



How does Infectious Disease Propagate?

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Why is this important?

- ❖ One of the world's deadliest problems
- ❖ \$8.3 billion (CAD) in total costs (Diener et al., 2016)
~ \$8.7 billion (CAD) in today's costs
- ❖ High mortality rates

H1N1

(H1N1pdm09 virus/Swine Flu)

- ❖ Type of deadly lung influenza (bacteria)
- ❖ Particular strain discovered in 2009
- ❖ Worldwide mortality:
 - ❖ 152K – 575K deaths (first year)
 - ❖ 80% for ages < 65
 - ❖ 80% - 90% for ages ≥ 65

(CDC, 2019)

Classical Modelling Method

- ❖ SIR (Susceptible, Infected & Recovered) - 1927
- ❖ Developed by Kermack & Mckendrick

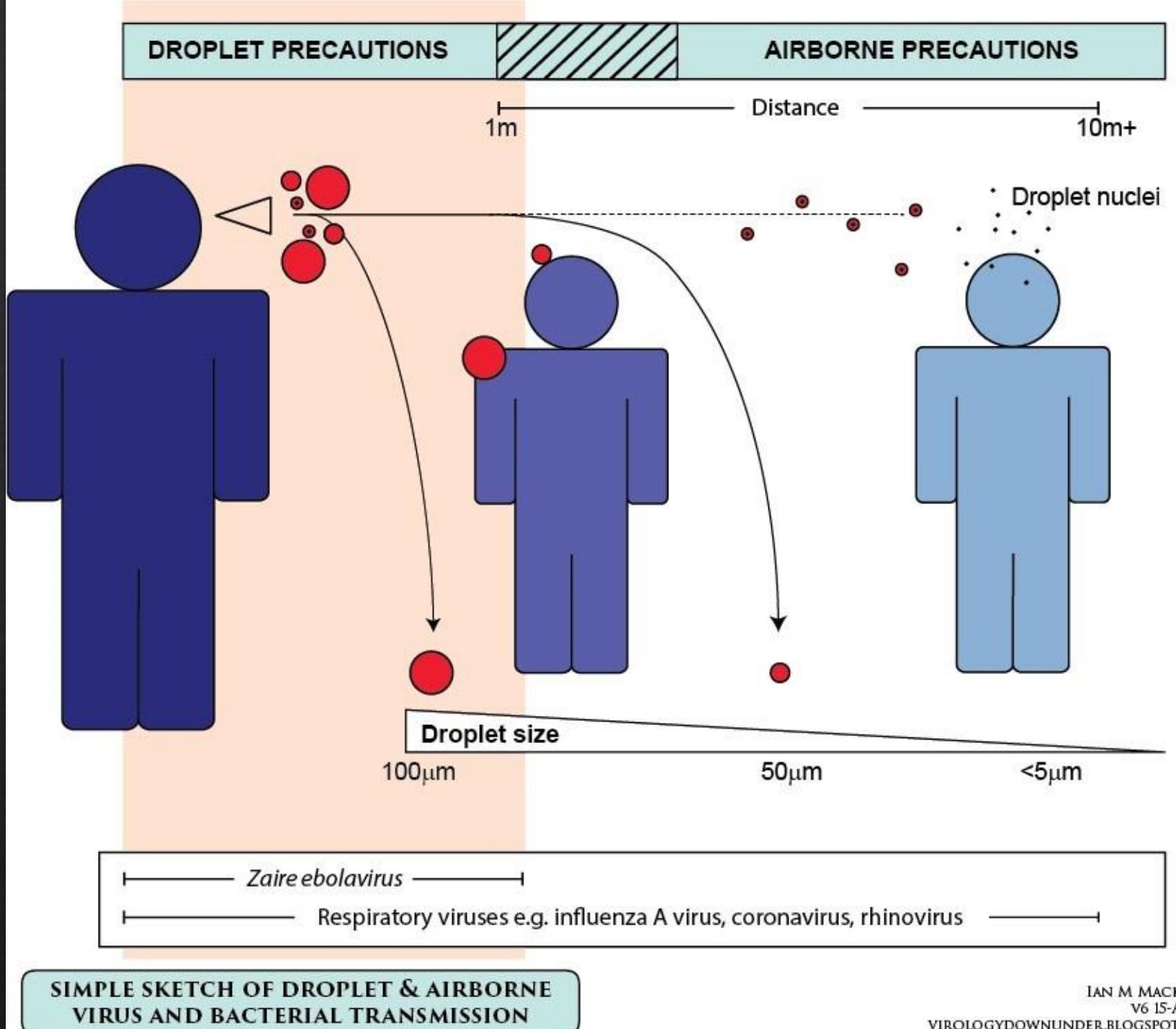
Problems with Current & Old Modelling Methods

- ❖ Does not account for spatial and microscopic variations
- ❖ Long simulation times
- ❖ Propagation of disease in
 - ❖ Public Transit
 - ❖ Workplace
 - ❖ Residential Areas
- ❖ Environmental Influences
 - ❖ Pollution
 - ❖ Sanitation
 - ❖ Hygiene

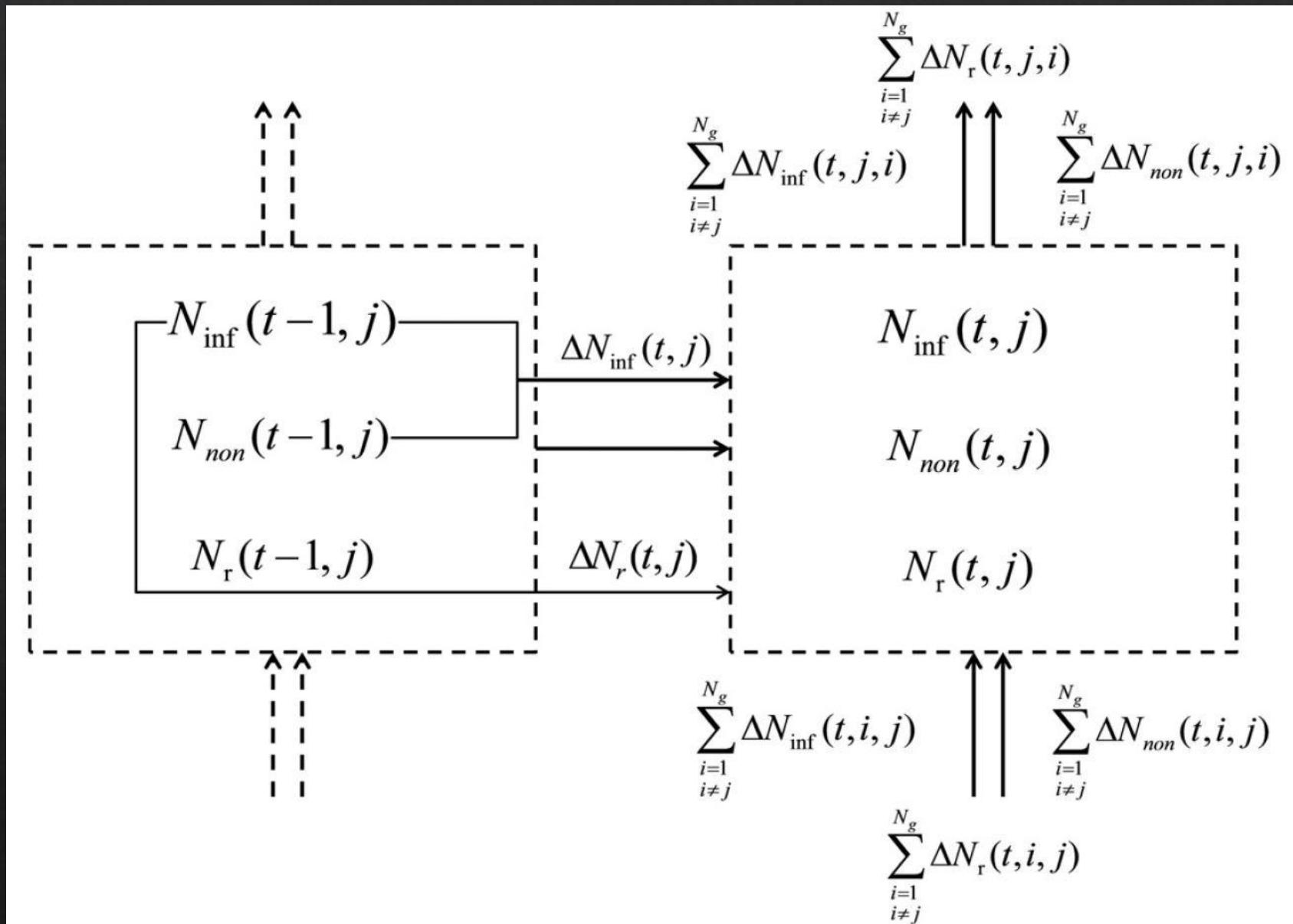
Objectives

- ❖ Assessing risk of airborne infectious disease propagation in cities
- ❖ Treat problem like a mass transport problem
- ❖ Modelling based on SIR model
- ❖ Considering both static and dynamical factors

Comprehensive
Risk Analysis



- ◆ ΔN_{inf} = Number of Non-Infected becoming Infected
- ◆ ΔN_{non} = Number of Infected becoming Non-Infected
- ◆ ΔN_r = Number of Infected becoming Recovered



(Zhang, 2016)

$$N_{inf}(t, j) = N_{inf}(t - 1, j) + \Delta N_{non}(t, j) - \Delta N_r(t, j) + \sum_{\substack{i=1 \\ i \neq j}}^{N_g} \Delta N_{inf}(t, j, i) - \sum_{\substack{i=1 \\ i \neq j}}^{N_g} \Delta N_{inf}(t, i, j)$$

$$N_{non}(t, j) = N_{non}(t - 1, j) + \Delta N_{inf}(t, j) + \sum_{\substack{i=1 \\ i \neq j}}^{N_g} \Delta N_{non}(t, i, j) - \sum_{\substack{i=1 \\ i \neq j}}^{N_g} \Delta N_{non}(t, j, i)$$

$$N_r(t, j) = N_r(t - 1, j) + \Delta N_r(t, j) + \sum_{\substack{i=1 \\ i \neq j}}^{N_g} \Delta N_r(t, i, j) - \sum_{\substack{i=1 \\ i \neq j}}^{N_g} \Delta N_r(t, j, i)$$

$$[N] = \frac{\textit{infected person}}{\min \cdot \textit{grid}}$$

(Zhang, 2016)

Number of Recoveries from Infection

$$\Delta N_r(t, j) = \alpha \cdot N_{inf}(t - 1, j) \quad [\alpha] = \frac{\text{person from infected}}{\text{person to recovery}}$$

Comprehensive Risk Equation

$$\Delta N_{inf} = \frac{N_{inf}(t - 1, j) \cdot N_{non}(t - 1, j) \cdot \sigma I \cdot f(T) \cdot f(RH)}{R_P(t - 1, j)} + N_h(t, j)$$

$R(t, j)$ Comprehensive risk at time t in grid j

σ Augment coefficient relating infectivity to **sanitation & hygiene**

I **Virus Infectivity** $\sim I = 1$ implies 100% chance of infection

$f(T)$ **Temperature** influence

$f(RH)$ **Humidity** Influence

R_B **Personal Resistance**

N_H Newly **infected caused by hospitals** in grid j

(Zhang, 2016)

Number of Infections from getting Hospitalized

$$\Delta N_h(t, j) = \frac{\beta N_{inf}(t) \cdot N_{non}(t, j) \cdot \sigma I_{nf}}{R_P(t, j)} \cdot \frac{D_h(j)}{\sum_{i=1}^{N_h} D_h(i)}$$

$\Delta N_h(t, j)$ Comprehensive risk at time t in grid j

N_{inf} Total number of infected individuals in city

β Probability infected person will be in isolation in a hospital

I_{nf} Viral Infectivity

σ Augment coefficient relating infectivity to environmental parameters

$D_h(j)$ Scale of hospitals

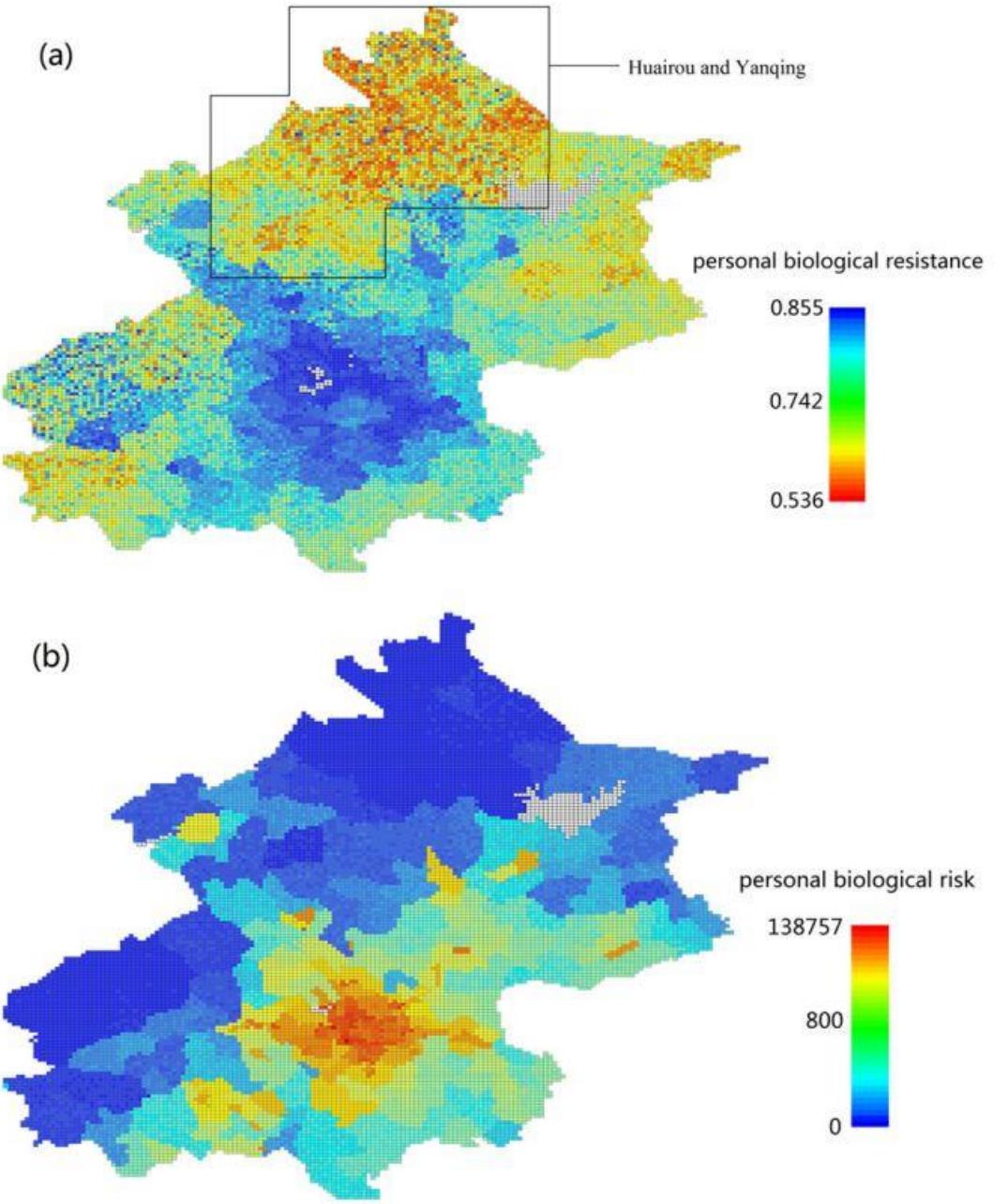
N_H Total number of hospitals in city

Study Area

- ❖ Beijing, China
- ❖ Total Area of 16411 km²
- ❖ Population 20 million
- ❖ Urban Population density: 9000 people/km²
- ❖ Suburban population density: 550 people/km²

Assumptions

- ❖ Viral infectivity (I_{nf} or I) is $\frac{1}{100,000}$
 - ❖ Still some diverse influenza
- $$[I] = \frac{\text{person}}{\text{infected} \cdot \text{min}}$$

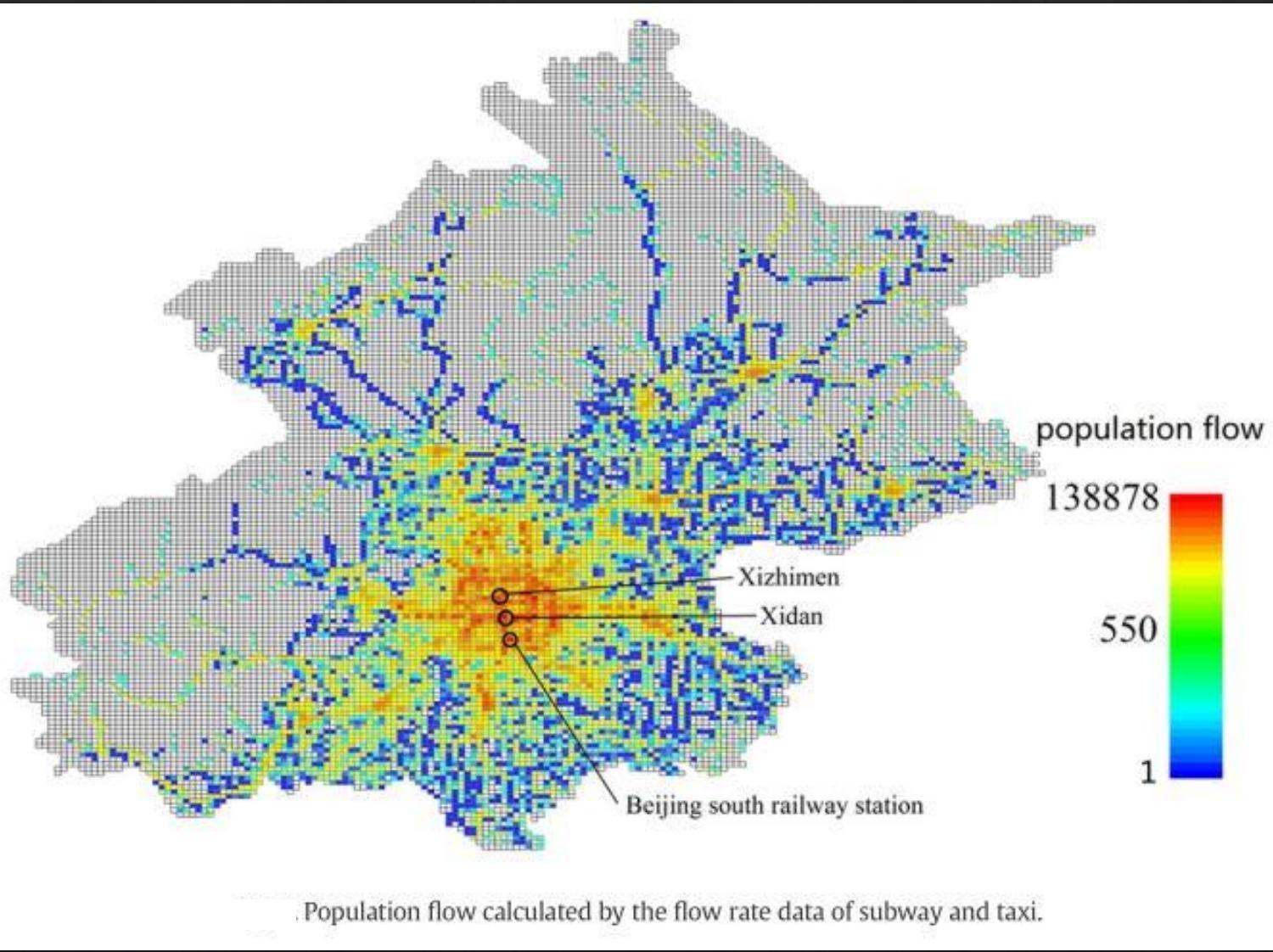


Distribution map of Beijing: (a) personal biological resistance; (b) personal biological risk considering population density.

Distribution of Biological Resistance

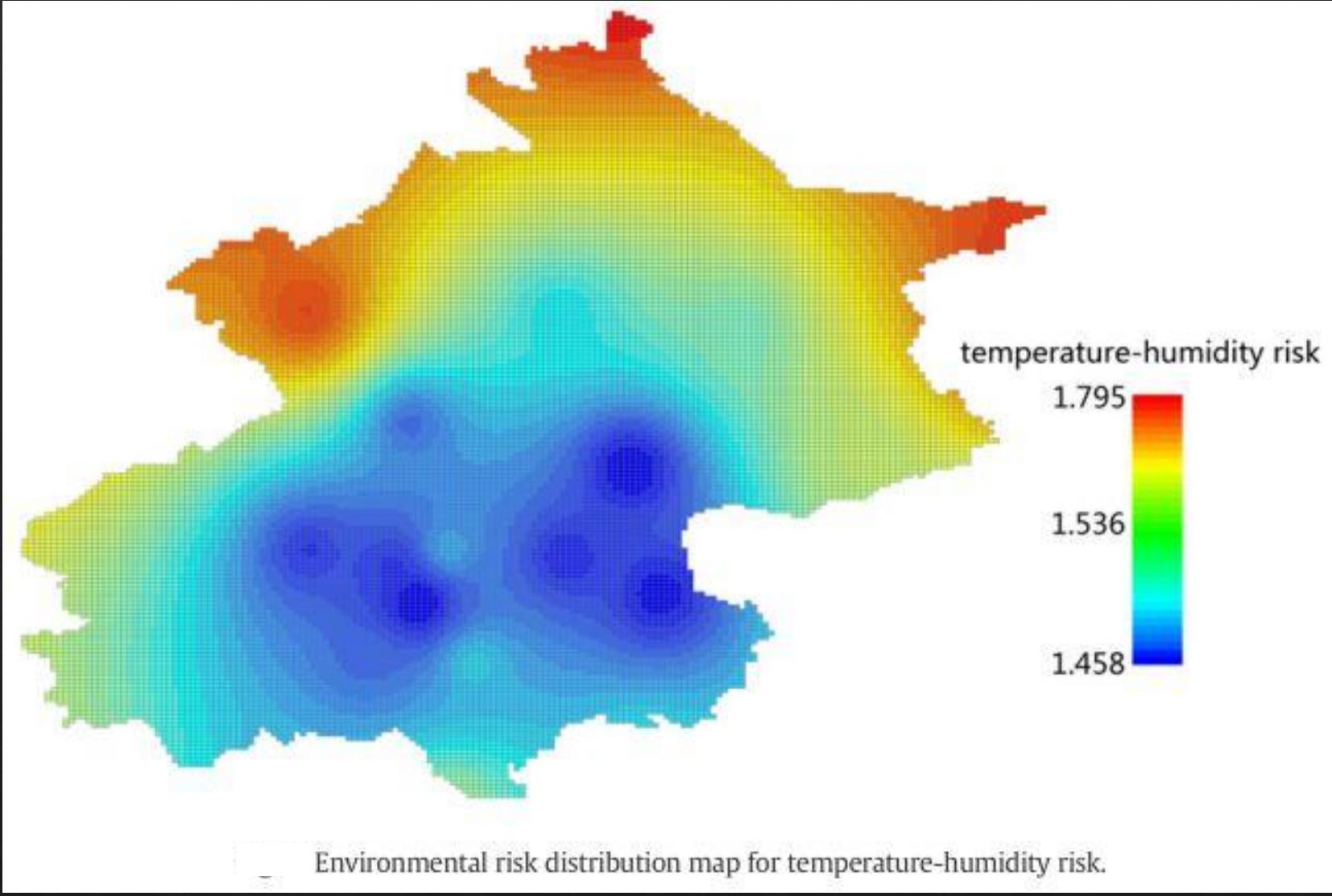
$$R_B = G \cdot f(A) \cdot \frac{f(E)}{S \cdot C}$$

(Zhang, 2016)



Transportation Flow Diagram

(Zhang, 2016)

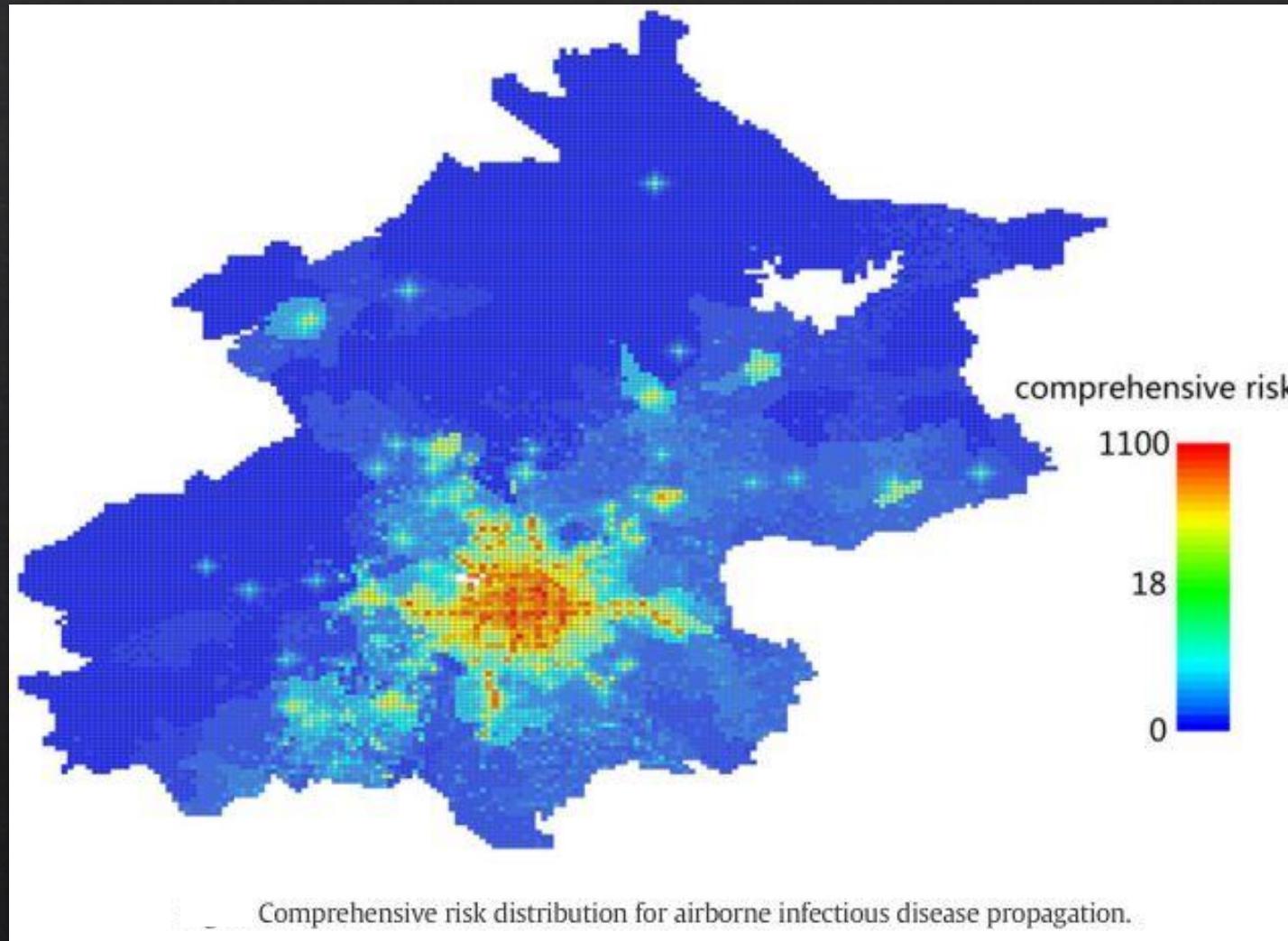


$$f(T) = 1.34775 + 0.13811 \cos(0.1509T) + 0.29952 \sin(0.1509T)$$

$$f(RH) = 1 = 0.005 \cdot RH$$

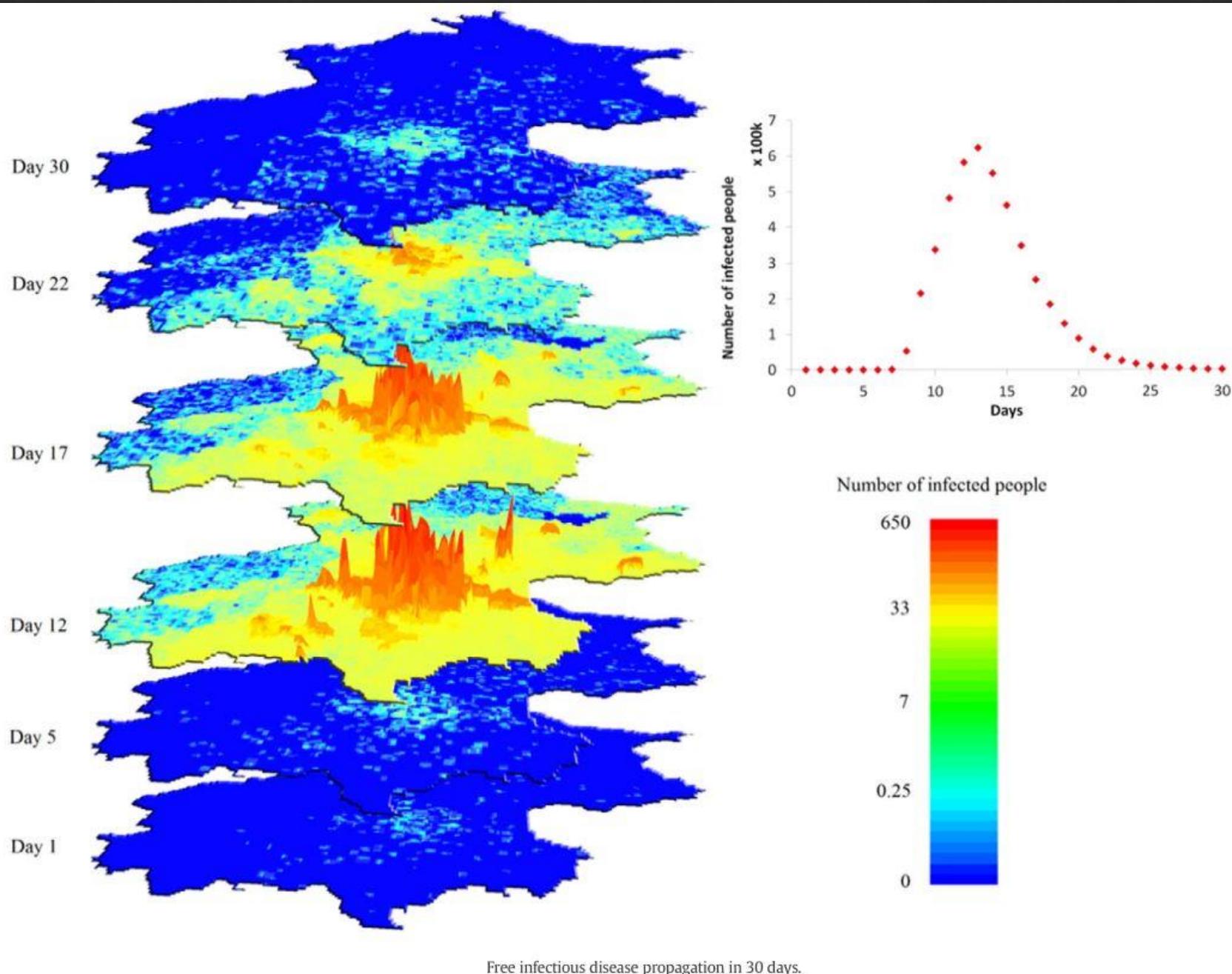
Distribution of Environmental Risk

(Zhang, 2016)



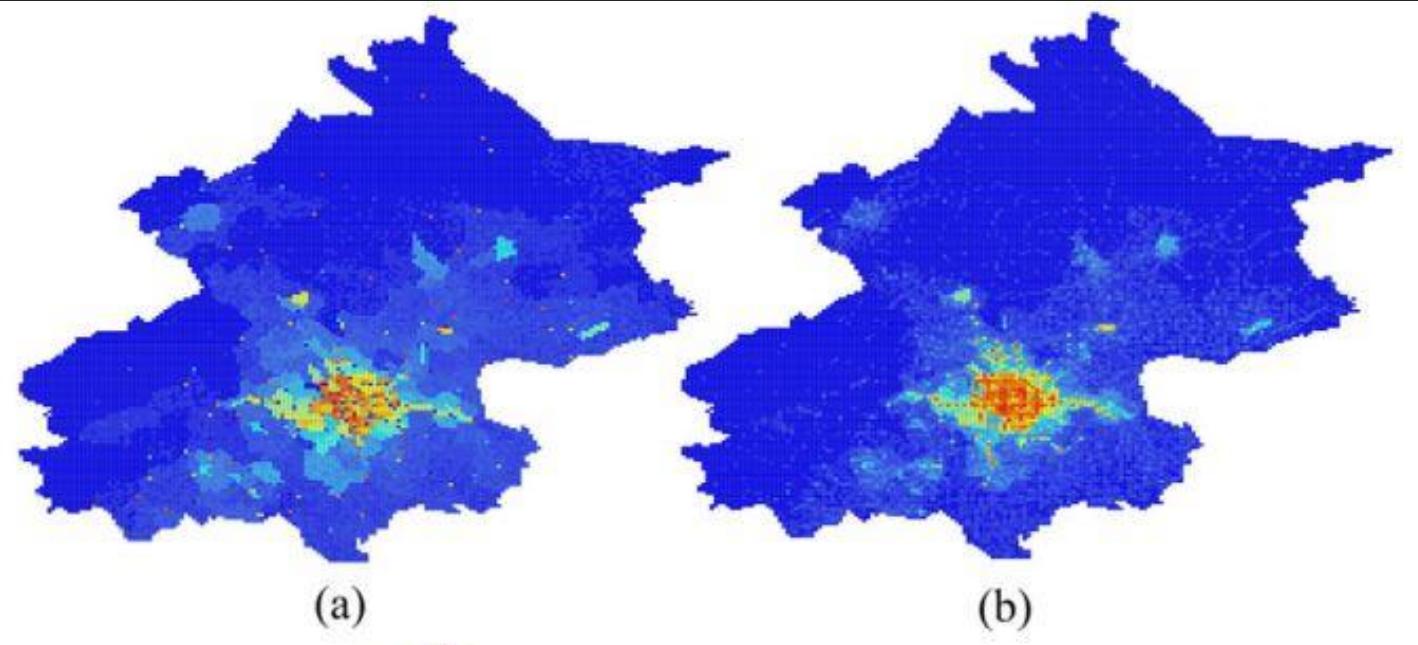
Distribution of Comprehensive Risk

(Zhang, 2016)

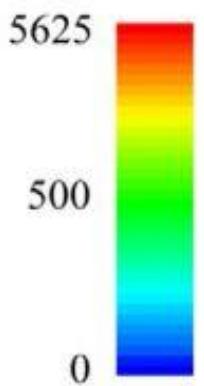


Distribution of Free Infectious Disease

(Zhang, 2016)



Number of infected person

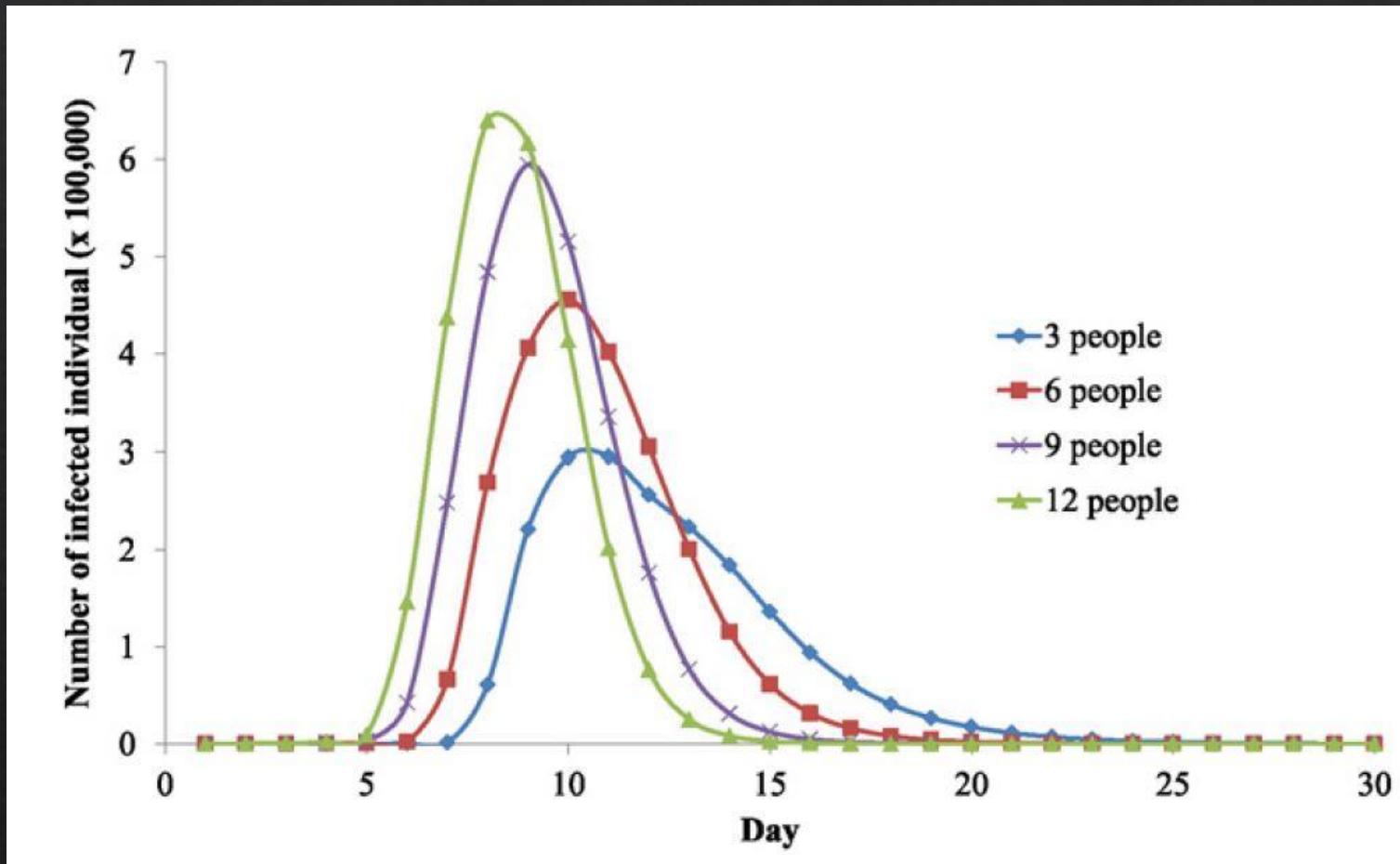


Dynamic population distribution in one day (Day 13) at different time points: (a) 0:00; (b): 12:00; (c) 24:00.

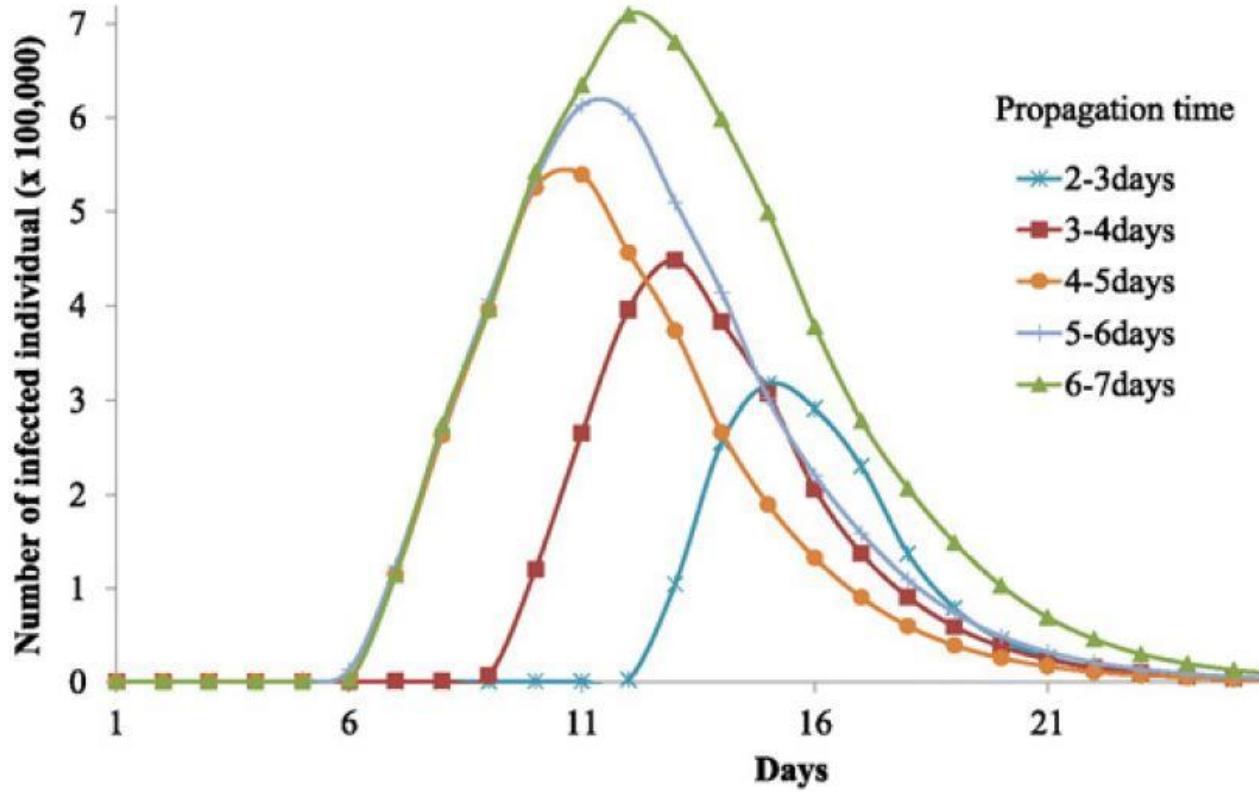
Distribution of Dynamic Population Influence

(Zhang, 2016)

Sensitivity Analysis: Households



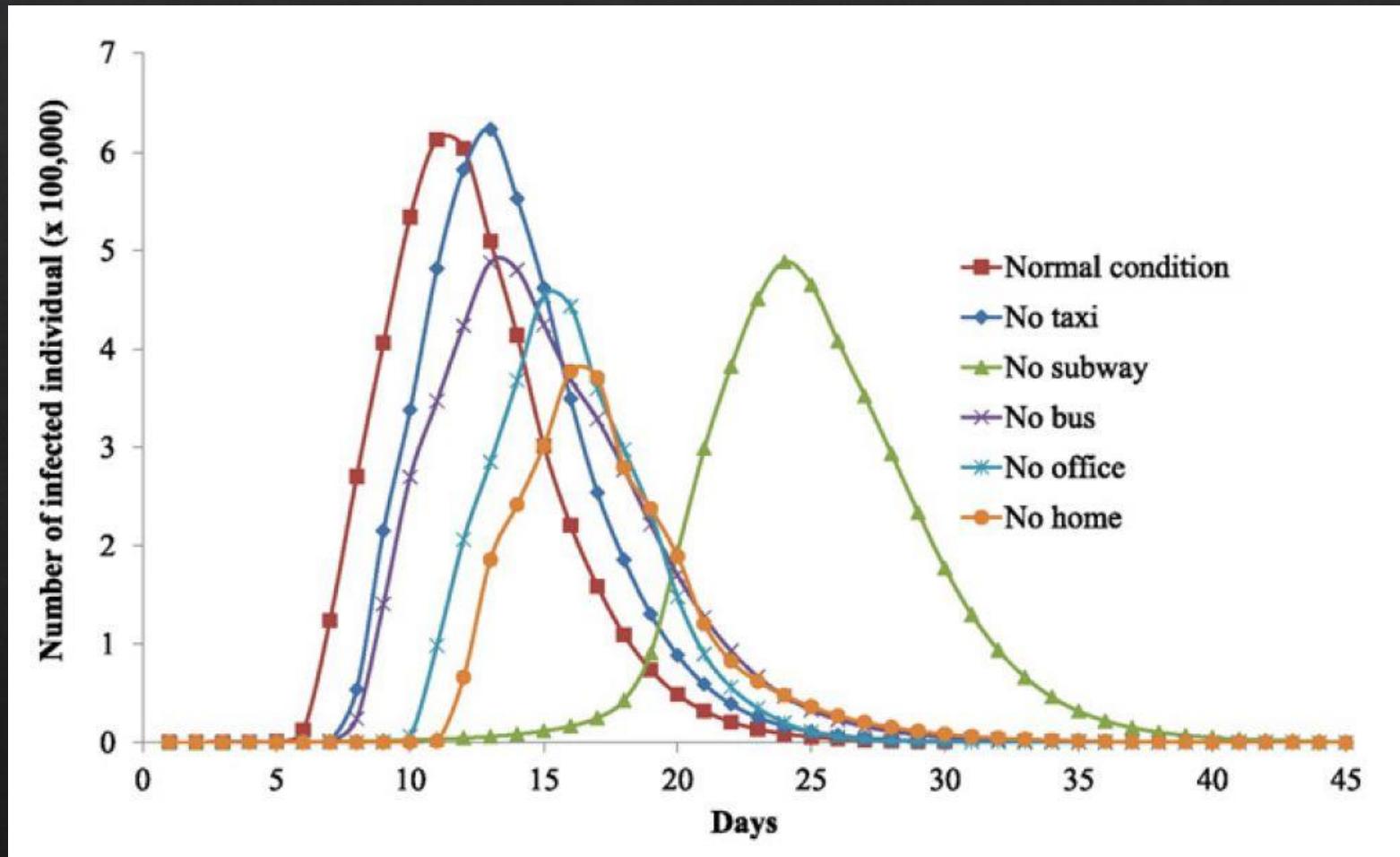
(Zhang, 2016)



Sensitivity Analysis: Government Response

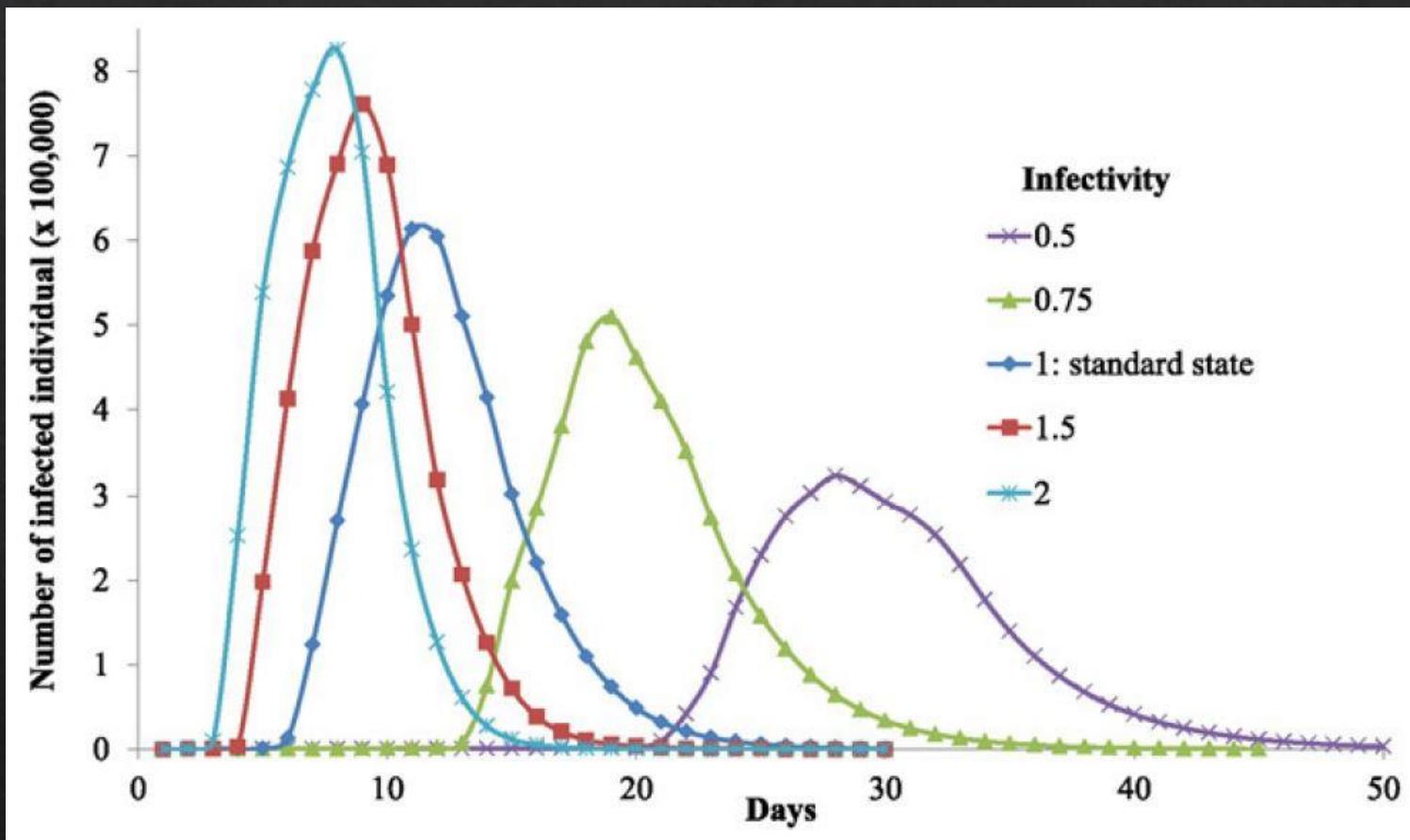
(Zhang, 2016)

Sensitivity Analysis: Transportation & Workplace



(Zhang, 2016)

Sensitivity Analysis: Different Infectivity Values



(Zhang, 2016)

Summary

- ❖ Four Main factors analyzed:
 - ❖ Biological Risk
 - ❖ Environmental Risk
 - ❖ Dynamic Population Flow
 - ❖ Risk Source
- ❖ Urban Areas are the most at risk of an airborne infectious disease
 - ❖ Due to public transportation, close vicinity of individuals
- ❖ Mitigation Measures
 - ❖ Reduce personal contact
 - ❖ Quarantine the sick
 - ❖ Immediate intervention
 - ❖ Proper population management
 - ❖ Improving Air quality

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