = \sum_i SRM_{ij}E_i$  ... total air pollution in  $j$
- $L_j = f(P_j)$  ... loss (harm) to a single person from being exposed to air pollution in  $j$
- $N_j$  ... total population in  $j$
- $TL = \sum_j L_j \cdot N_j$  ... total population-weighted loss caused by air pollution across all locations

# Measuring the impact

- The impact of small change emissions from  $i$  on total loss

$$\frac{\partial TL}{\partial E_i} = \sum_j \frac{\partial L_j}{\partial E_i} N_j = \sum_j \frac{\partial f(P_j)}{\partial P_j} \frac{\partial P_j}{\partial E_i} N_j = \sum_j \frac{\partial f(P_j)}{\partial P_j} SRM_{ij} N_j$$

- if  $f(P_j) = a + b \cdot P_j$ , this simplifies to

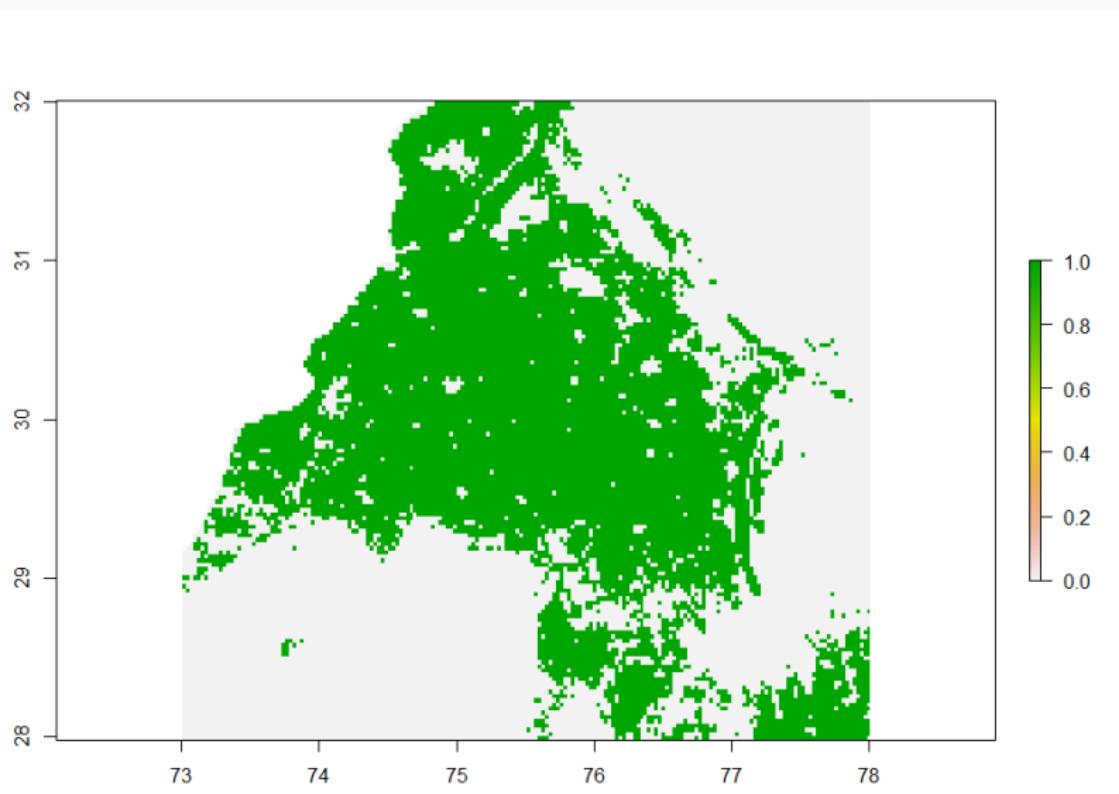
$$TL = b \sum_j SRM_{ij} N_j := b \cdot \alpha_j$$

- Clearly, it is optimal to target locations with the highest  $\frac{\partial TL}{\partial E_i}$  since that will lead to greatest reductions in loss
- In case of linear  $f(P_j)$ , this means locations with highest  $\alpha_j$ 
  - Some evidence to support linear effect of PM2.5 concentrations on infant mortality (cite the Burke nature paper)

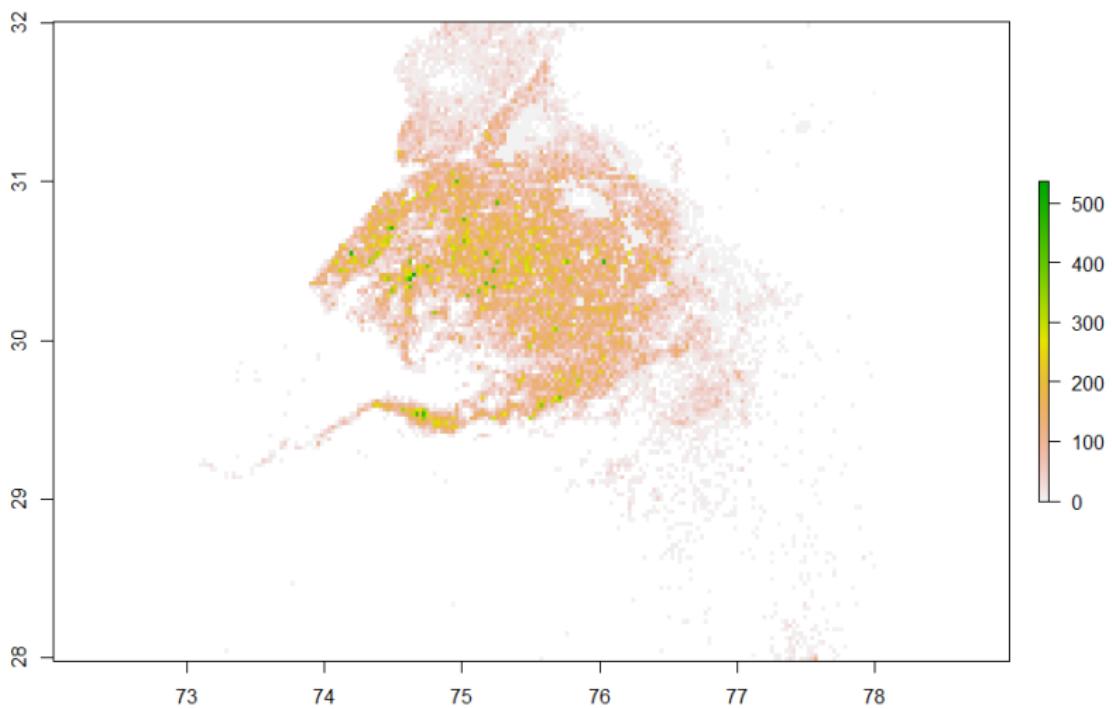
## Measuring the impact - extensions

- I focus on North-west of India where the air pollution is very severe and crop residue burning is common
- I run simulations based on weather data for the beginning of October for 10 different years
- Regular grid of 121 source location
  - $\alpha_j$  computed for each location separately, then interpolated across them on a finer grid
- Finer grid - only locations with winter cropping and

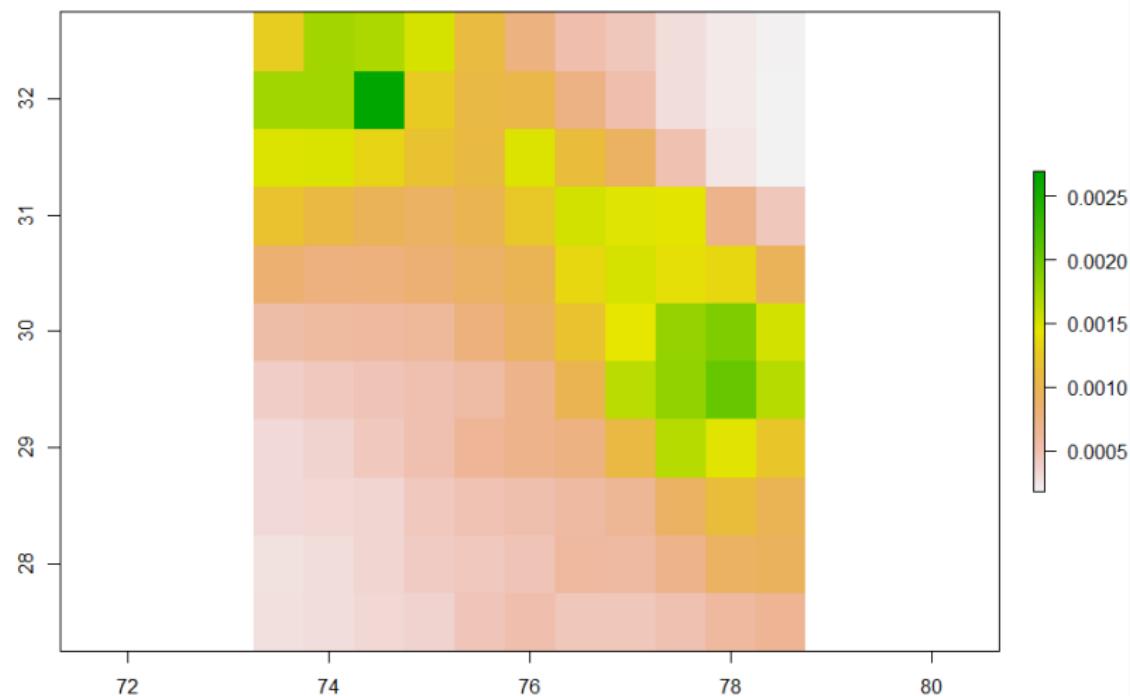
# Winter cropped area



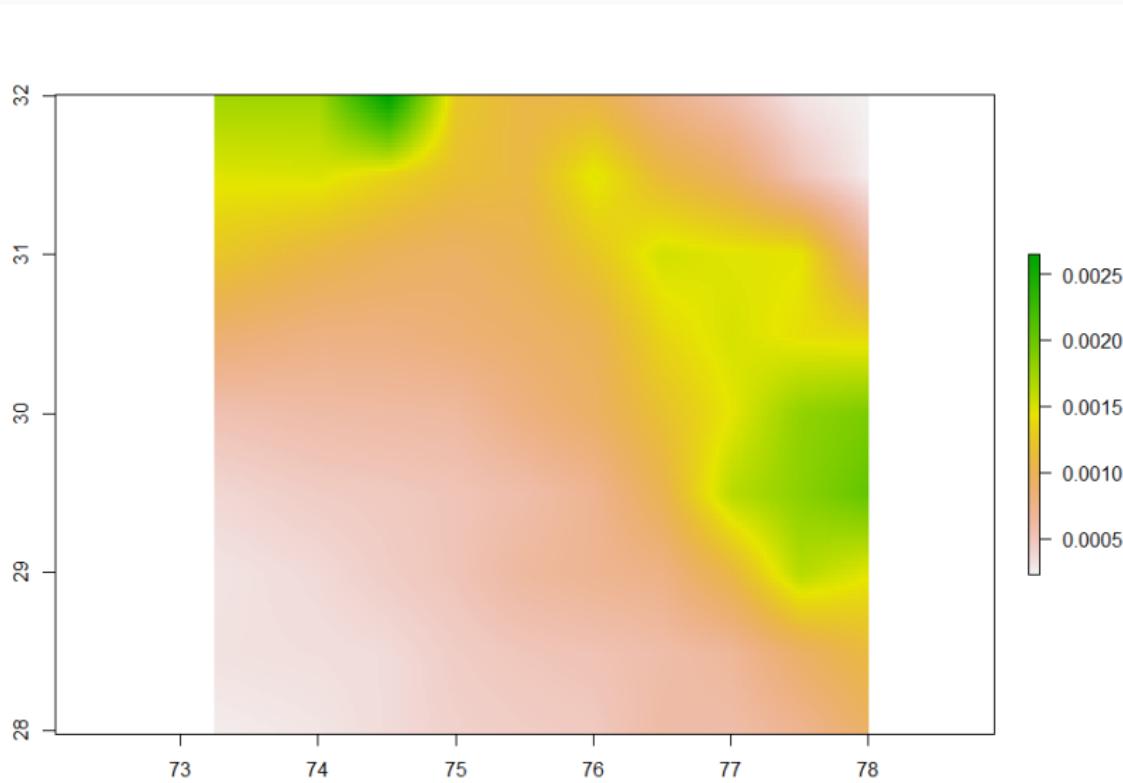
# Total fire radiation power - October 2019



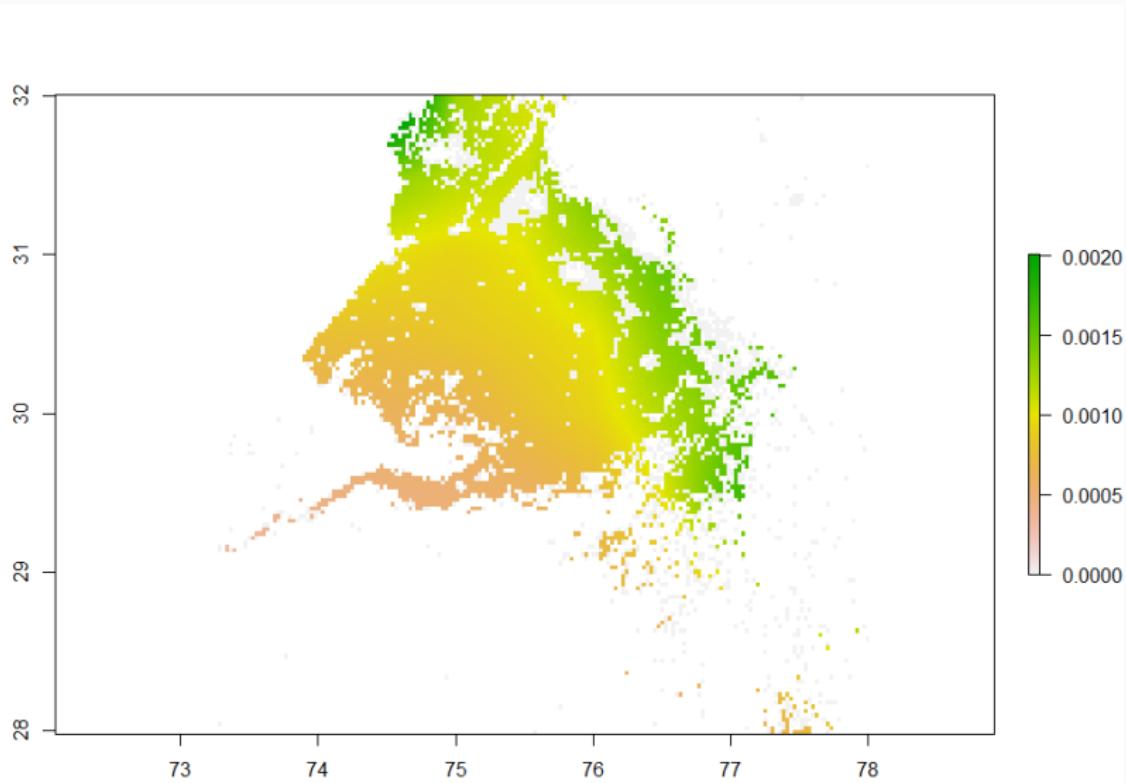
# Population exposure - full



# Population exposure - full - interpolated

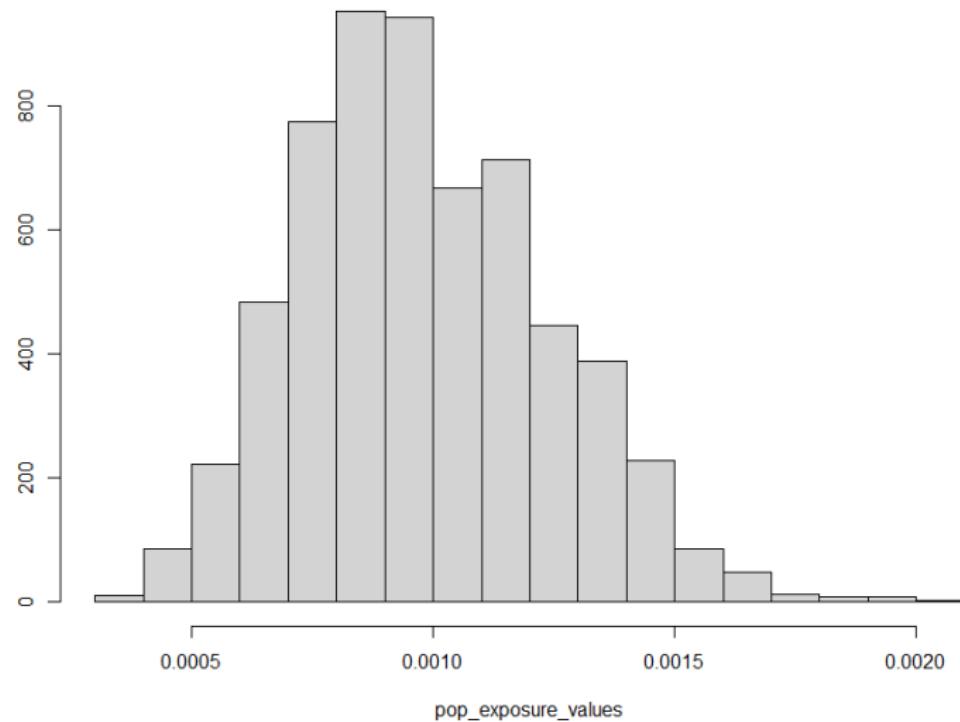


# Population exposure - interpolated



# Population exposure - interpolated - histogram

Histogram of pop\_exposure\_values



# Conclusion

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Thank you for your attention.