

# Spatiotemporal characteristics of pandemic influenza

Lars Skog

Annika Linde, Helena Palmgren, Hans Hauska, Fredrik Elgh

Lars Skog<sup>1\*</sup>, Annika Linde<sup>2</sup>, Helena Palmgren<sup>3</sup>, Hans Hauska<sup>4</sup>, Fredrik Elgh<sup>5</sup>

\*Corresponding author: Lars Skog

<sup>1, 4</sup> Division of Geodesy and Geoinformatics,  
Department of Urban Planning and Environment,  
Royal Institute of Technology (KTH)

<sup>2</sup> Public Health Agency of Sweden

<sup>3, 5</sup> Department of Clinical Microbiology, Umeå  
University,

# Data Sources

## Disease / health data

- Swedish Society for Medical Doctors (influenza, 1889–90)
- Royal Medical Board (influenza, 1957–58)
- Swedish Institute for Communicable Disease Control (influenza, 2009–10)
- Swedish Board of Agriculture (salmonella infections, 1993–2010)

## Demographic / socioeconomic data

- Parish populations (1571, 1890, unpublished, Prof. Andersson-Palm, Gothenburg)
- Statistics Sweden
- Demographic Data Base (Umeå University)
- Teleadress

## Environmental data

- Swedish Meteorological and Hydrological Institute (meteorological data, 1957–58)

## Other data sources

- Swedish railroad map, 1890 (map)
- Swedish water bodies (map)

# Background

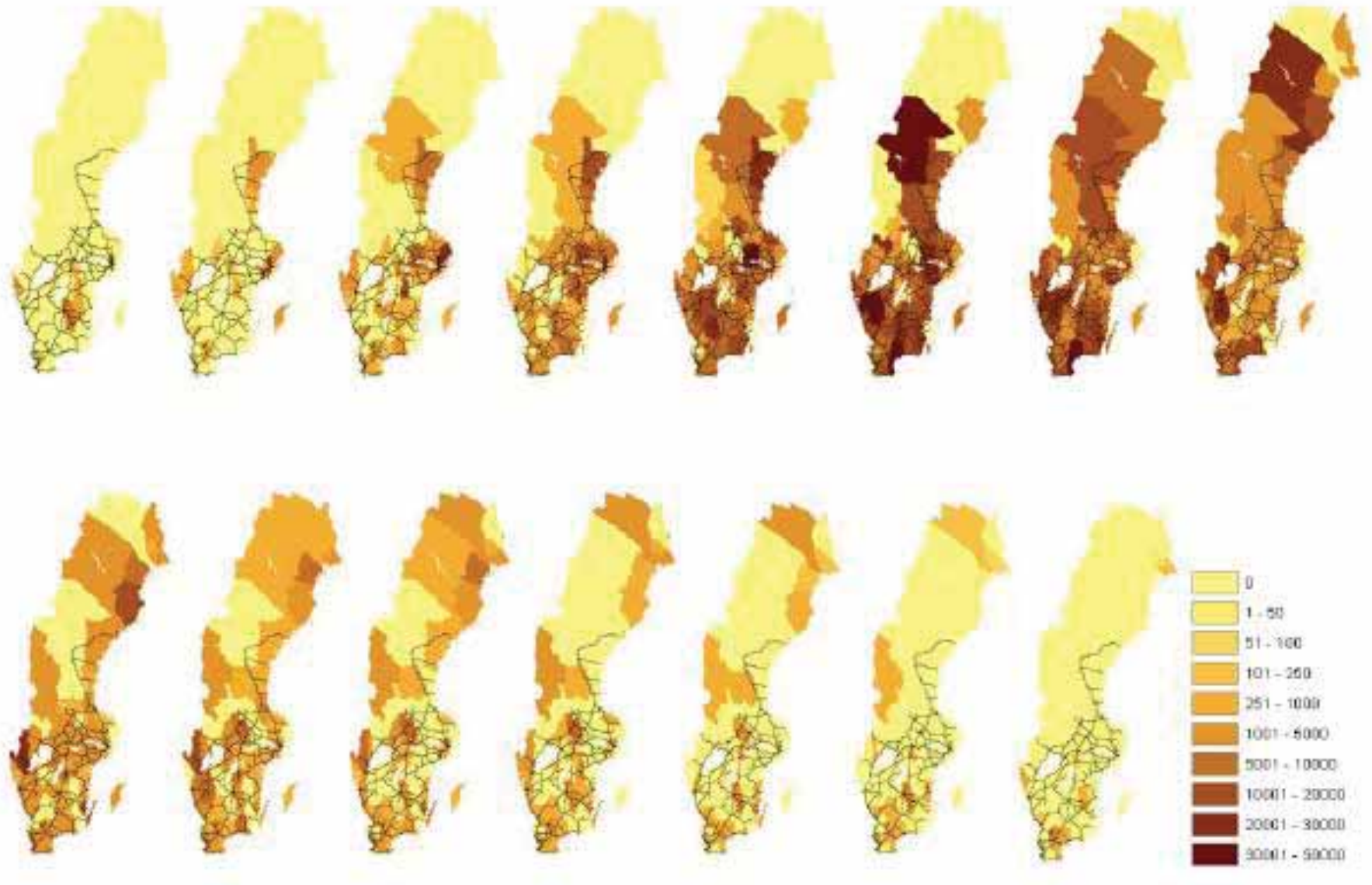
- Early understanding of factors determining spread
  - Optimal distribution of measures for mitigation of consequences
- Old pandemics – new knowledge

# Russian Influenza 1889-1890





# *The Russian influenza in Sweden in 1889-90*



# Asian Influenza 1957-1958







# Methods

- Data acquisition and preparation
- Geocoding
- Study of climate factors (Asian Influenza)
- Study of duration of epidemic periods and spatial distribution of peaking week
- Spatiotemporal Visualization
  - Geographic Weighted Mean (GWM)
  - Moran's I and Ripley's K-function

# Data acquisition, preparation and geocoding



Area	Population	Area	Population	Area	Population
1. Arendal	24	11. Gule	24	21. Tvedestrand	24
2. Arene	24	12. Hæresund	24	22. Tvedestrand	24
3. Arene	24	13. Hæresund	24	23. Tvedestrand	24
4. Arene	24	14. Hæresund	24	24. Tvedestrand	24
5. Arene	24	15. Hæresund	24	25. Tvedestrand	24
6. Arene	24	16. Hæresund	24	26. Tvedestrand	24
7. Arene	24	17. Hæresund	24	27. Tvedestrand	24
8. Arene	24	18. Hæresund	24	28. Tvedestrand	24
9. Arene	24	19. Hæresund	24	29. Tvedestrand	24
10. Arene	24	20. Hæresund	24	30. Tvedestrand	24



# Climate factors (Asian Influenza)

- Mean temperature and precipitation/week
- 8 major cities with weather stations
- Trend lines least squares regression
- z-scores for temperature, precipitation and number of cases
  - $(\text{observation} - \text{mean value}) / \text{standard deviation}$
- Interpolation of weather data for all locations with diagnosed influenza cases

# Duration of epidemic periods and spatial distribution of peaking week

- z-scores
- Slope for start and end of pandemic period
- Peaking week for each municipality
- Moran's I
- Spatial correlation latitude and peaking week

# Spatiotemporal Visualization

- Incidence per municipality (cumulative number of cases per week divided by number of inhabitants)
- GWM for weekly incidence

$$\bar{X}_w = \frac{\sum_{i=1}^n w_i x_i}{\sum_{i=1}^n w_i} \cdot \bar{Y}_w = \frac{\sum_{i=1}^n w_i y_i}{\sum_{i=1}^n w_i} \quad (1)$$

where  $w_i$  is the incidence at municipality  $i$



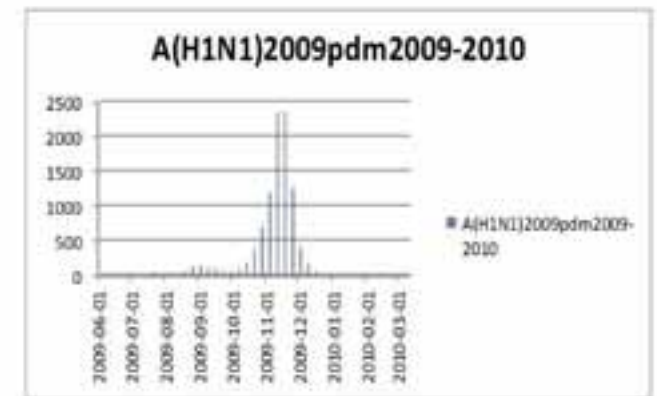
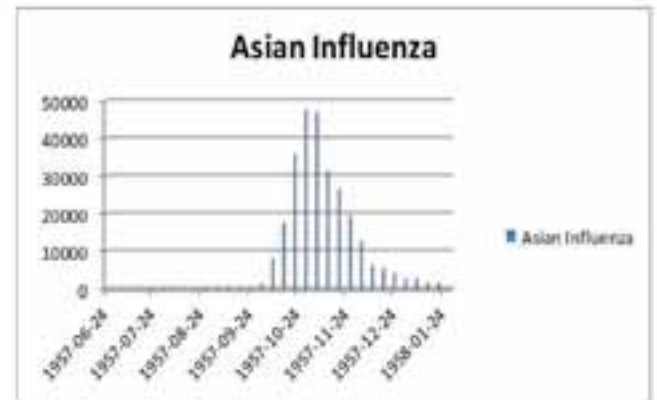
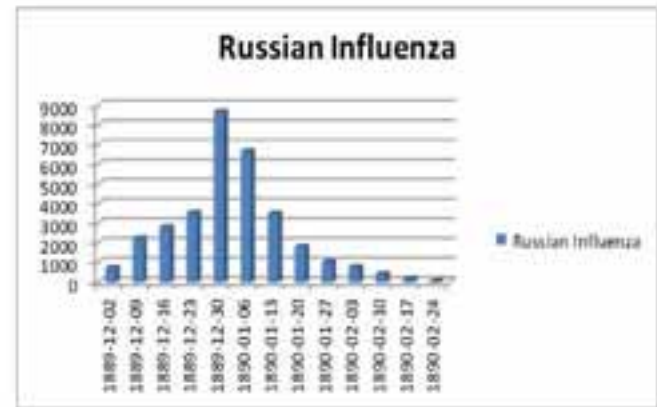
# Results

- Russian Influenza
- Asian influenza
  - Spatiotemporal propagation
  - Climate observations
- A(H1N1)pdm09
- GWM for incidence

Pandemic	Total number of cases	Cases within 10 weeks epidemic period				Total number of weeks
		Number	%	Mean	STDV	
Russian Influenza	32,642	32,366	99.2	2511	21	13
Asian Influenza	276,537	250,518	90.6	8921	297	30
A(H1N1)pdm09	10,077	9,203	89.5	252	6	40

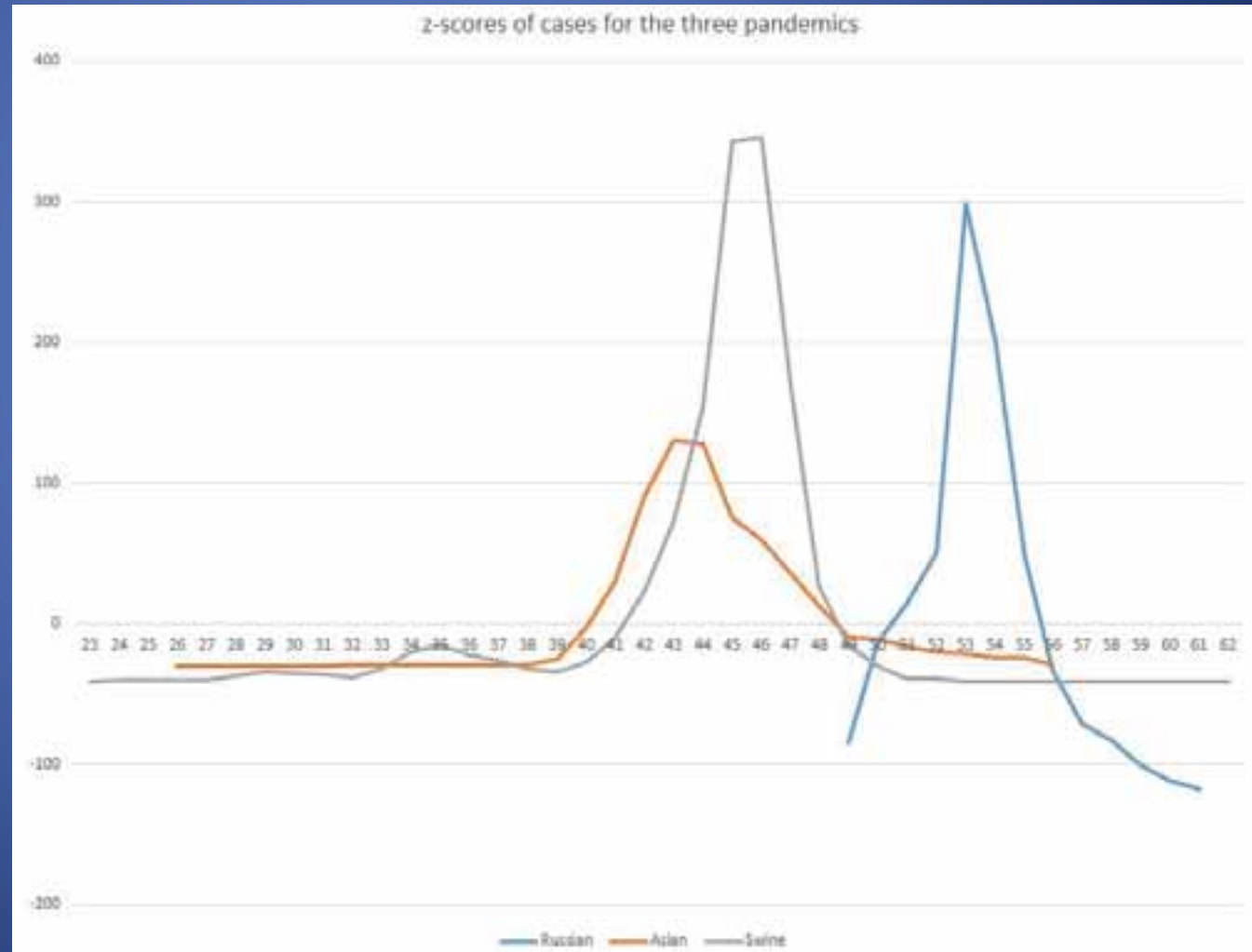
# Results

## Temporal Spread



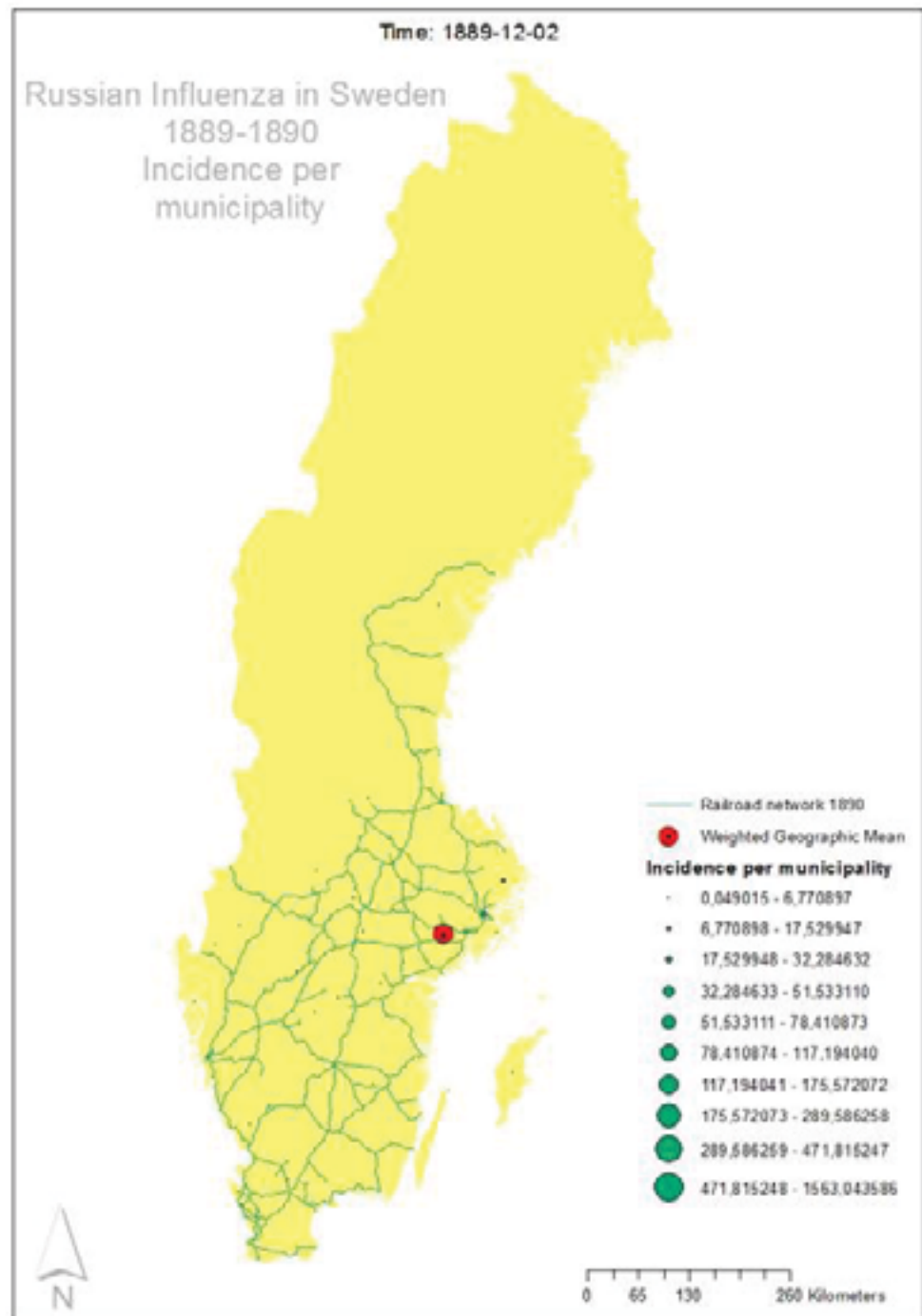
# Results

z-scores of temporal spread



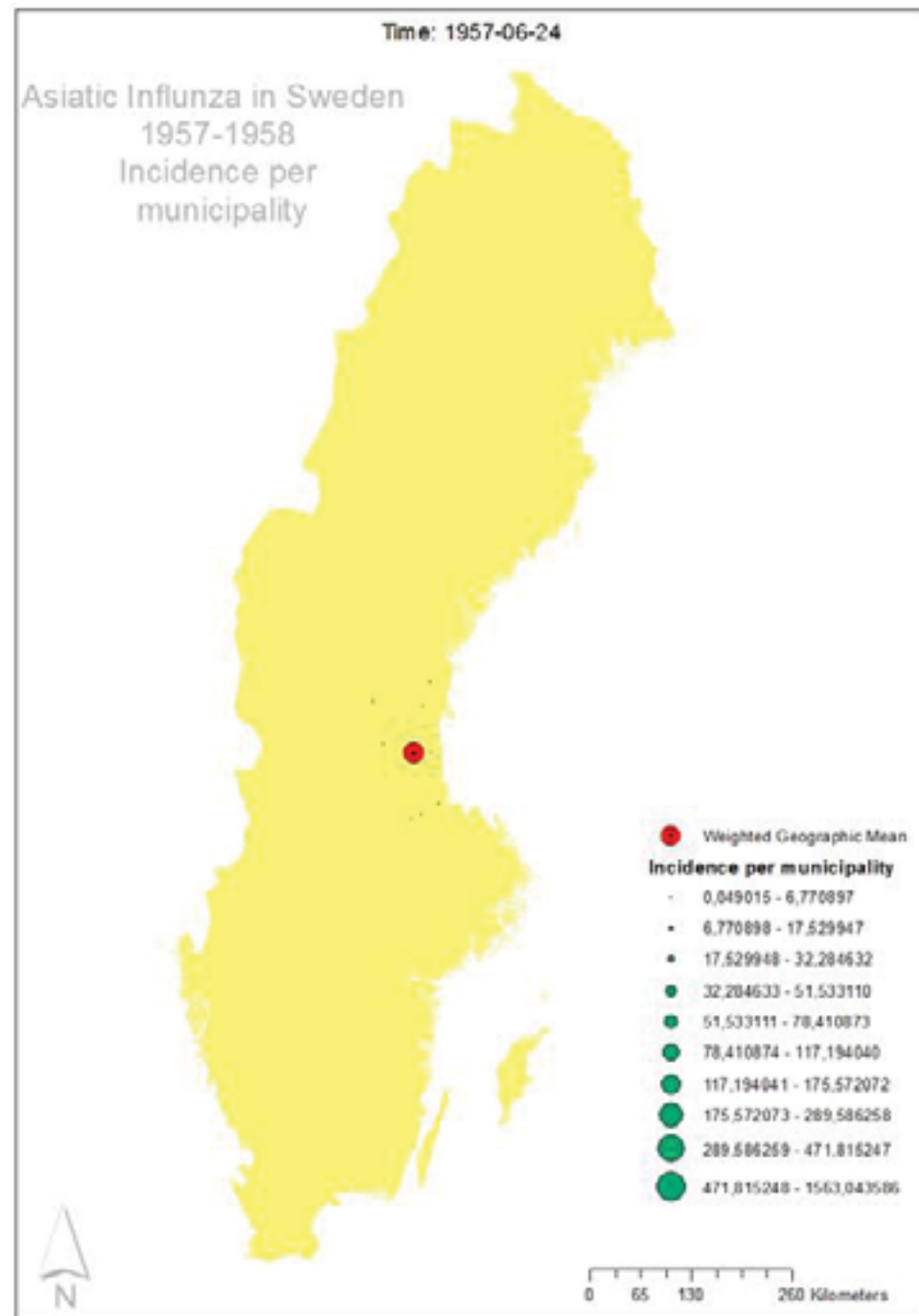
# Results

## Russian Influenza



# Results

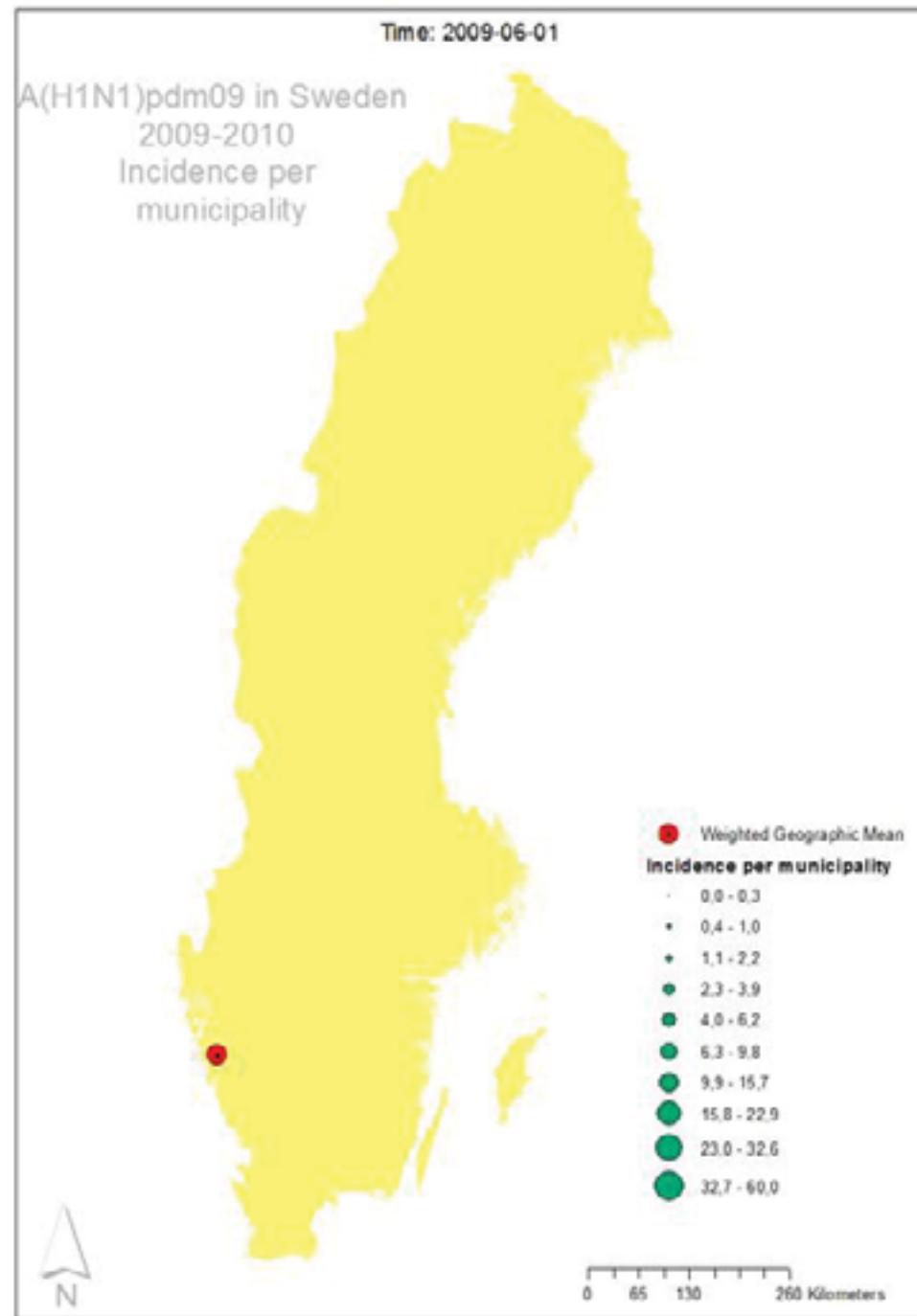
## Asian Influenza





# Results

A(H1N1)pdm09



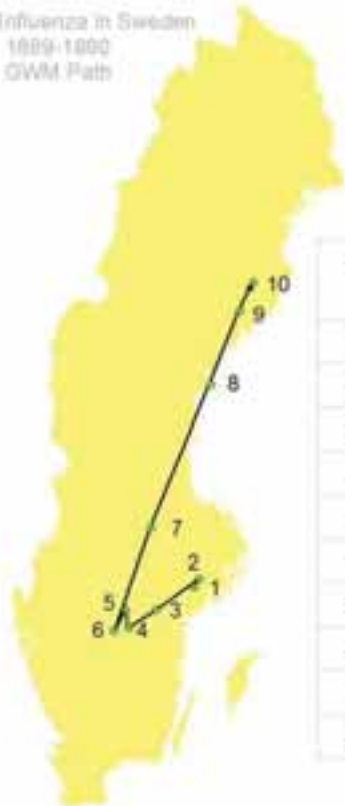
# Results

## Geographically weighted mean in time

### Directions of GWM during epidemic period

Pandemic	Compass angle of resulting vector	Average length of vector (km)
Russian	14	109
Asian	29	50
A(H1N1)pdm09	205	59

Russian Influenza in Sweden  
1889-1890  
GWM Path



No	Week No
1	8949
2	8950
3	8951
4	8952
5	9001
6	9002
7	9003
8	9004
9	9005
10	9006

Asian Influenza in Sweden  
1957-1958  
GWM Path



No	Week
1	5741
2	5742
3	5743
4	5744
5	5745
6	5746
7	5747
8	5748
9	5749
10	5750

A(H1N1)pdm2009 in Sweden  
GWM Path



No	Week
1	0943
2	0944
3	0945
4	0946
5	0947
6	0948
7	0949
8	0950
9	0951
10	0952

# Results

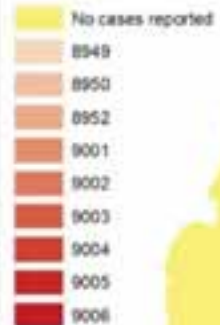
## Peaking week

Russian Influenza 1889-1890

Asian Influenza 1957-1958

A(H1N1)pdm09

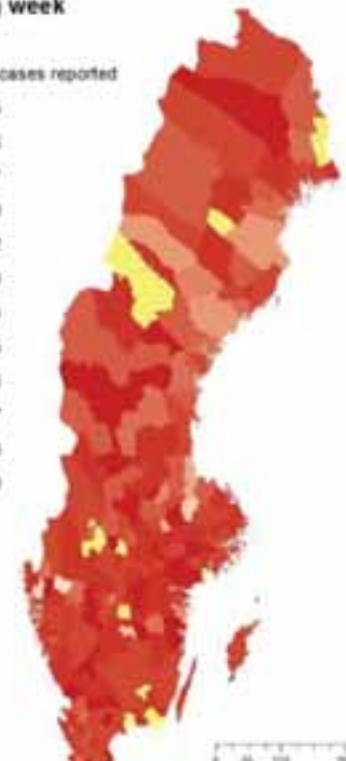
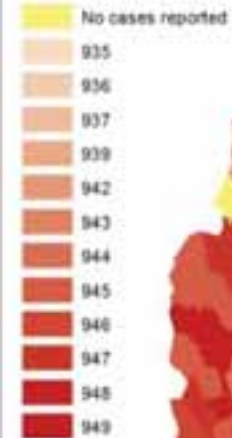
Peaking week



Peaking week

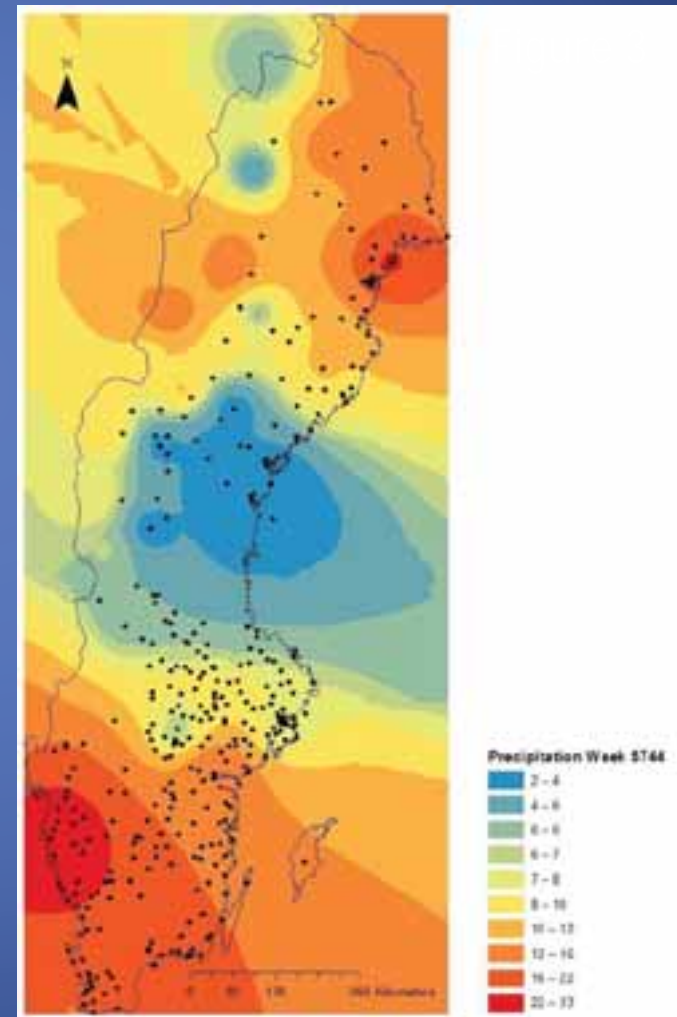
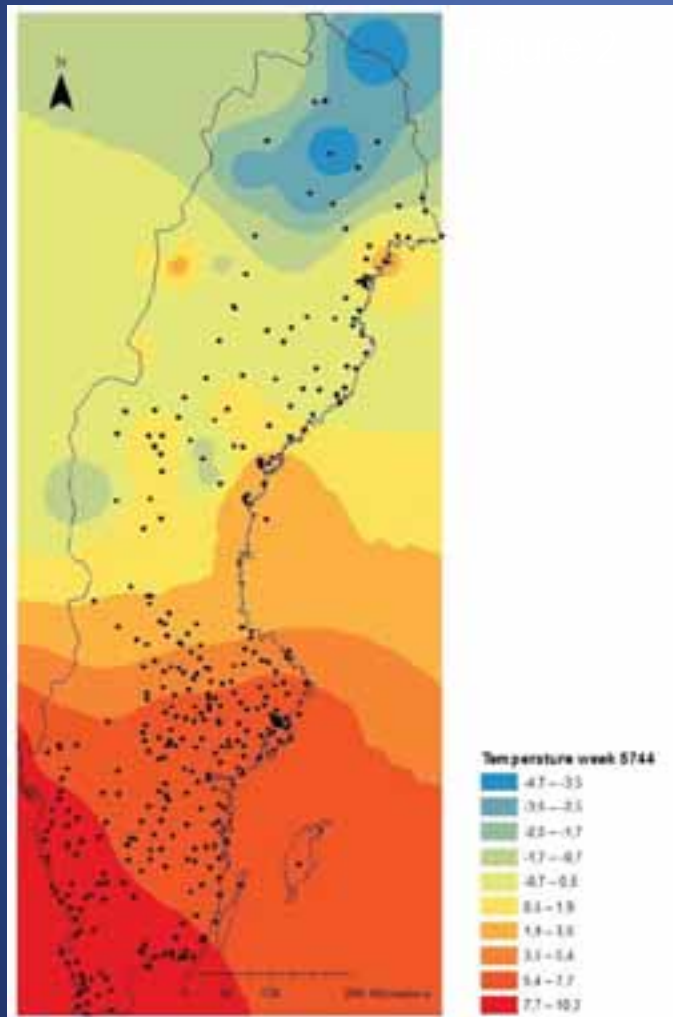


Peaking week



# Results

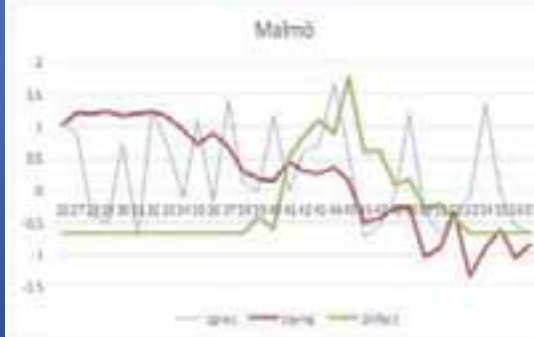
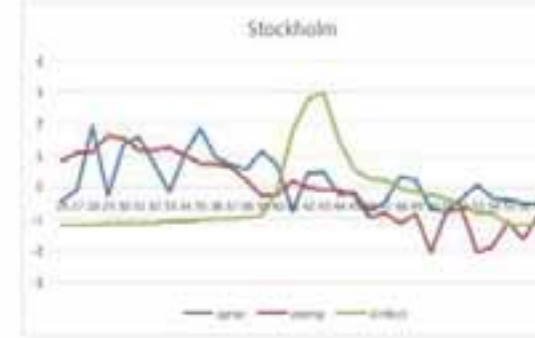
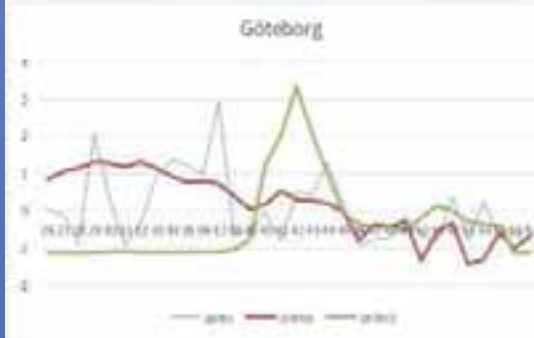
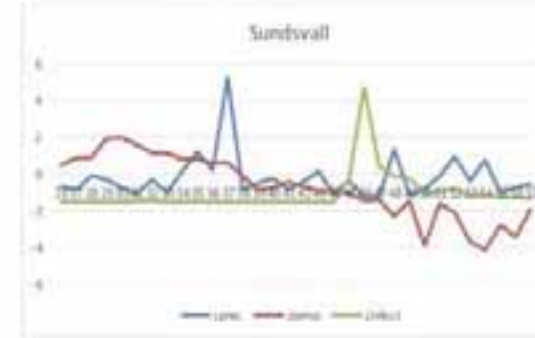
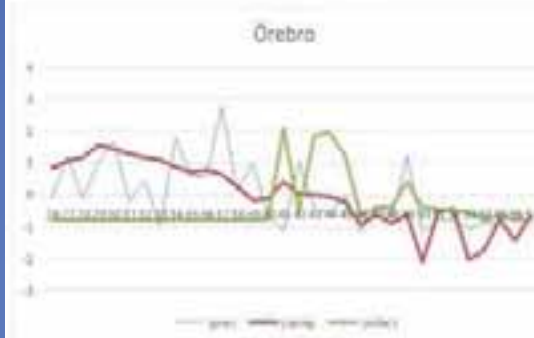
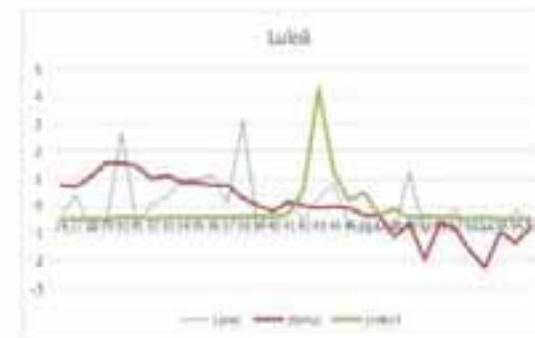
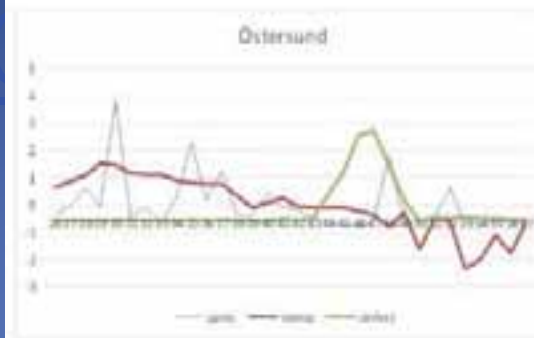
## Climate observations





# Results.. \Bilder\

Falling temperature prior to onset of peaking period

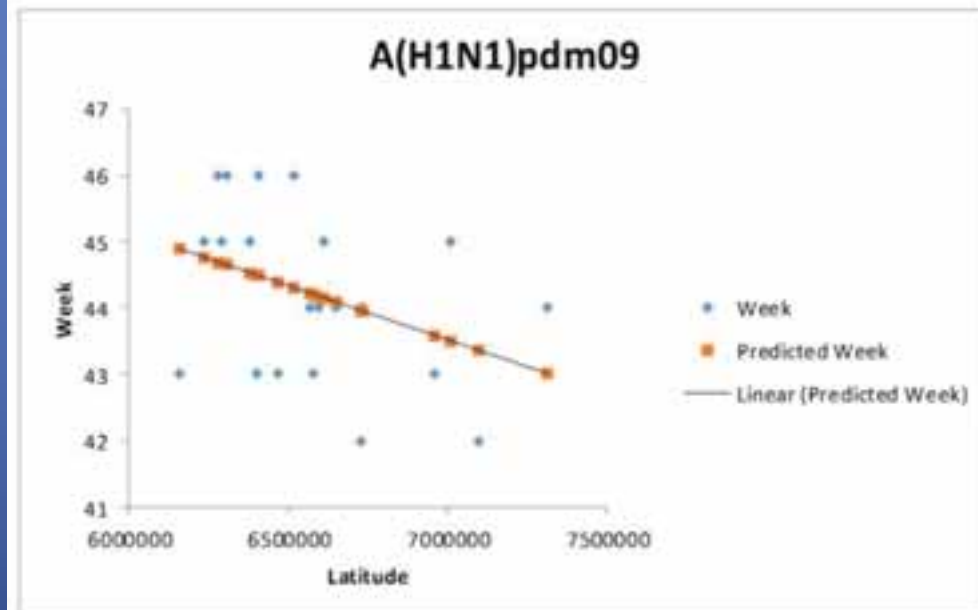
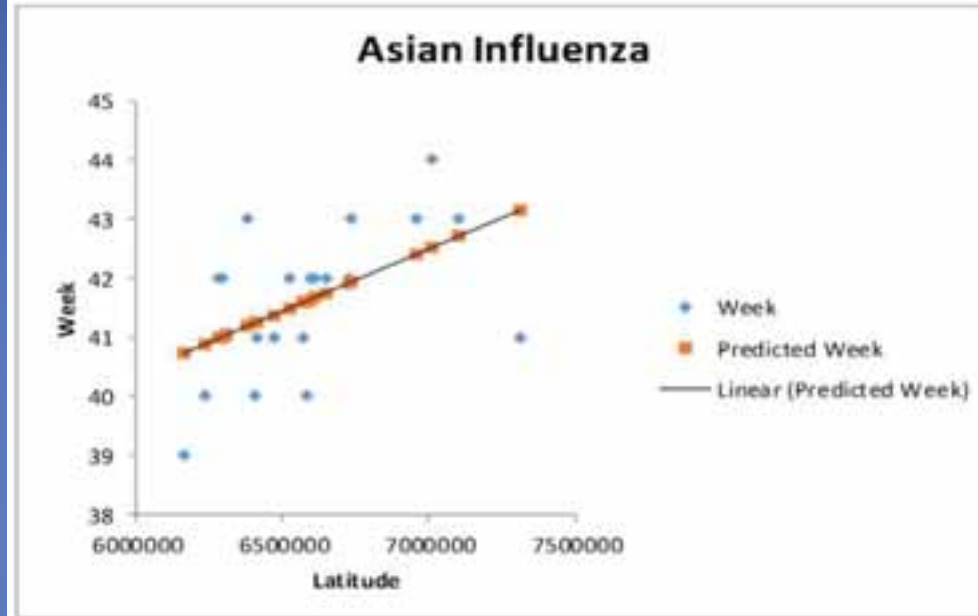




# Results

## Peaking period and latitude

Time for onset of peaking period vs latitude for county capitals for the Asian Influenza and the A(H1N1)pdm09



# Discussion

- Quality of data; ILI vs laboratory tests
- Interventions
- Incidence and peaking period
- Climate

# Conclusions

- Each pandemic had an epidemic period of approximately 10 weeks
- The weekly geographic weighted mean (GWM) of the incidence of the Russian and the Asian Influenza pandemics is mainly moving along a line from southwest to northeast. The weekly GWM for the A(H1N1)pdm09 influenza pandemic moved in the opposite direction, but along a line parallel to the one above
- The epidemic period of the Asian Influenza was preceded by falling temperatures
- The power of spatiotemporal analysis and modeling has been clearly demonstrated and epidemiologists have been given new information to be used in the development of new models for preparedness, prediction and analysis

Thank you for listening!

[lars.skog@esri.se](mailto:lars.skog@esri.se)