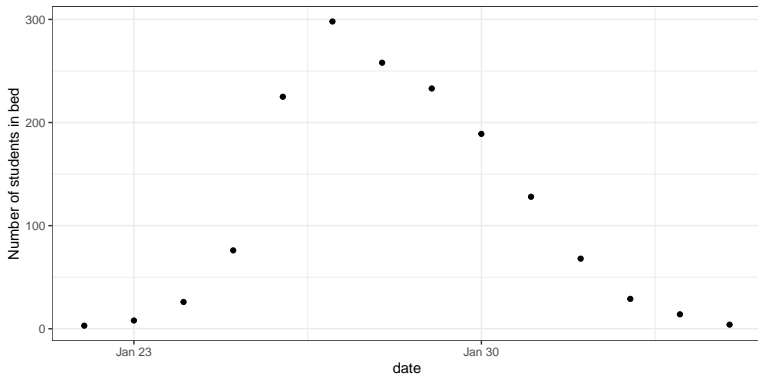


## IV

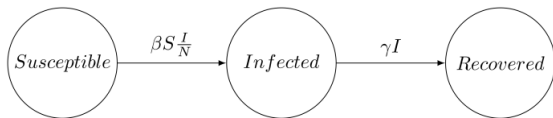
### Epidemiology model

1978 influenza outbreak in a British boarding school.

Data: daily number of students in bed.



## Susceptible-Infected-Recovered (SIR) model

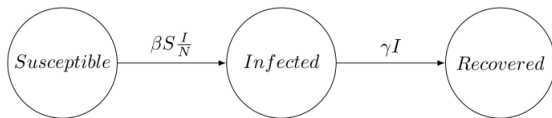


$$\dot{S} = -\beta SI/N$$

$$\dot{I} = \beta SI/N - \gamma I$$

$$\dot{R} = \gamma I$$

## Susceptible-Infected-Recovered (SIR) model



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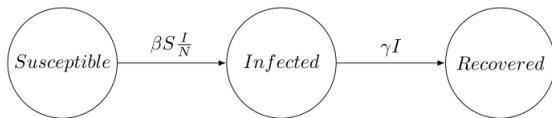
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$\beta$ : average of number of contacts per person.

$\gamma$ : rate of recovery of infected individuals.

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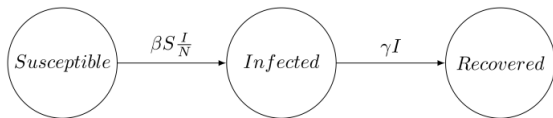
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Measurement model:

$$p(y(t) \mid \beta, \gamma, \phi) = \text{negative-Binomial}(I(t), \phi)$$

$$\phi^{-1} \sim \text{exponential}(5).$$

Need additional blocks to fit this model:

**functions:** Here we'll construct a function that returns  $\{\dot{S}, \dot{I}, \dot{R}\}$ , which we can then pass to an ODE solver.

- `vector sir (real t, vector y, real beta, real gamma, int N) { ... return dy_dt };`
- `t`: time
- `y`: the solution to the ODE,  $y(t) = [S(t), I(t), R(t)]$

**transformed parameters:** Allows us to do manipulations on the parameters

- compute the inverted  $\phi$
- compute  $I(t)$  by solving the ODE:  
`array[n_days] vector[3] y`  
`= ode_rk45(sir, y0, t0, ts, beta, gamma, N);`
- `y0`: initial condition for  $t = t_0$ .
- `ts`: times at which we require a solution.

*Exercise: Write and fit the SIR model for the 1978 influenza outbreak.*

- *Check the standard diagnostics ( $\hat{R}$  and ESS) and examine the density and trace plots. Is the inference reliable?*
- *Do the posterior predictive checks: is the model accurately describing the data?*
- *How does the model change when using a Poisson likelihood rather than a negative binomial?*

For more discussion about this model (e.g. choice of priors, sensitivity tests), see [[Grinsztajn et al., 2021](#)].



# References I

- [Grinsztajn et al., 2021] Grinsztajn, L., Semanova, E., Margossian, C. C., and Riou, J. (2021).  
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