



Population Dynamics in the Presence of Infectious Diseases

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FINAL PROJECT
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INTRODUCTION

INFECTIOUS DISEASES:

- Epidemic
- Endemic

FACTORS:

- Sanitation and good water supply
- Human behavior
- Antibiotics and vaccination programs
- Agents that adapt and evolve
- Climate change



COMPARTMENTS

- M= Passively Immune
- S= Susceptible
- E=Exposed
- I=Infective
- R=Recovered
- T=Treated
- V=Vaccinated


PARAMETERS

- β =contact rate
- $1/\delta$ =period of passive immunity
- $1/\varepsilon$ = latent period
- $1/\gamma$ =infectious period



Contact Rate

- Contact Rate β is the number of 'adequate contacts' that a person makes per time
- For example if each person makes 10 'adequate contacts' on average per year, the contact rate would be 10 per year.
- If the infective fraction of the population is $i=1/3$, $1/3$ of these contacts would be with the infectives.
- The susceptible population $S=3000$ would then have $3000 * 10/3 = 100$ adequate contacts with the infectives within a year.
- This is the number of new cases per time.



Simplest Model: SIR for an Epidemic

S=Susceptible

I=Infected

R=Recovered

β =contact rate

$1/\gamma$ =infectious disease duration

• Population N

1. $dS/dt = -\beta IS/N$

2. $dI/dt = \beta IS/N - \gamma I$

3. $dR/dt = \gamma I$

• Dividing them by N

1. $ds/dt = -\beta is$

2. $di/dt = \beta is - \gamma i$

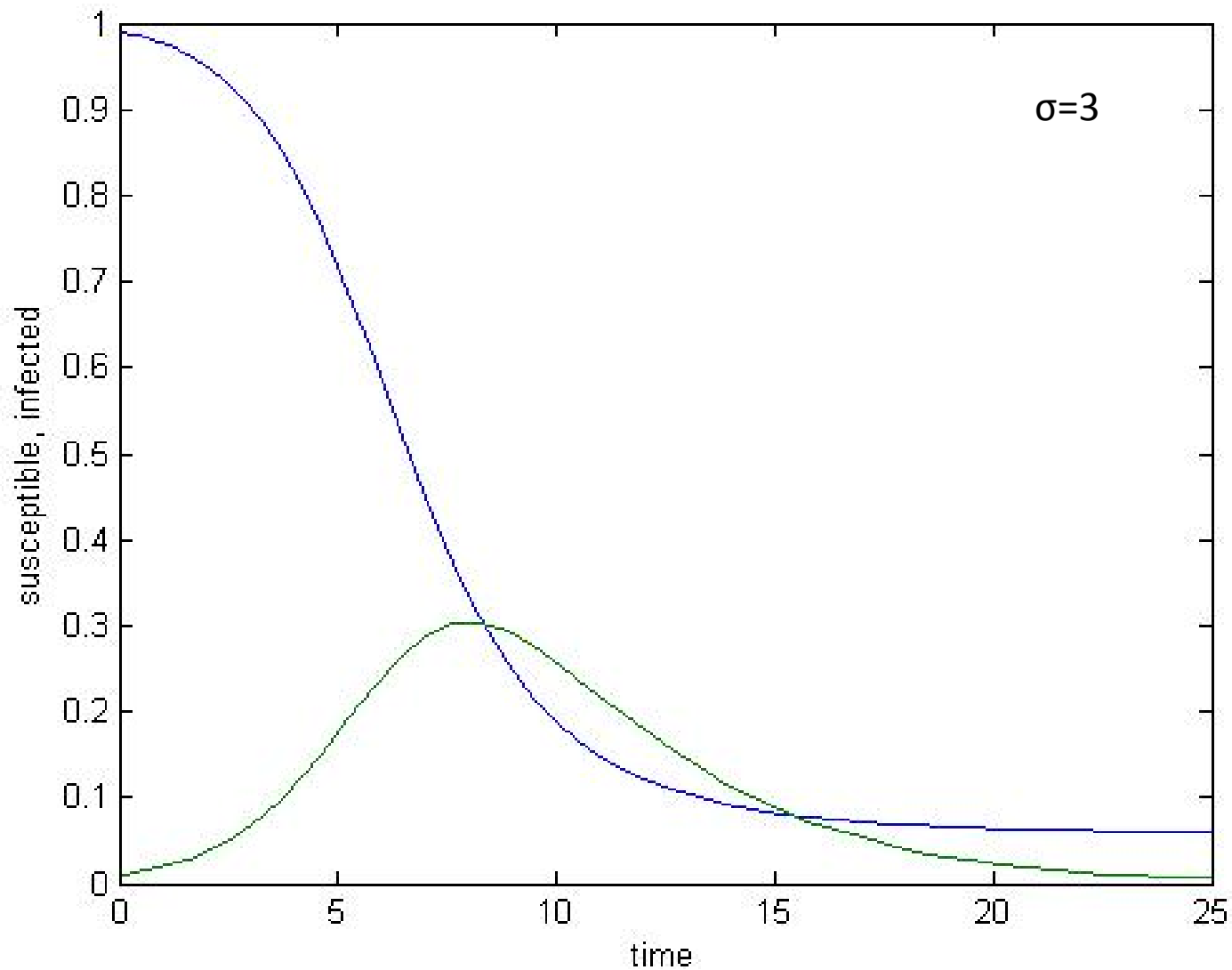
3. $dr/dt = \gamma i$

Adequate Contact Number (σ) = Contact Rate * Disease Duration = β/γ

Replacement Number $R(t)$ = Adequate Contact Number * Fraction of Susceptibles = $\sigma s(t)$



Susceptible:	0.99	$1/\sigma$	s_∞	At the peak of i , $R=s\sigma=1$
Infective:	0.01	i_{max}	0	As s keeps decreasing $R < 1$ and therefore i starts to decrease





Contact and Replacement

- Contact number σ is the number of ‘adequate contacts’ that an infective person makes throughout the infected period = β/γ
- The replacement number R is, the number of susceptible people that an infective person makes contact with throughout the infectious period $R = s\sigma$
- When the fraction of susceptible population is more than $1/\sigma$, the replacement number is more than 1, the infection spreads. When it is less than $1/\sigma$, the infection declines.

The susceptible function is a decreasing function and the limiting value can be found by:

1. $ds/dt = -\beta is$

2. $di/dt = \beta is - \gamma i$

- $di = (-1 + (1/\sigma s)) ds$

- Integrate from 0 to infinity:

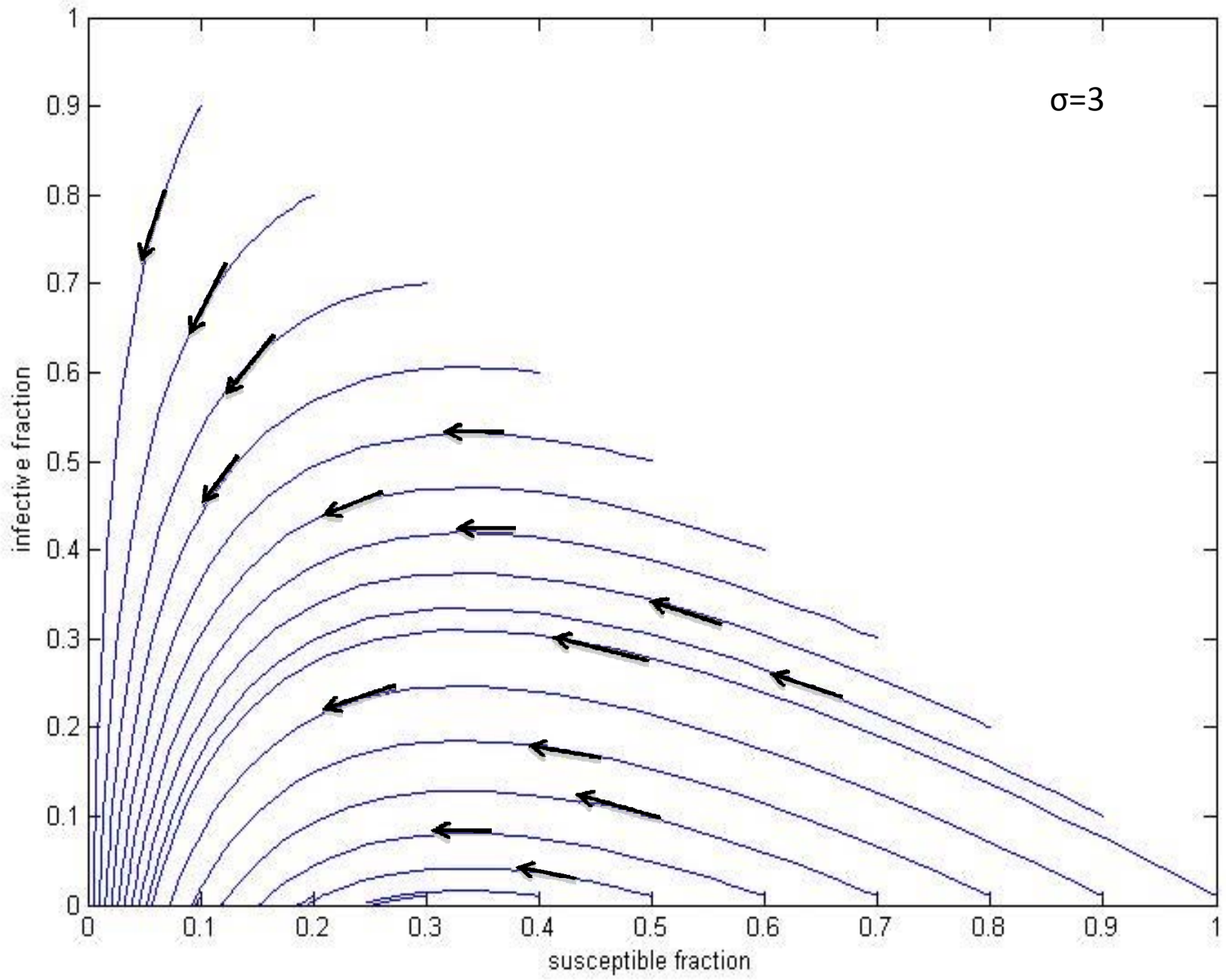
- $i_{\infty} - i_0 = s_0 - s_{\infty} + \ln(s_{\infty}/s_0)/\sigma$

- $i_0 + s_0 - s_{\infty} + \ln(s_{\infty}/s_0)/\sigma = 0$

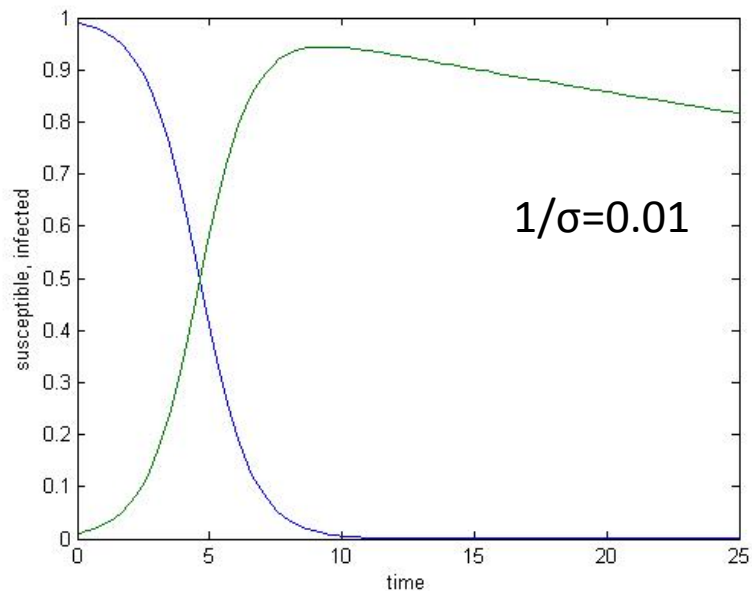
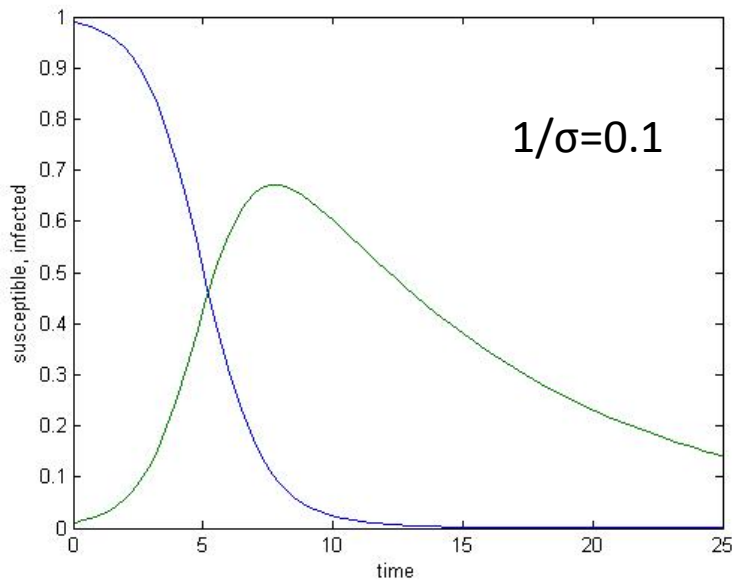
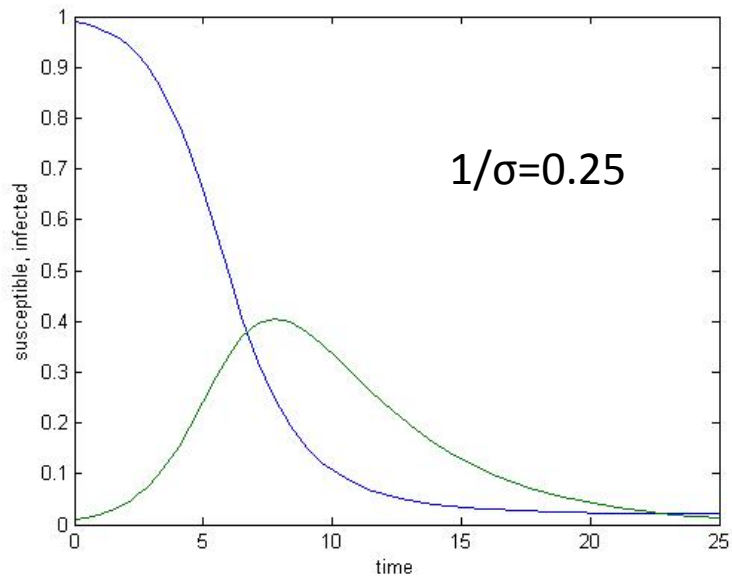
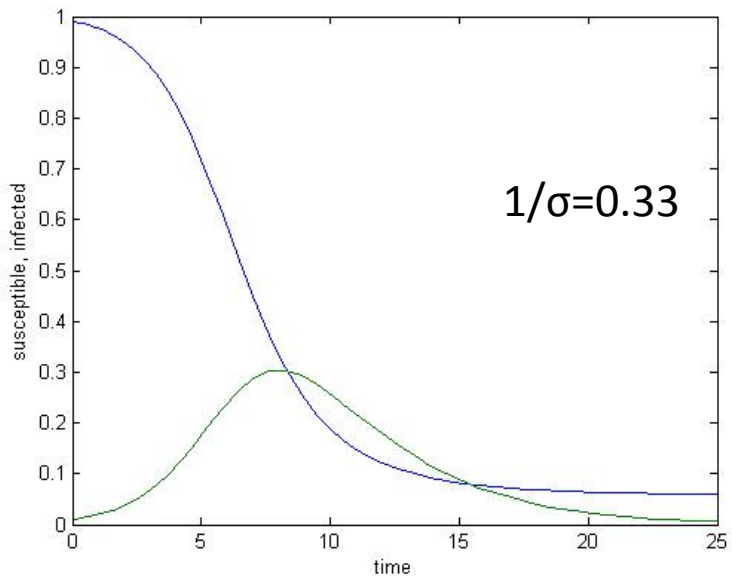


Calculating backward

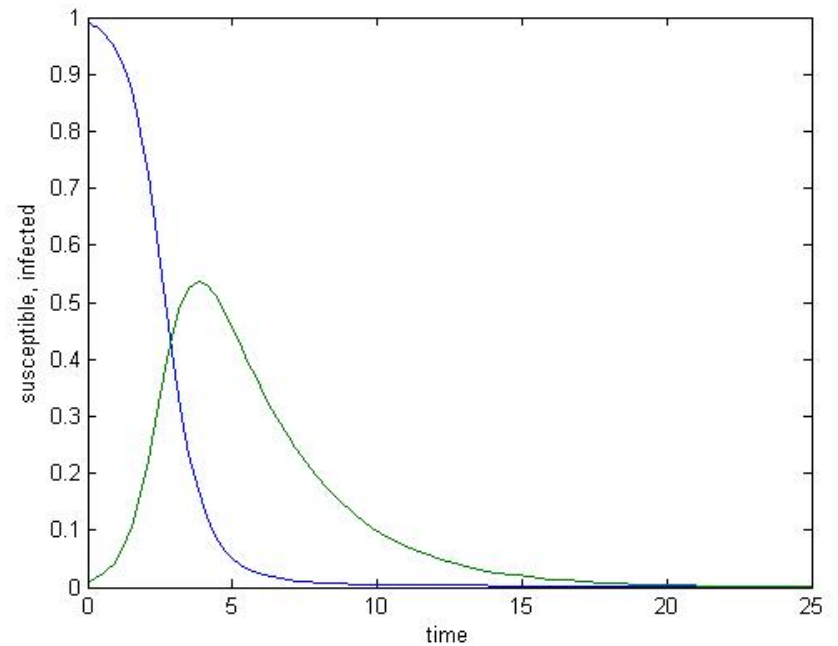
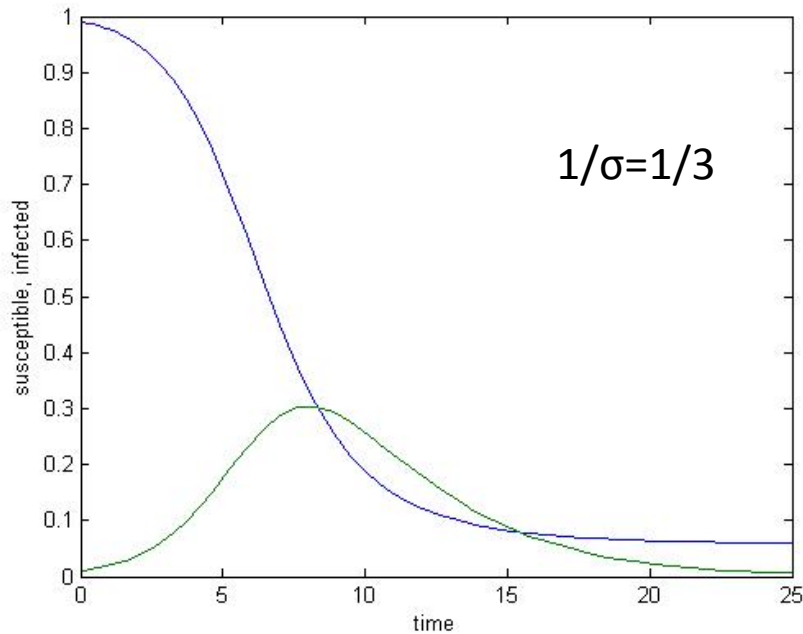
- The equation we had for the limiting value of the susceptible fraction was
- $i_0 + s_0 - s_\infty + \ln(s_\infty/s_0)/\sigma = 0$
- For negligible small initial infective fraction i_0
- $\sigma \approx \ln(s_0/s_\infty) / s_0 - s_\infty$
- By using data at the beginning and at the end of the epidemic, estimate the contact number



Increasing disease period



Or the contact rate



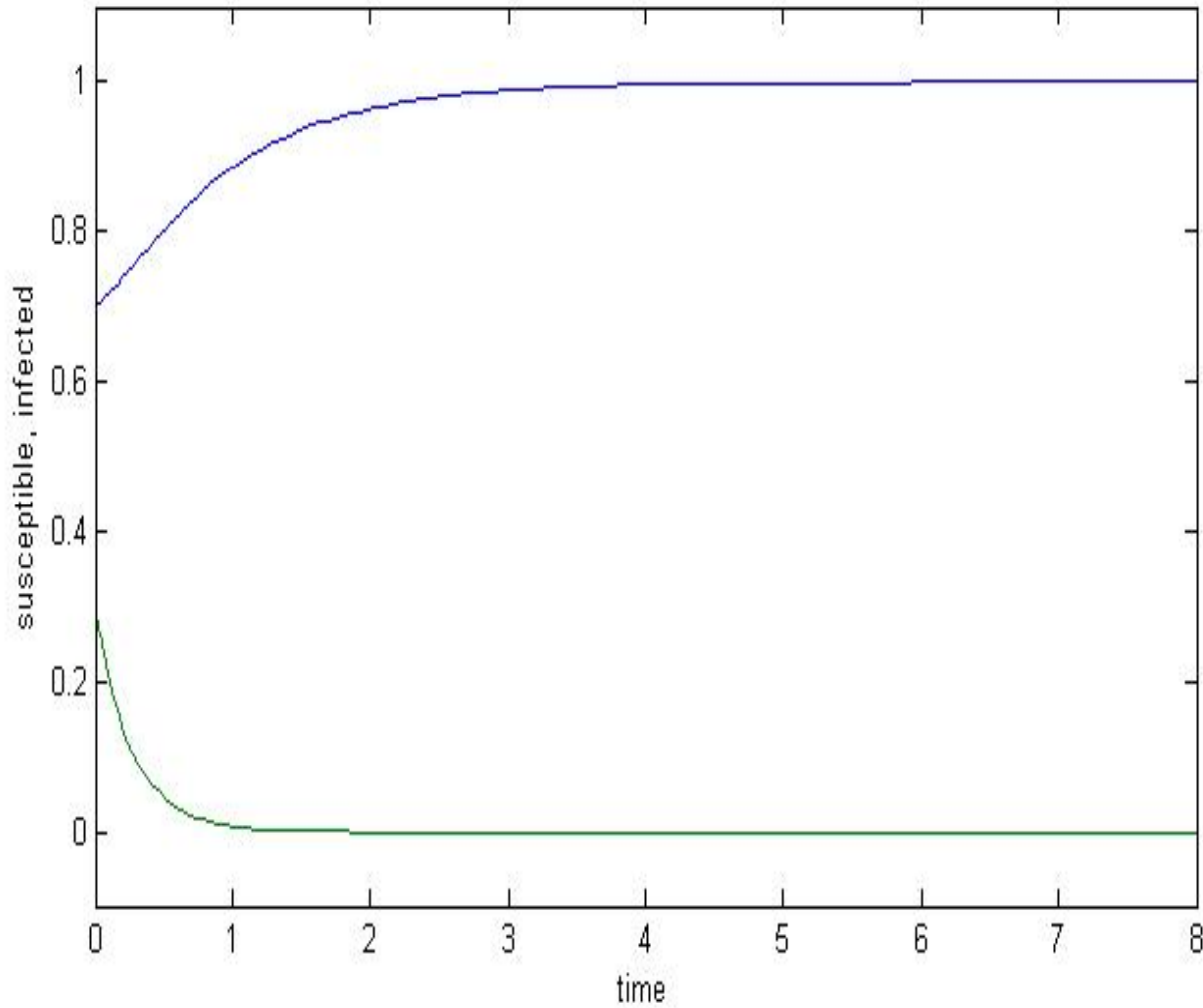
Limiting value of s goes down with increasing contact number



Endemics: With Vital Birth/Death Dynamics

1. $ds/dt = \mu - \mu s - \beta i s$
2. $di/dt = \beta i s - \gamma i - \mu i$
3. $dr/dt = \gamma i - \mu r$

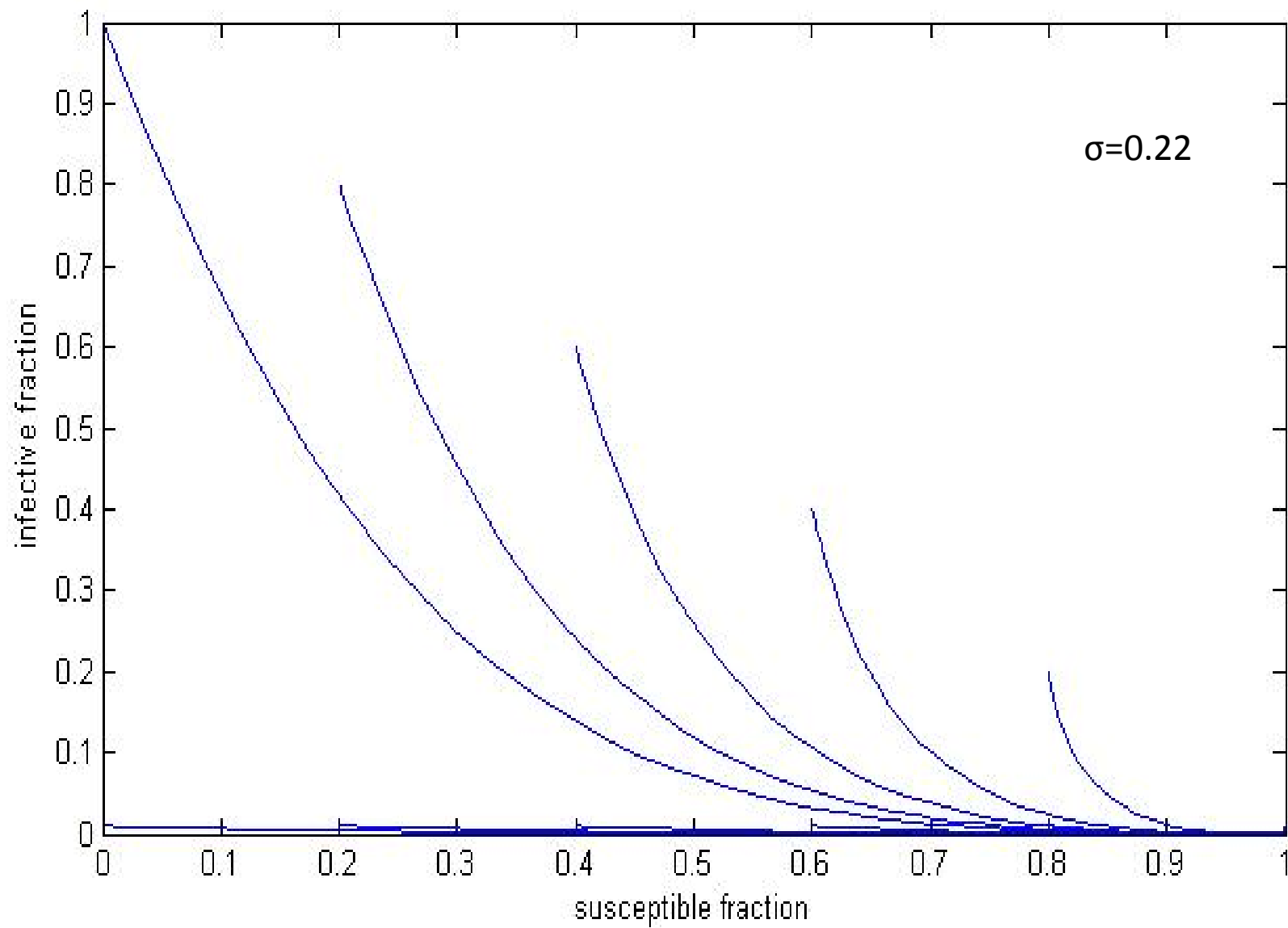
Replacement number $R = s\sigma$,
where the contact number σ is adjusted for death rate: $\sigma = \beta / (\gamma + \mu)$
Just like the epidemic case, for $R_0 = s_0 \sigma > 1$, i starts to go up, s starts to go down. Then when s is low enough, such that R crosses the threshold 1, i starts to go down as well. Unlike the epidemic case, new births are introduced into the s group and increase the replacement number again such that i starts to go back up. This continues until an equilibrium is reached.



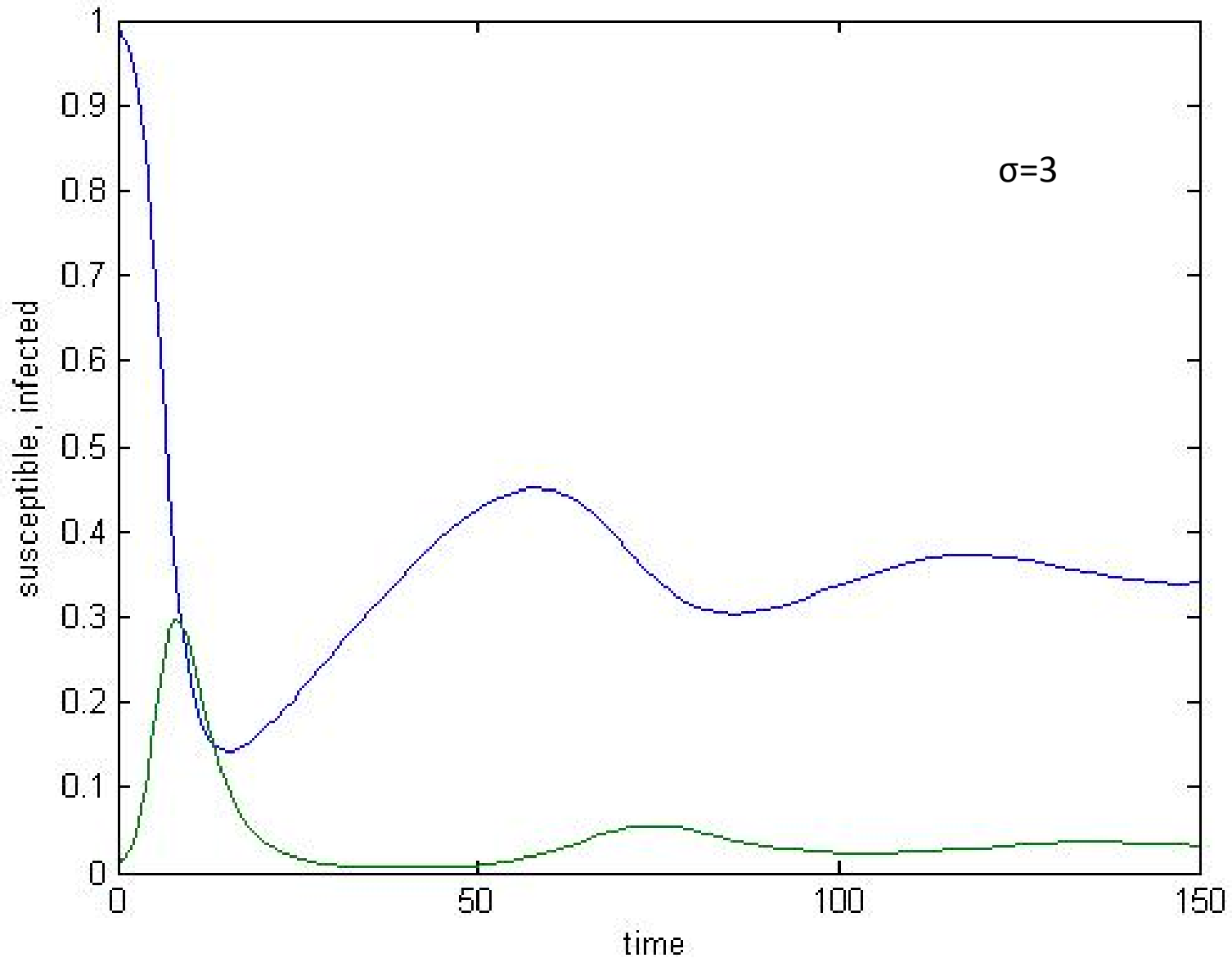
For $\sigma < 1$

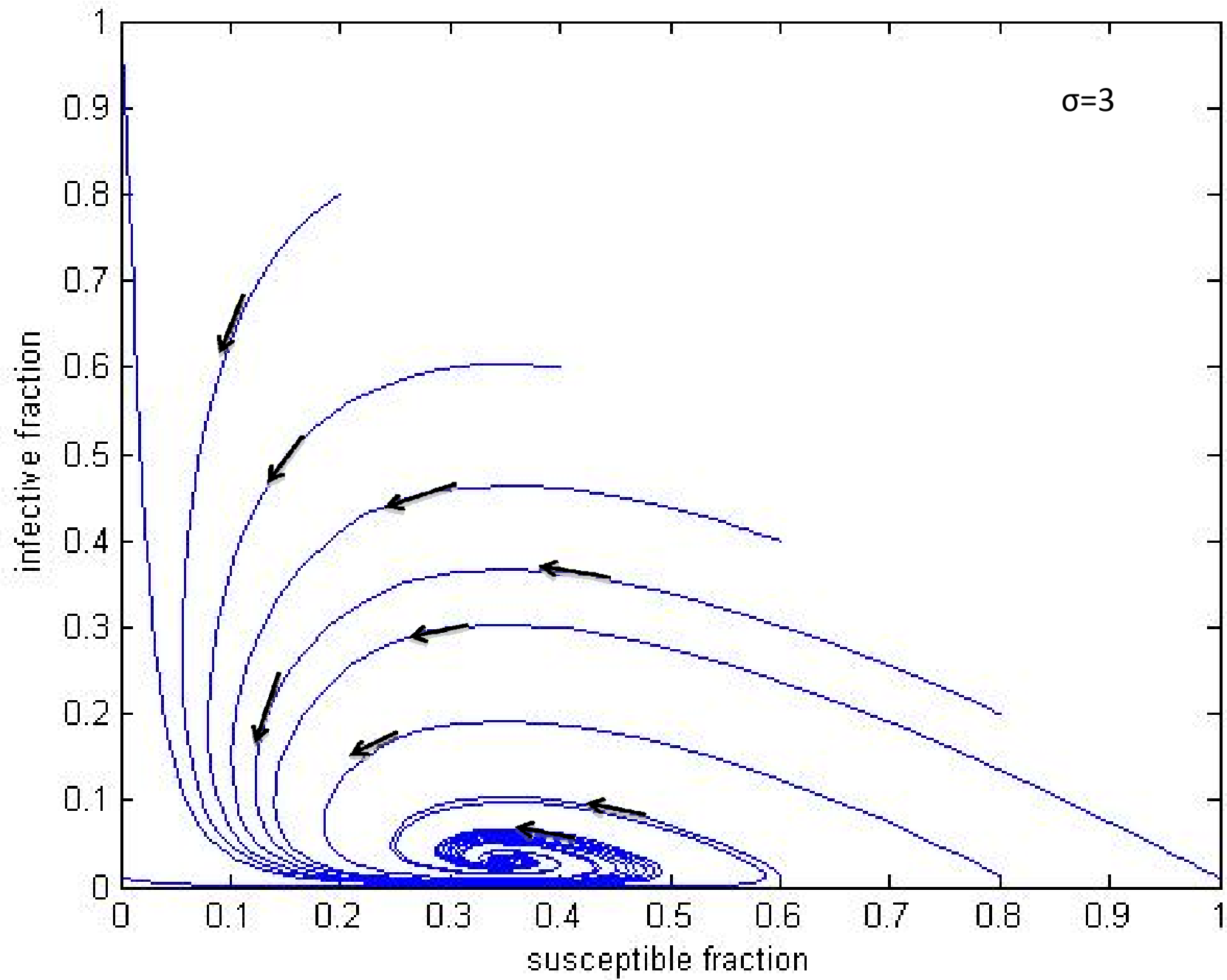
$S_{eq} = 1$

$i_{eq} = 0$



Endemic Equilibrium





Endemic Equilibrium

1. $ds/dt = \mu - \mu s - \beta i s = 0$

2. $di/dt = \beta i s - \gamma i - \mu i = 0$

$\rightarrow s_{eq} = (\gamma + \mu) / \beta = 1/\sigma$

$\rightarrow i_{eq} = \mu(\sigma - 1) / \beta$

Stability at the Equilibrium

- $dx/dt=f(x,y)$
- $dy/dt=g(x,y)$
- $u=x-x_{eq}$
- $z=y-y_{eq}$

At Equilibrium:

$$dx/dt=f(x_{eq},y_{eq})=0$$

$$dy/dt=g(x_{eq},y_{eq})=0$$

Near Equilibrium:

$$du/dt=f(x,y)\approx f(x_{eq},y_{eq})+\delta f/\delta x(x_{eq},y_{eq})u+\delta f/\delta y(x_{eq},y_{eq})z$$

$$dz/dt=g(x,y)\approx g(x_{eq},y_{eq})+\delta g/\delta x(x_{eq},y_{eq})u+\delta g/\delta y(x_{eq},y_{eq})z$$

Jacobian Matrix

$$J = \begin{array}{|c|c|} \hline \frac{\delta f}{\delta x}(x_{eq}, y_{eq}) & \frac{\delta f}{\delta y}(x_{eq}, y_{eq}) \\ \hline \frac{\delta g}{\delta x}(x_{eq}, y_{eq}) & \frac{\delta g}{\delta y}(x_{eq}, y_{eq}) \\ \hline \end{array}$$

If the dominant eigenvalue is larger than zero, it's unstable
If the dominant eigenvalue is smaller than zero, it's stable

$$\text{Endemic Jacobian} = \begin{array}{|c|c|} \hline -\beta_{ieq} - \mu & -\beta_{Seq} \\ \hline \beta_{ieq} & -(\gamma + \mu) + \beta_{Seq} \\ \hline \end{array}$$

Endemic Example

- For $\sigma > 1$
- We plug in the endemic equilibrium solutions and find the eigenvalues
- Note that they need to be negative since the last term is negative for $\sigma > 1$

$$-\frac{\mu\beta}{2(\gamma + \mu)} \pm \sqrt{\left(\frac{\mu\beta}{2(\gamma + \mu)}\right)^2 - 4\mu(\beta - \gamma - \mu)}$$



Changing Population Sizes

1. $dS/dt = bN - \beta IS/N - dS$
2. $dI/dt = \beta IS/N + (\gamma + d)I$
3. $dR/dt = \gamma I - dR$
4. $d(S+I+R)/dt = q$

Dividing them by N

1. $ds/dt = b - \beta is - ds - qs$
2. $di/dt = \beta is - (\gamma + d + q)i$
3. $dr/dt = \gamma i - dr - qr$
4. $d(s+i+r) = 0$

Birth rate = b

Death rate = d

Size change = $q = b - d$

$dN/dt = (b - d)N$

$$\sigma = \beta / (\gamma + d + q) = \beta / (\gamma + b)$$

- As long as average life duration is much longer than the disease duration... with increasing birth rate, i goes up too

1. $ds/dt = b - (d+q)s - \beta i s = 0$

2. $di/dt = \beta i s - (\gamma + d + q)i = 0$

→ $s_{eq} = 1/\sigma = (\gamma + d + q)/\beta$

→ $i_{eq} = b(\sigma - 1)/\beta$

Latent Period

1. $dS/dt = bN - \beta IS/N - dS$

2. $dE/dt = \beta IS/N - (\varepsilon + d)E$

3. $dI/dt = \varepsilon E - (\gamma + d)I$

4. $dR/dt = \gamma I - dR$

Dividing them by N

1. $ds/dt = b - \beta is - (d + q)s$

2. $de/dt = \beta is - (\varepsilon + d + q)e$

3. $di/dt = \varepsilon e - (\gamma + d + q)i$

4. $dr/dt = \gamma i - (d + q)r$

Birth rate = b

Death rate = d

$$dN/dt = (b - d)N$$

$$\sigma = \beta \varepsilon / (\varepsilon + d + q)(\gamma + d + q)$$

Treatment Group

1. $dS/dt = bN - \beta IS/N - dS$

2. $dE/dt = \beta IS/N - (\varepsilon + d)E$

3. $dI/dt = \varepsilon E - (\gamma + d + f)I$

4. $dT/dt = fI - (\gamma' + d)T$

5. $dR/dt = (\gamma I + \gamma' T) - dR$

Dividing them by N

1. $ds/dt = b - \beta is - (d + q)s$

2. $de/dt = \beta is - (\varepsilon + d + q)e$

3. $di/dt = \varepsilon e - (\gamma + d + q - f)i$

4. $dt/dt = fi - (\gamma' + d + q)t$

5. $dr/dt = (\gamma i + \gamma' t) - (d + q)r$

Birth rate = b

Death rate = d

$$dN/dt = (b - d)N$$

Scenario with a Treatment Program

- A new kind of infectious disease emerges in a community with an initial population of 7000 people
- Birth rate = 0.025
- Death rate = 0.015 (life expectancy = 67 years)
- On average, latency is about 1 month long
- The infected people suffer from it for 2 years
- The adequate contact rate is 2 per year
- The disease spreads for 5 years
- After 50 years, a drug is developed, which can cure the disease in 3 months
- On average, infected people start taking drugs 2 months after the infection



Without treatment:

200 years after the
disease intro:

S:0.2635

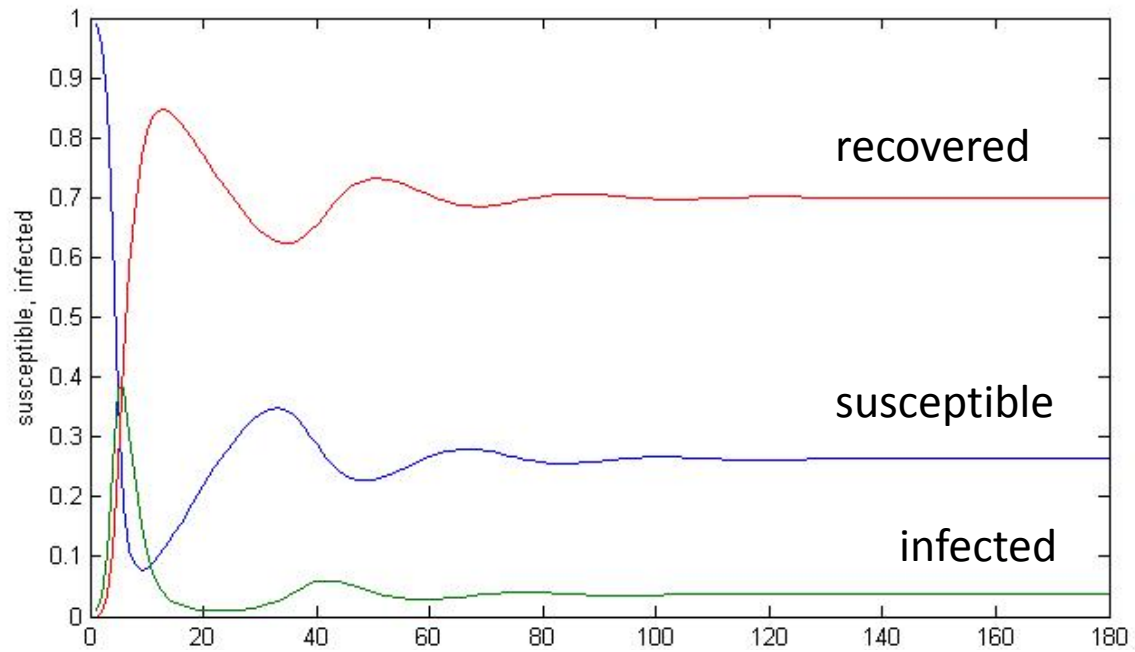
E:0.0018

I:0.0347

T:0

R:0.6999

N:21000



With treatment:

200 years after the
disease intro:

S:0.3625

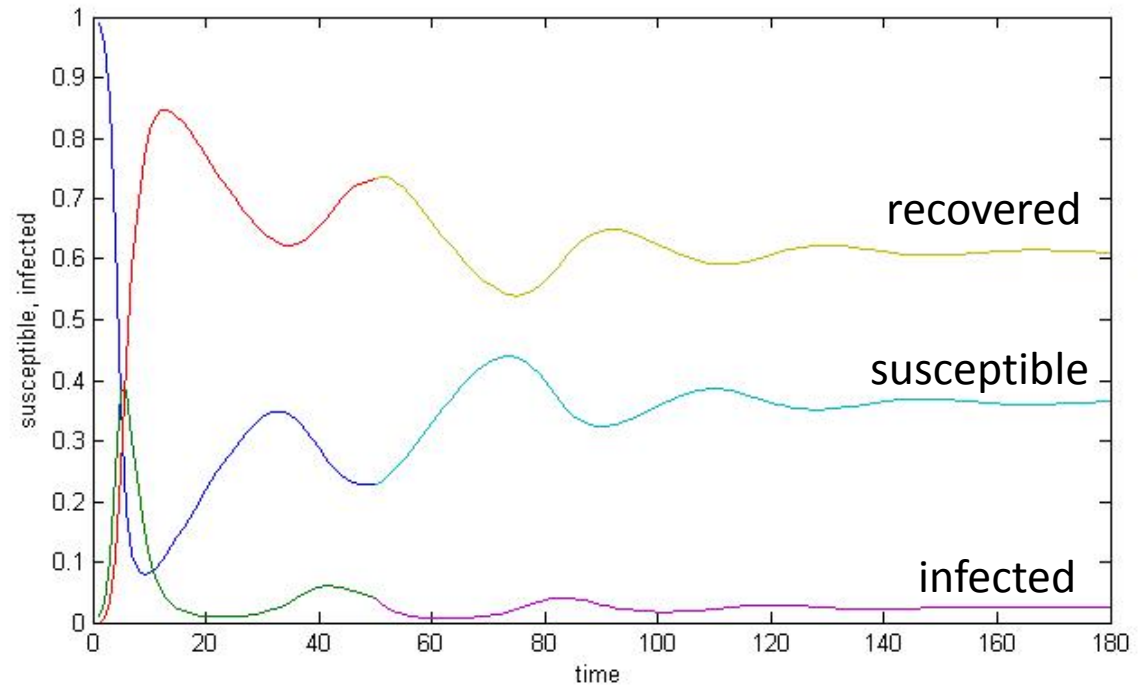
E:0.0016

I:0.0221

T:0.0011

R:0.6127

N:21000



DRUG QUANTIFICATION

$$B = \sum_{i=\text{current year}}^{i=\text{current year}+5} N(i)t(i)q(i)d,$$

where B is the total budget needed,

N(i) is the population

t is the treated fraction

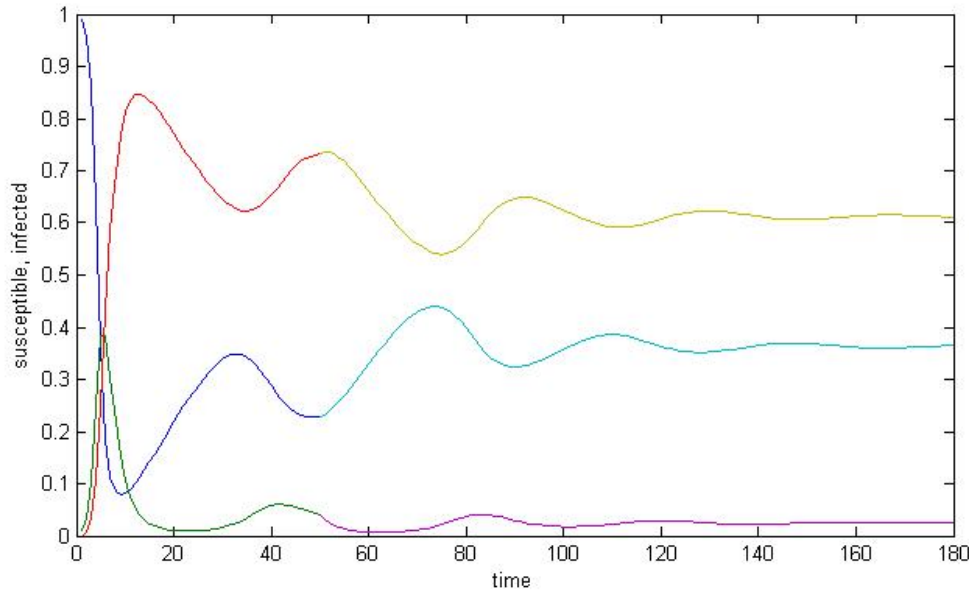
p is the drug price per unit

q is the quantity of drugs needed per person per year

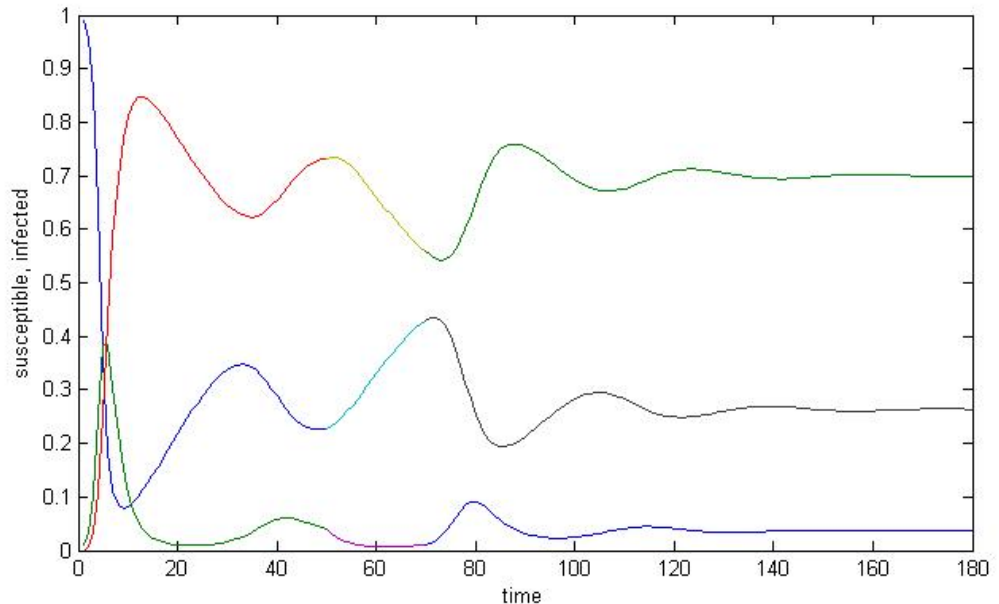
A Scenario with A Treatment Program

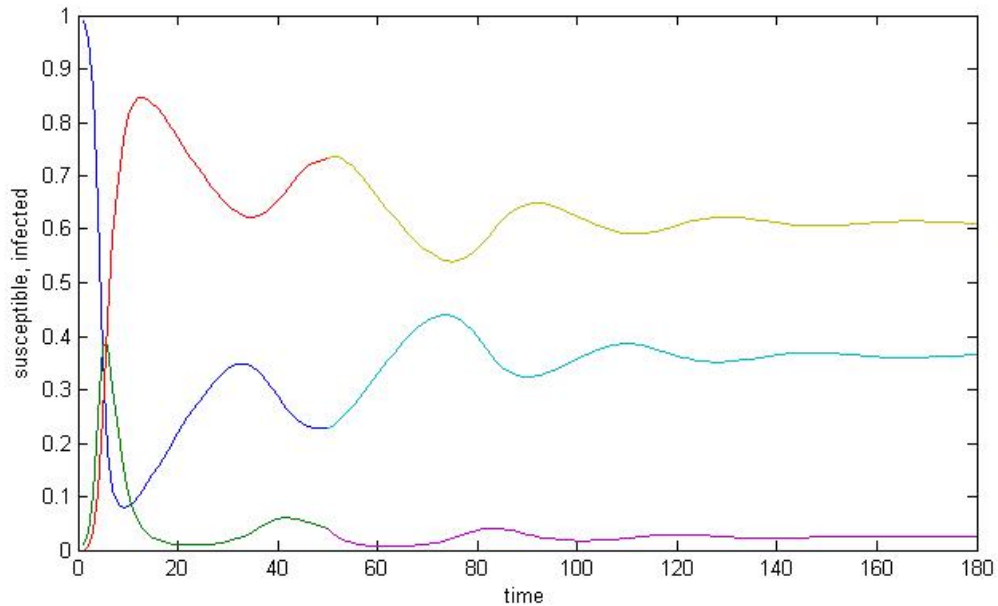
- After yet another 20 years (during the 3rd peak of the infectious fraction- which is the 1st after the drug introduction), the policy makers realize that the budget needed for the drug is increasing.
- Assuming the price for the drug remains constant, what's the predicted budget for the first 5, 10, 15 years after this realization?
- 5 years: 19439
- 10 years: 57513 (additional 38074)

Stopping Drug Use After 20 years



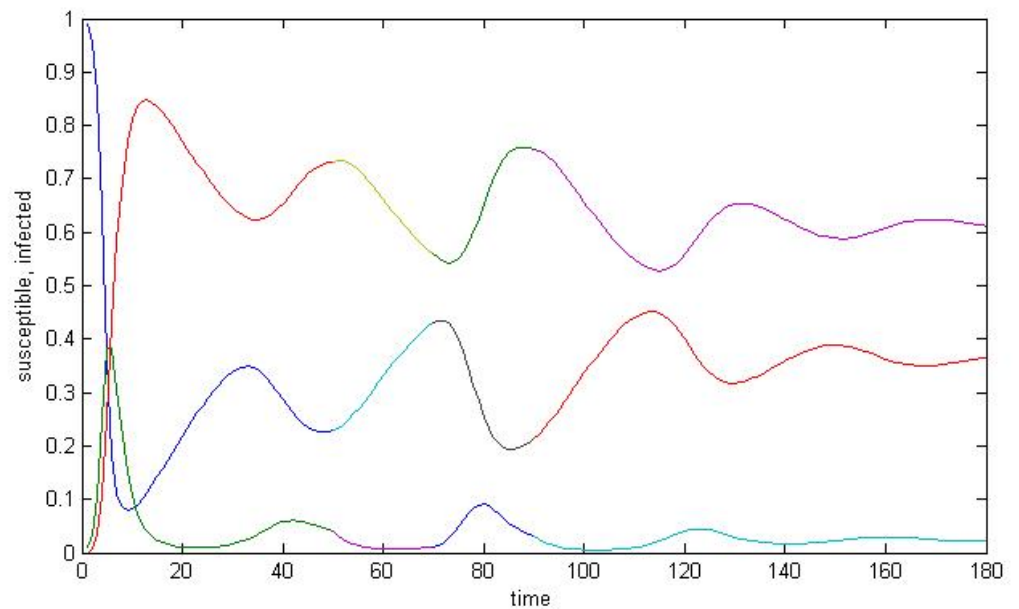
200 years after the disease intro:
S:0.2631
E:0.0018
I:0.0349
T:0
R:0.7002
N:2100





200 years after the disease intro:
S:0.3625
E:0.0016
I:0.0221
T:0.0011
R:0.6127
N:21000

200 years after the disease intro:
S:0.3610
E:0.0017
I:0.0223
T:0.0011
R:0.6132
N:21000



CASE1: CONTINUOUS DRUG USE

CASE2: Intersession for 20 years

- 50 years: Natural Spread
 - 150 years: Drug Use
 - TOTAL BUDGET
 - 246790
- 50 years: Natural Spread
 - 20 years: Drug Use
 - 20 years: Natural Spread
 - 110 years: Drug Use
 - TOTAL BUDGET:
 - 204610

Conclusion..

- Assumptions:

Birth rate, death rate, recovery rate, contact rate are all constant throughout one's life time

- Modifications

Different disease characteristics might require modifications (for example, what if the disease kills you? What if contact rate depends on whether you are a male or female?)

- Other Factors

Can be even more realistic by adding age/demographic/economic structures into the model.