International Workshop on Clinical Data Analytics (WCDA 2016)

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Tools for Modeling Disease Dynamics

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Overview

- Disease Modeling
- Tools for Modeling Disease Dynamics
- FRED
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 - ✓ Key Features
 - ✓ Synthetic Population
 - ✓ Steps for Disease Modeling in FRED
 - ✓ SEIR model for Influenza Modeling in FRED
- ArcGIS
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 - ✓ Spatial Modeling of Disease in ArcGIS Software
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 - ✓ GWR Model for Influenza Modeling in ArcGIS
- MATLAB
 - ✓ Disease Modeling in MATLAB

Disease Modeling

- Disease models can project how infectious diseases progress to show the likely outcome of an epidemic and help inform public health interventions.
- Models use some basic assumptions and mathematics to find parameters for various infectious diseases and use those parameters to calculate the effects of possible interventions, like mass vaccination programmes.

Tools for Modeling Disease Dynamics

- FRED (A Framework for Reconstructing Epidemiological Dynamics)
- ArcGIS (Aeronautical Reconnaissance Coverage Geographic Information System)
- MATLAB (Matrix Laboratory)

About FRED

- FRED (A Framework for Reconstructing Epidemiological Dynamics) is a modeling system that supports research on the dynamics of infectious disease epidemics and the interacting effects of mitigation strategies, viral evolution, and personal health behavior.
- FRED was designed as a flexible, modular, open source framework for epidemic modeling, rather than a model of a particular infectious disease.

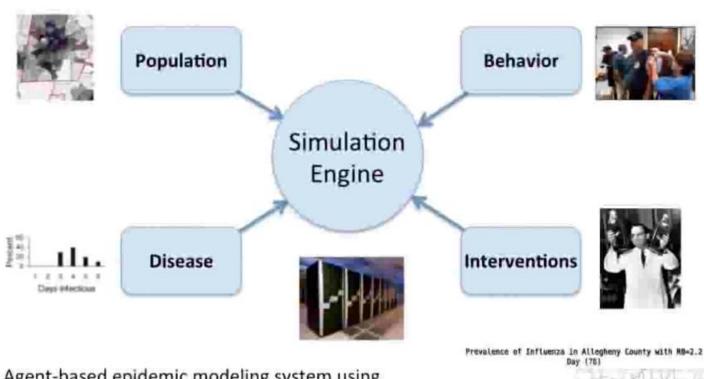
Key features of FRED

- Highly modular, object-oriented software design
- Realistic synthetic populations
- Scalable and efficient simulation of large epidemics
- Flexible ways to specify agent health behavior and decision rules

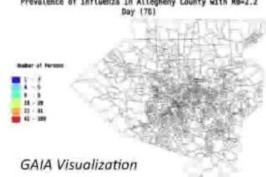
Synthetic Population

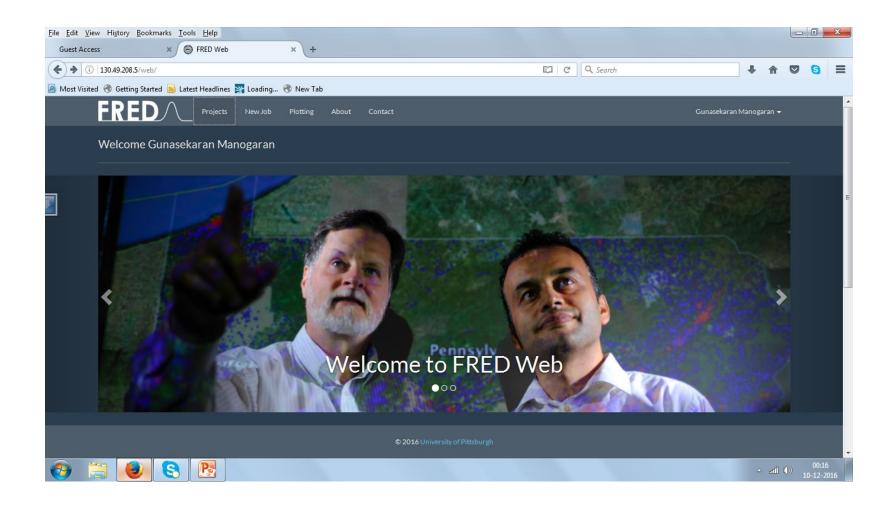
• FRED explicitly represents every individual in a specific geographic region. Each agent has a set of socio-demographic characteristics and daily behaviors that include age, sex, employment status, occupation, and household location and membership in a set of social contact networks.

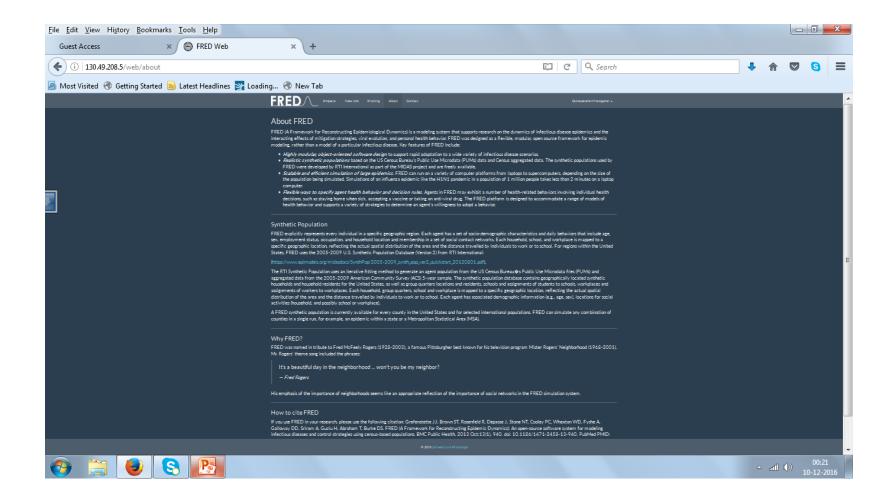
FRED: Framework for Reconstructing Epidemic Dynamics

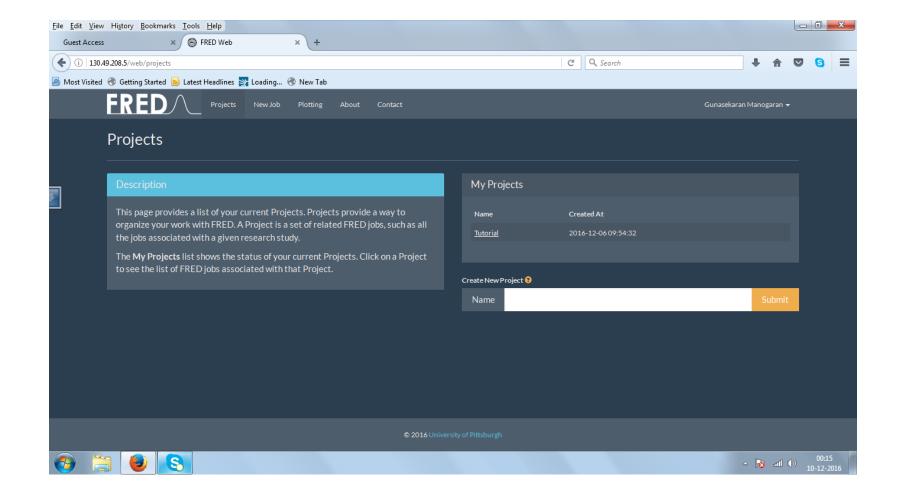


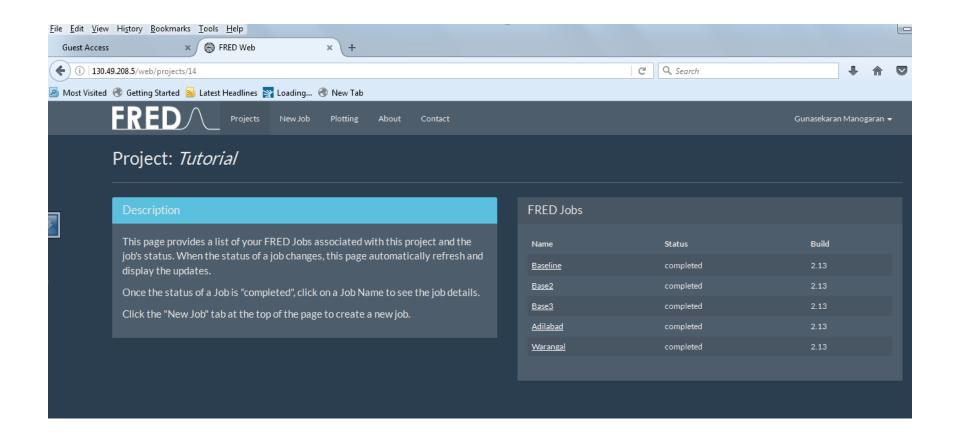
- Agent-based epidemic modeling system using census-based population models
- User settable parameters specify infectiousness of epidemic, control measures and human behaviors
- Simulation available for every county in the U.S.

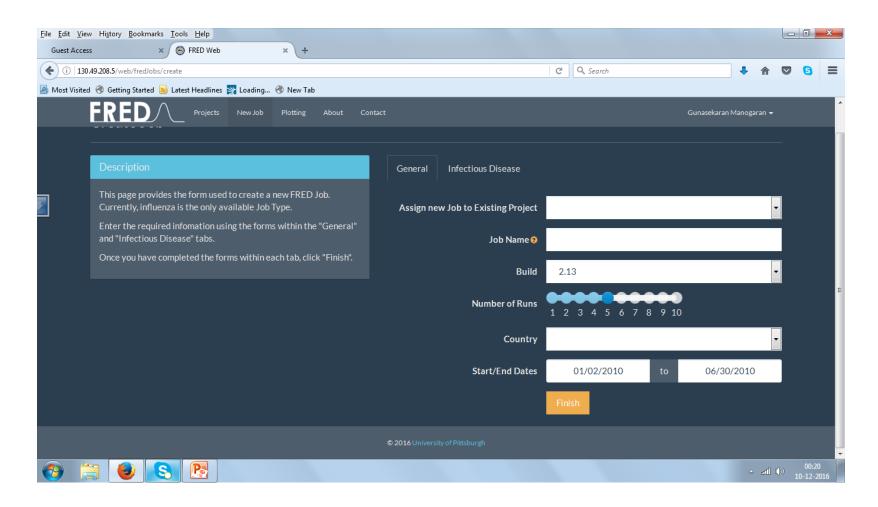


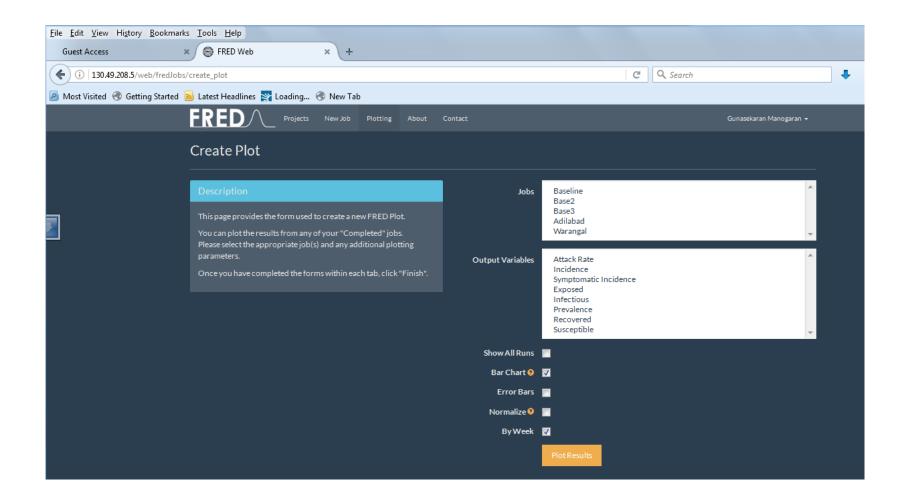


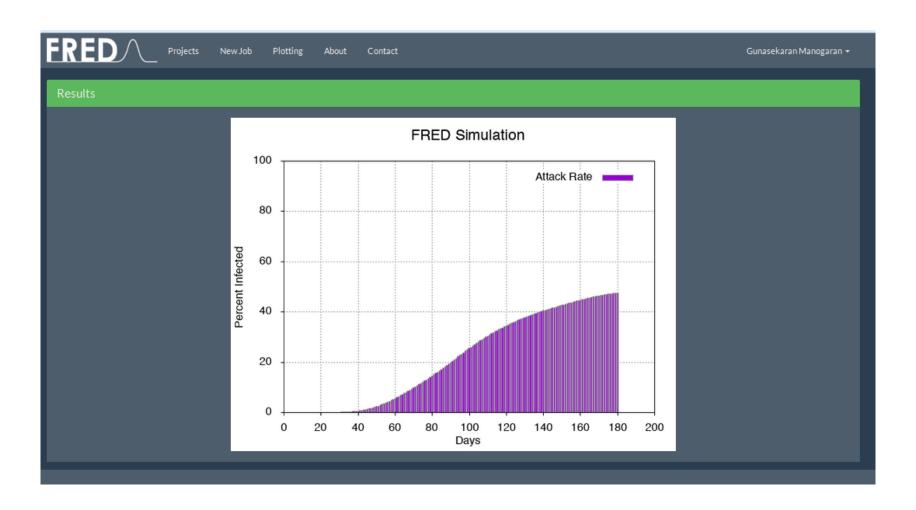


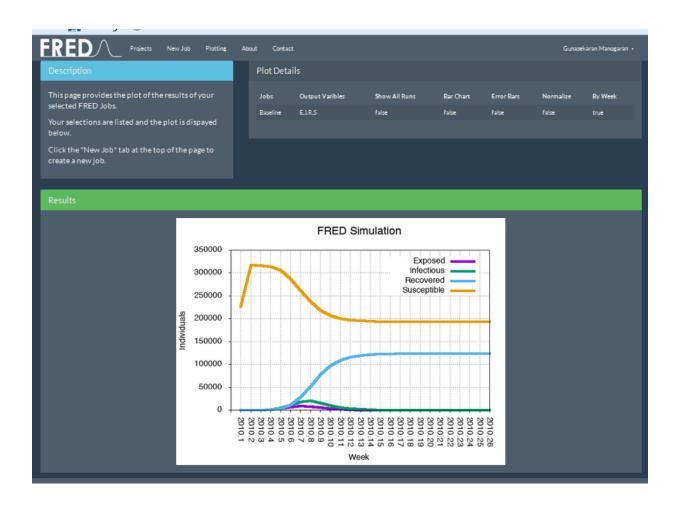


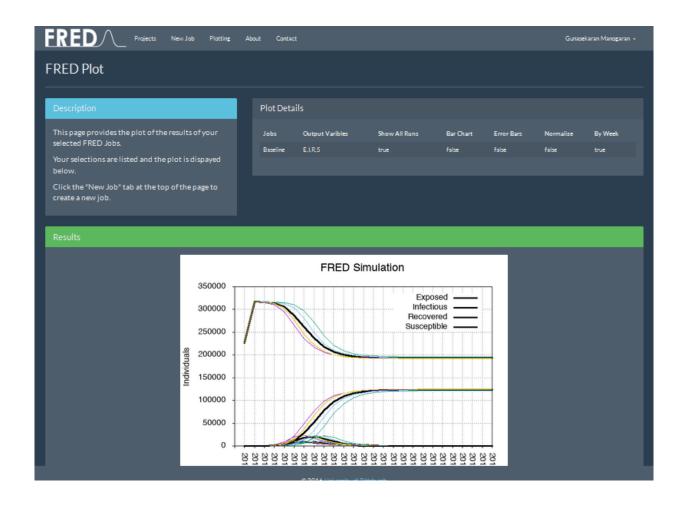


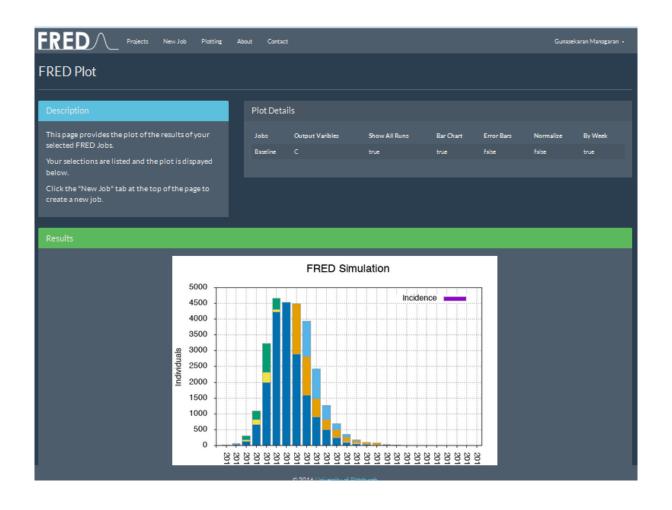


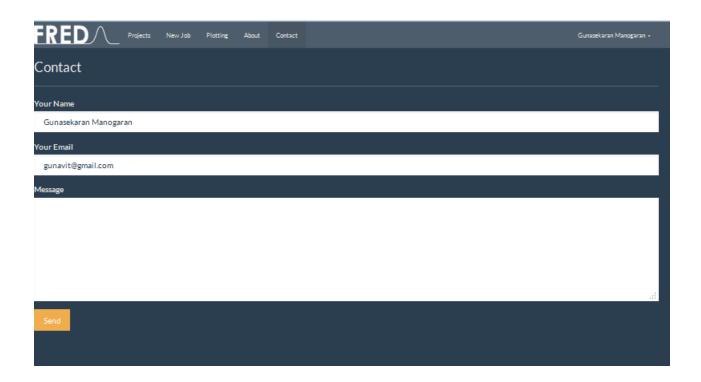


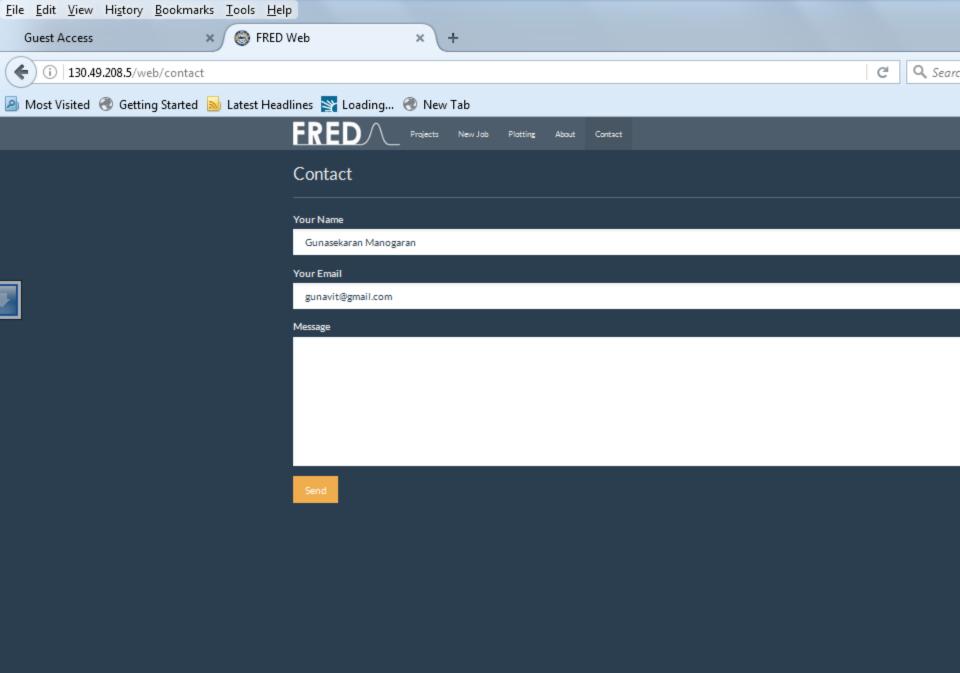








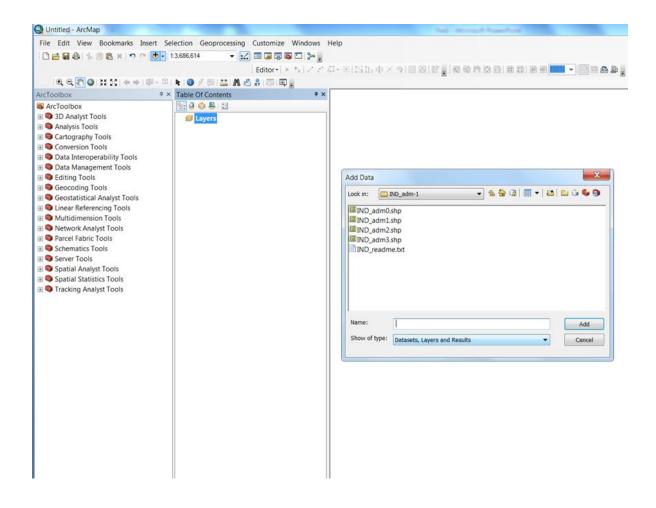


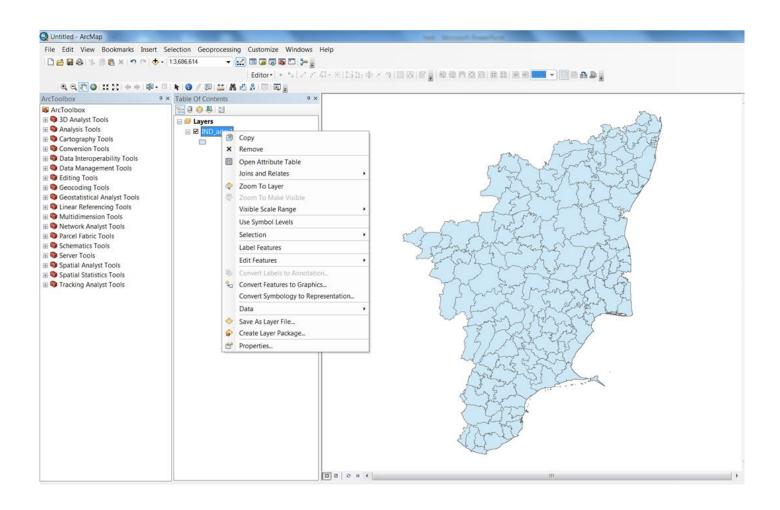


Spatial Epidemic Modeling in ArcGIS

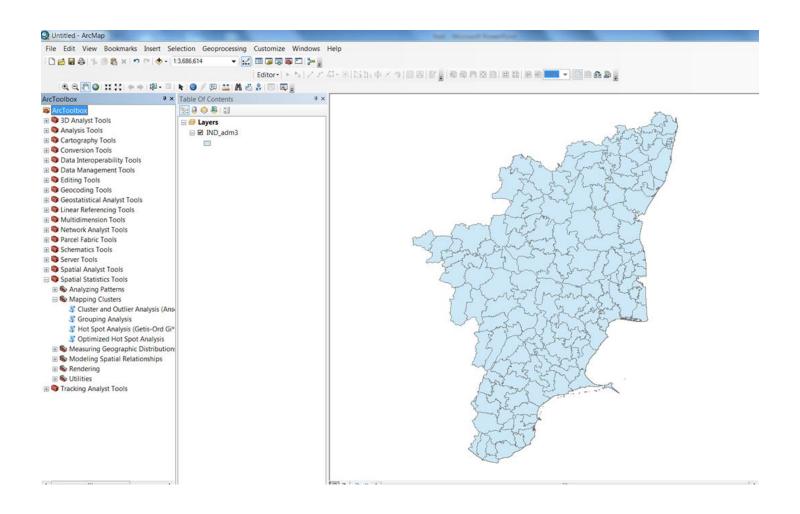
Spatial Modeling of Diseases in ArcGIS Software

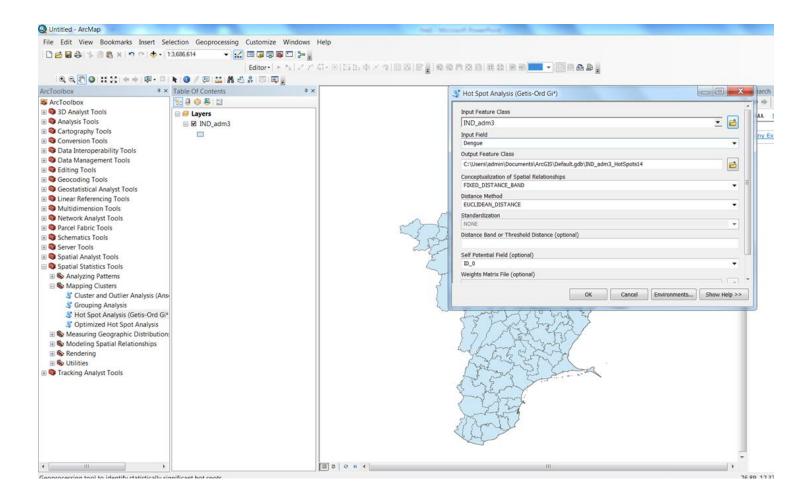
ArcGIS for Desktop allows you to analyze your data and author geographic knowledge to examine relationships, test predictions, and ultimately make better decisions.

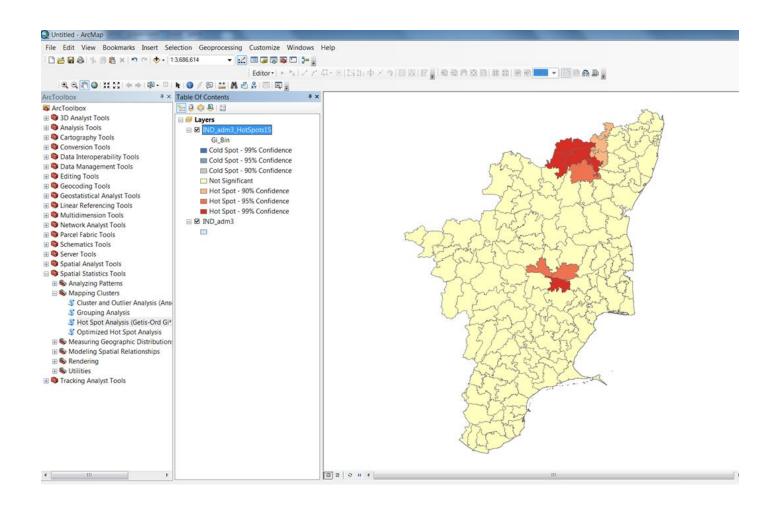


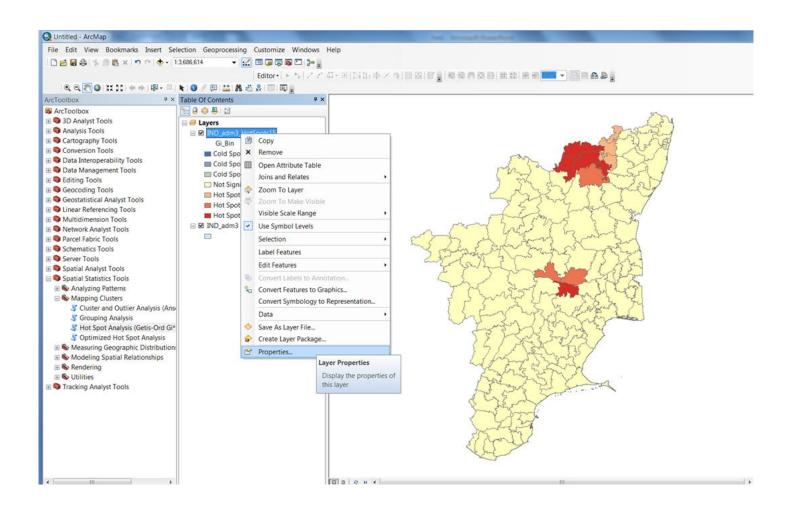


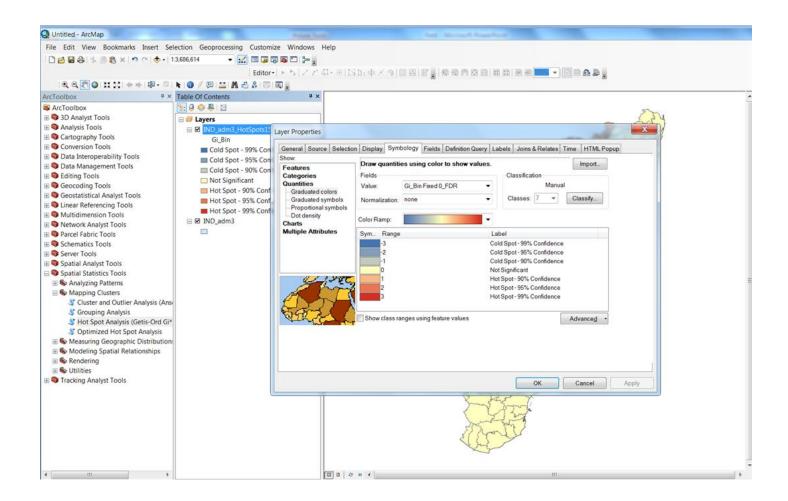
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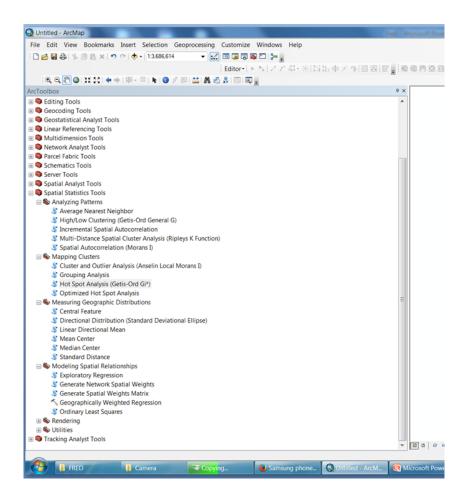


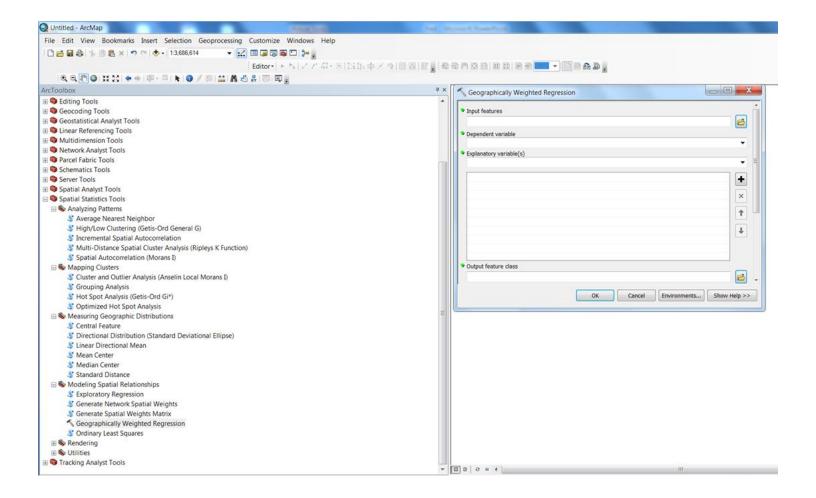








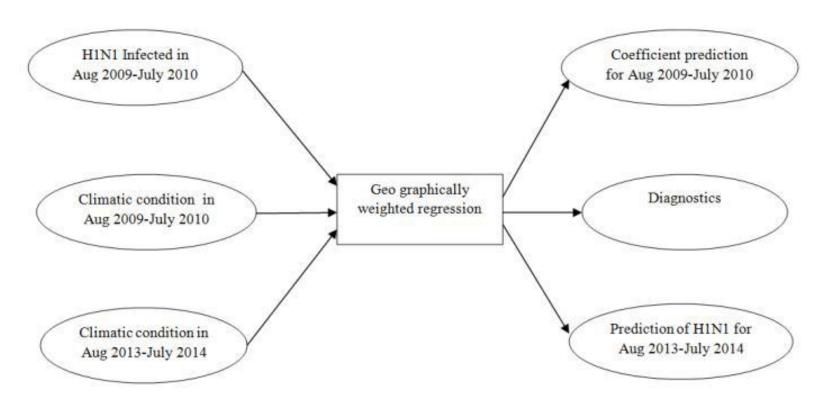




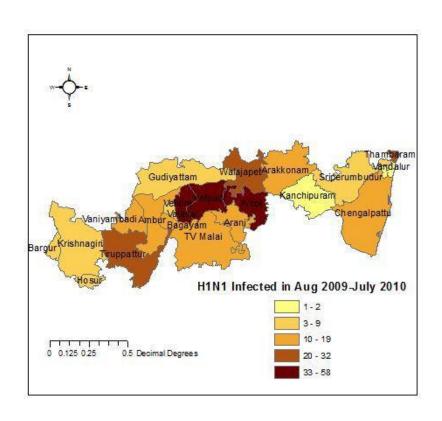
Case Study

The study objective is to develop a spatial data model to predict the epidemiological impact of influenza in Vellore, India.

Geographically Weighted Regression Model of H1N1 Influenza Epidemic



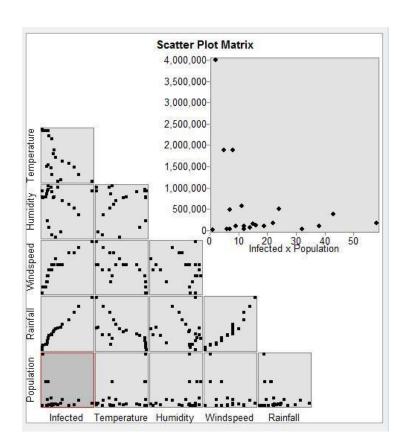
H1N1 influenza prevalence during August 2009-July 2010

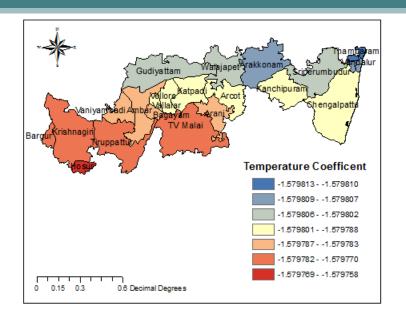


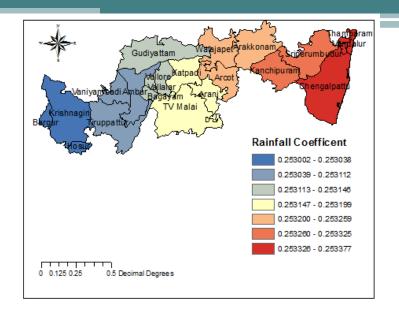
Climate conditions in Vellore.

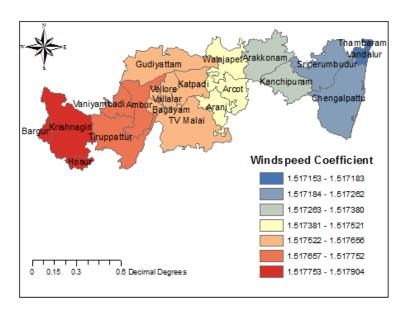
FID	NAME_3	Infected	Temperature	Humidity	Windspeed	Rainfall	Population
0	Kelambakkam	6	24.56	64.21	6	63	23453
1	Thambaram	22	20.76	54.23	9	85	174787
2	Koyambedu	1	35.56	64.98	4	56	12323
3	Vandalur	1	35.24	63.45	4	59	13311
4	Krishnagiri	8	25.02	66.34	7	71	1879809
5	Chengalpattu	11	24.12	65.96	8	75	571254
6	Kanchipuram	2	35.23	63.23	5	62	3998252
7	Sriperumbudur	7	35.23	57.04	6	65	486063
8	Arani	14	28.43	63.12	9	79	63671
9	TV Malai	15	29.45	63.34	9	81	144278
10	Arakkonam	12	32.65	64.85	9	76	101626
11	Arcot	38	24.3	60.4	11	105	95955
12	Gudiyattam	9	33.56	55.34	8	74	91558
13	Tiruppattur	24	26.2	62.34	9	89	500455
14	Ambur	16	27.3	52.76	10	83	114608
15	Katpadi	43	22.3	58.57	12	112	387922
16	Walajapet	32	25.4	61.34	11	95	32397
17	Vaniyambadi	19	20.23	65.87	9	84	95061
18	Bagayam	12	22.12	53.32	8	75	23145
19	The state of the s	58	20.3	65.01	13	124	177230
20	Vallalar	7	35.1	64.98	7	68	25092
21	Hosur	8	35.023	65.34	7	72	1879809
22	Bargur	5	35.22	63.3	5	63	1879809

Correlation analysis using scatter plots

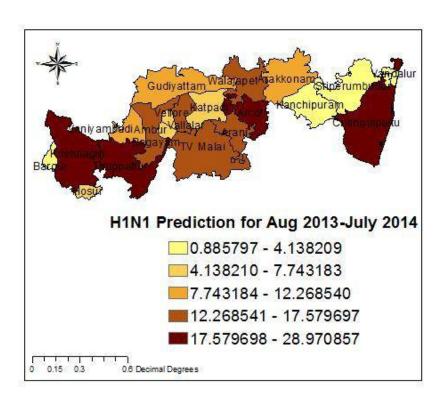








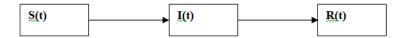
Prediction of H1N1 influenza



Epidemic Modeling in MATLAB

SIR Epidemic Model in MATLAB

SIR Model



Model Equation

$$\frac{di}{dt} = \lambda s i - \mu i, \qquad I(0) = i_0$$

$$\frac{ds}{dt} = -\lambda s i, \qquad S(0) = s_0$$

$$\frac{dr}{dt} = \mu i, \qquad r_0 = 0$$

$$S(t) + I(t) + R(t) = N$$

Where,

s → susceptible

i → infected

 $\underline{r} \rightarrow \text{recovered}$

 $\lambda \rightarrow$ Contact rate

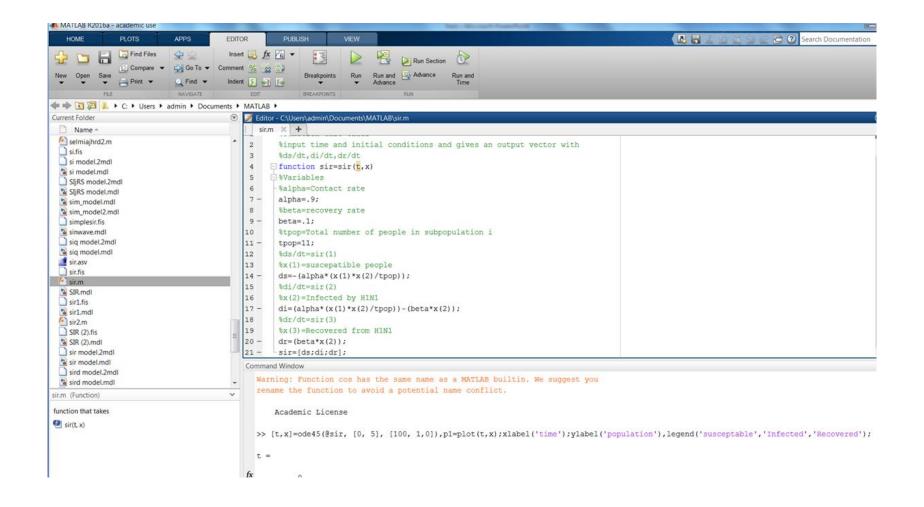
 $\mu \rightarrow$ Recovered rate

MATLAB Code for SIR Epidemic Model

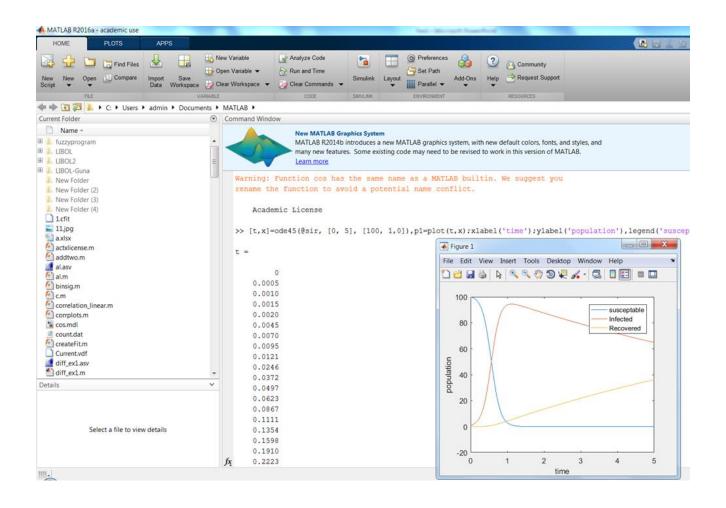
```
%function that takes
%input time and initial conditions and gives an output vector with
%ds/dt,di/dt,dr/dt
function sir=sir(t,x)
%Variables
%alpha=the global transmission rate
alpha=.3;
%beta=contact rate per day by people in subpopulation i
beta=.9;
%gamma=Infectious mortality of subpopulation i, from infected class
%gamma=.01;
%tow=Rate of progression from exposed to infected (??1 is latent period)
tow=1;
%row=Recovery rate
row=.5;
%tpop=Total number of people in subpopulation i
tpop=10;
%ds/dt=sir(1)
```

```
%x(1)=suscepatible people
ds = -(beta*alpha*(((x(2)+x(3))*x(1))/tpop));
% de/dt = sir(2)
%x(2) = exposed by H1N1
di=(beta*alpha*(((x(2)+x(3))*x(1))/tpop))-(tow*x(2));
%di/dt=sir(3)
%x(3)=Infected by H1N1
di=(alpha*(((x(2)+x(3))*x(1))/tpop))-(tow*x(2));
%dr/dt=sir(4)
%x(4)=Recovered from H1N1
dr=(row*x(2));
%dr/dt=sir(5)
%x(4)=Death people
sir=[ds;di;dr];
```

MATLAB Simulation



MATLAB Simulation



Thank You!