

## Epidemiological Models

We can also explain the spread of disease through a population

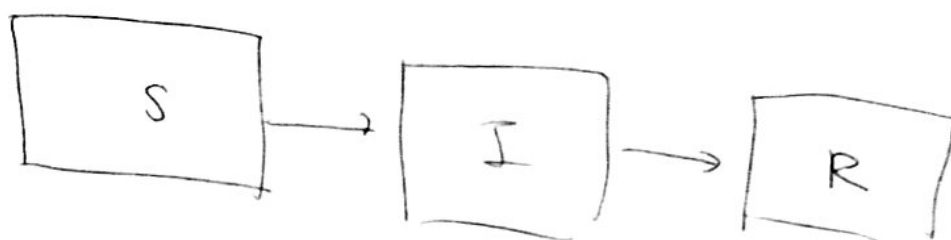
ex. Influenza

~~Cholera~~ spread through a <sup>campus</sup> dorm

Let  $S(t)$  denote # of susceptible people at time  $t$  (thousands)

$I(t)$  denote # of infectious people at time  $t$  (thousands)

$R(t)$  denote # of recovered individuals at time  $t$ . (Immune for a short amt of time). (thousands)



### Assumptions

- No students drop out or enroll over the time period
- disease is transmitted at a rate proportional to the rate of encounter of susceptible ~~and infected~~ infected individuals ( $\beta SI$ )
- The average duration of infection is  ~~$\frac{1}{m}$~~   $\frac{1}{m}$  days.
- Average duration of immunity is  ~~$\frac{1}{n}$~~   $\frac{1}{n}$  days.

$$\frac{dS}{dt} = -\beta SI + \frac{1}{n} R$$

$$\frac{dI}{dt} = \beta SI - \frac{1}{m} I$$

$$\frac{dR}{dt} = \frac{1}{m} I - \frac{1}{n} R$$

call  $\gamma = \frac{1}{n}$ ,  $\nu = \frac{1}{m}$

$$\frac{dS}{dt} = -\beta SI + \gamma R$$

$$\frac{dI}{dt} = \beta SI - \nu I$$

$$\frac{dR}{dt} = \nu I - \gamma R$$

NOTE  $S+I+R=N$   
a constant population

$$R = N - S - I$$

$$\frac{dS}{dt} = -\beta SI + \gamma(N - S - I)$$

$$\frac{dI}{dt} = \beta SI - \nu I$$

What are the possible steady states & stability?

$$\textcircled{1} \text{ Eq } \quad 0 = -\beta SI + \gamma N - \gamma S - \gamma I$$

$$0 = \beta SI - \nu I$$

$$\hookrightarrow 0 = I(\beta S - \nu) \Rightarrow I^* = 0 \text{ or } S^* = \nu/\beta$$

if  $I^* = 0$

$$0 = \gamma N - \gamma S \Rightarrow S^* = N$$

if  $S^* = \nu/\beta$

$$0 = -\beta(\nu/\beta)I^* + \gamma N - \gamma\nu/\beta - \gamma I^*$$

$$\cancel{\nu I^*} \quad \nu I^* + \gamma I^* = \gamma N - \gamma\nu/\beta$$

$$I^*[\beta(\gamma + \nu)] = \gamma(N - \nu)$$

$$I^* = \frac{\gamma(N - \nu)}{\beta(\gamma + \nu)}$$

Equilibrium points

$(N, 0)$   $\leftarrow$  corresponds to disease free steady state  
(no epidemic)

$(\nu/\beta, \frac{N - (\nu/\beta)}{\nu + \gamma})$   $\leftarrow$  exists only if  $N > \nu/\beta$   
(since negative population doesn't  
make sense)

and Jacobian

(2)

$$J = \begin{pmatrix} -\beta I^* - \gamma & -\beta S^* - \gamma \\ \beta I^* & \beta S^* - \nu \end{pmatrix}$$

(3) Evaluate Jacobian at steady states to determine stability

$(N, 0)$

$$J_{(N,0)} = \begin{pmatrix} -\gamma & -\beta N - \gamma \\ 0 & \beta N - \nu \end{pmatrix}$$

eigenvalues are on the diagonal

$$-\gamma < 0$$

$\beta N - \nu$  depends on parameters

if  $\beta N - \nu < 0$   $(N, 0)$  is stable.

$$\text{if } N < \frac{\nu}{\beta}$$

i.e., there is no epidemic if  $\beta$  is small (transmission rate is low) or  $\nu$  is large (i.e. avg duration of infection is short).

$(\frac{\nu}{\beta}, \frac{N - (\nu/\beta)}{\nu + \gamma})$  exists only if  $N > \frac{\nu}{\beta}$  opposite  $\frac{NB}{\nu} > R$

$$J_{(\frac{\nu}{\beta}, \frac{N - (\nu/\beta)}{\nu + \gamma})} = \begin{pmatrix} -\beta \left( \frac{N - \nu/\beta}{\nu + \gamma} \right) - \gamma & -\nu - \gamma \\ \beta \left( \frac{N - \nu/\beta}{\nu + \gamma} \right) & \nu - \nu \end{pmatrix}$$

$$= \begin{pmatrix} -\left( \frac{\beta N - \nu}{\nu + \gamma} \right) - \gamma & -\nu - \gamma \\ \frac{\beta N - \nu}{\nu + \gamma} & 0 \end{pmatrix}$$

$$\tau = -\left( \frac{\beta N - \nu}{\nu + \gamma} \right) - \gamma < 0$$

$$\Delta = (\nu + \gamma) \left( \frac{\beta N - \nu}{\nu + \gamma} \right) > 0$$

$\Rightarrow$  stable when it exists

So, in conclusion, we have 2 major cases:

(1) if  $N < v/\beta$

we only have 1 biologically relevant equilibrium  $(N, 0)$ , which is stable.

(2) if  $N > v/\beta$

we have 2 biologically relevant equilibria,  $(N, 0)$  which is a saddle

$(v/\beta, \frac{N - (v/\beta)}{v + \delta})$  which is stable.

further, depending on parameter values, it can be a node or oscillatory.

pplae.

ex w oscillations

$\beta = 3, \delta = 0.1, v = 4$

w/out oscillations

$\beta = 3, \delta = 1, v = 4$

Note  $\frac{vN}{v} = R_0$   
 represents the number of secondary infections generated from 1 infectious individual  
 $R_0 = (\text{transmission rate}) \cdot (\text{duration of infection}) \cdot (\text{\# of contacts})$   
 $= \beta \cdot \frac{1}{v} \cdot N$

How would you change eqns for chicken pox? spread through a school?

- Permanent immunity

$$\frac{dS}{dt} = -\beta SI$$

$$\frac{dI}{dt} = \beta SI - vI$$

$$\frac{dR}{dt} = vI$$

How would you change eqns for plague spread through an isolated city over the course of a few weeks?

- Assume no births/deaths
- death due to plague.

$$\frac{dS}{dt} = -\beta SI + \gamma R$$

$$\frac{dI}{dt} = \beta SI - \nu I - \mu I$$

note  $\mu$  represents death due to plague.

$$\frac{dR}{dt} = \nu I - \gamma R$$

How to model spread of black death through Europe in Medieval times  
- population changes (grows) Assume only Susceptibles can reproduce  
- death due to other causes

$$\frac{dS}{dt} = bS - \beta SI + \gamma R - dS$$

$d$  is death rate due to other causes.

$$\frac{dI}{dt} = \beta SI - \nu I - \mu I - dI$$

$$\frac{dR}{dt} = \nu I - \gamma R - dR$$

How to model an infection with a long latent period, such as measles

idea: incorporate an exposed, but not yet infectious, class

Assume a school with no population change

### ~~AS~~ Facts about measles

- latency period of approx 10-12 days
- death due to disease
- lifetime immunity.

$$\frac{dS}{dt} = -\beta SI$$

$$\frac{dE}{dt} = \beta SI - cE$$

note  $c$  = rate at which exposed become infectious =  $\frac{1}{11}$  days.

$$\frac{dI}{dt} = cE - \nu I - \mu I$$

$$\frac{dR}{dt} = \nu I$$

What about vaccinations?

Model ~~measles~~ <sup>measles</sup> spread across the USA, but with vaccinations. Assume no latency period/exposure class.

$$\frac{dS}{dt} = \mu N(1-p) - dS - \beta SI$$

$$\frac{dR}{dt} = \nu I$$

$p$  = rate at which newborns are vaccinated  $\in (0,1)$

$$\frac{dI}{dt} = \beta SI - \nu I - dI - \mu I$$

$$\frac{dV}{dt} = \mu Np - dI$$

We can use this model to determine necessary value of  $p$  in order to prevent epidemics. Hint: it's not 100% herd immunity.

What about diseases for which a recovered individual remains a carrier?

Consider tuberculosis, for which some portion of individuals remain a carrier of the disease for an extended period of time.

Assumptions

- Both infectious & carriers can transmit the disease, possibly at different rates
- Carriers remain in the carrier state for  $\frac{1}{\epsilon}$  days
- No population change
- Life long immunity

$$\frac{dS}{dt} = -\beta SI - \epsilon \beta SC$$

$$\frac{dI}{dt} = \beta SI + \epsilon \beta SC - \delta I$$

$$\frac{dR}{dt} = (1-p)\delta I + \tau C$$

$$\frac{dC}{dt} = p\delta I - \tau C$$

where  $\epsilon$  is a scaling factor  
 $p$  is proportion of infectious that eventually become carriers

We can also model quarantines, treatments, maternally-derived immunity, and so forth.