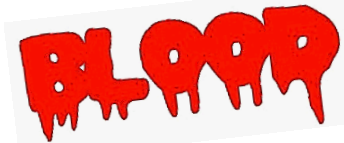


# When zombies attack!

## *Mathematical modelling of an outbreak of zombie infection*

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# Outline... of DOOM!

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- A short history of zombie outbreaks
- The basic SZR model
- Including a latent class
- Intervention 1: Quarantine
- Intervention 2: Treatment
- Intervention 3: Impulsive attacks
- Implications.



# Definition

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- Zombie: a reanimated corpse that feeds on living flesh
- Origin: African–Carribean belief systems of voodoo
- Main organs and all bodily functions operate at minimal levels.



# How to identify a zombie from far, far away

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- Mindless monsters who do not feel pain
- They have an immense appetite for human flesh
- Their aim is to kill, eat or infect people
- The 'undead' move in small, irregular steps, and show signs of physical decomposition, eg
  - rotting flesh
  - discoloured eyes
  - open wounds.





# Historical outbreaks

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- Major outbreaks of zombies have been recorded since 1968
- Primarily in the US and the UK
- These largely involve zombies overwhelming
  - isolated farmhouses
  - shopping malls
  - British pubs.



# Dawn of the Night of the Living Dead

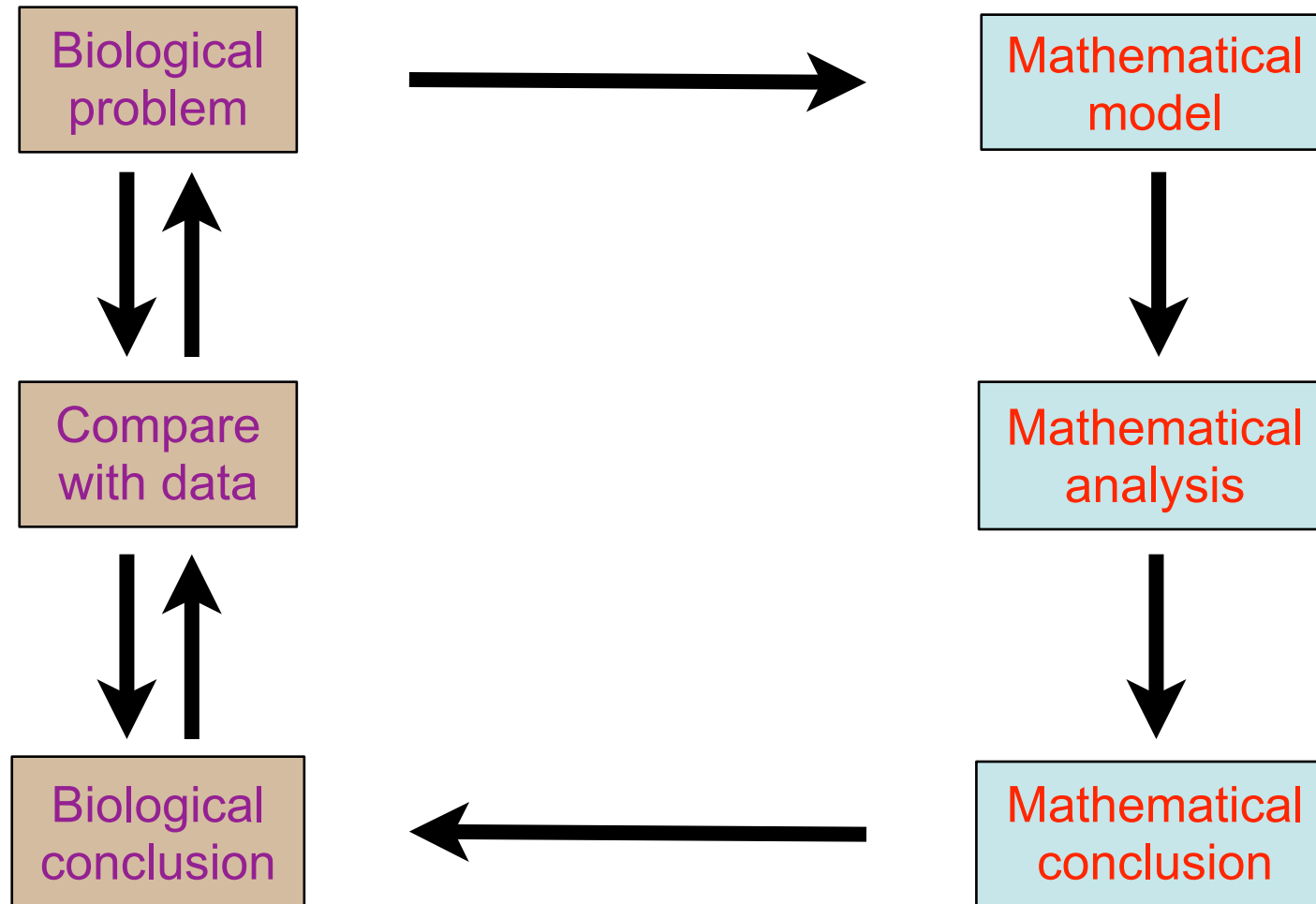
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- Possible causes include:
  - radiation emanating from a Venus space probe
  - a virus in chimpanzees
- Zombies defeated by:
  - guns
  - the army
  - eventual starvation
  - Dire Straits records.



# Using math to solve real problems

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# Modelling a zombie outbreak

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- Humans are infected by contact with a zombie
- Zombies are created either through converting a human or by reanimating the dead
- Susceptibles can die of natural causes
- Zombies can be killed in an encounter with humans
  - either temporarily or permanently.





Zombification



Natural death

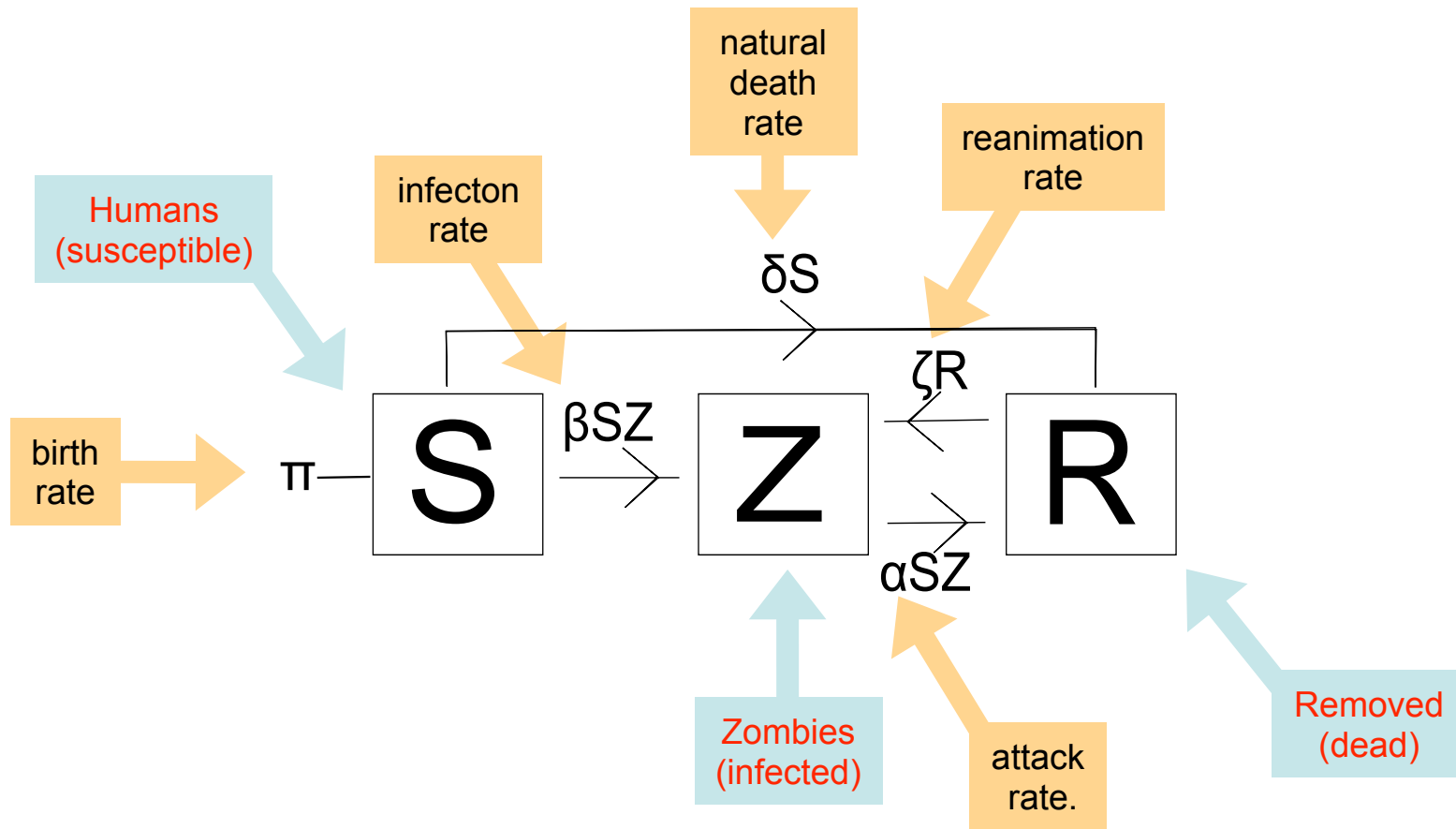
Reanimation



Zombie  
death



# The SZR model



# The SZR model

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- The basic model is thus

$$S' = \Pi - \beta SZ - \delta S$$

$$Z' = \beta SZ + \zeta R - \alpha SZ$$

$$R' = \delta S + \alpha(1 - p)SZ - \zeta R$$

- Key factor: two mass-action terms
  - one for infection
  - one for attack
- We also keep track of the Removed (dead) class
  - $p$  represents permanent death.



# Demographics... of DESTINY!

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- We included birth and natural death, but most zombie outbreaks occur over a much shorter timescale
- These contributions will be negligible, so we set  $\Pi = \delta = 0$
- We assume
  - 90% of zombie deaths are permanent
  - zombies bite us ten times faster than we kill them.

$\Pi$ =birth rate  
 $\delta$ =natural death rate



# Analysis of the SZR model

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- Two equilibria: the disease-free equilibrium

$$(\bar{S}, \bar{Z}, \bar{R}) = (N, 0, 0)$$

(no zombies)

and the doomsday equilibrium

$$(\bar{S}, \bar{Z}, \bar{R}) = (0, \bar{Z}, 0)$$

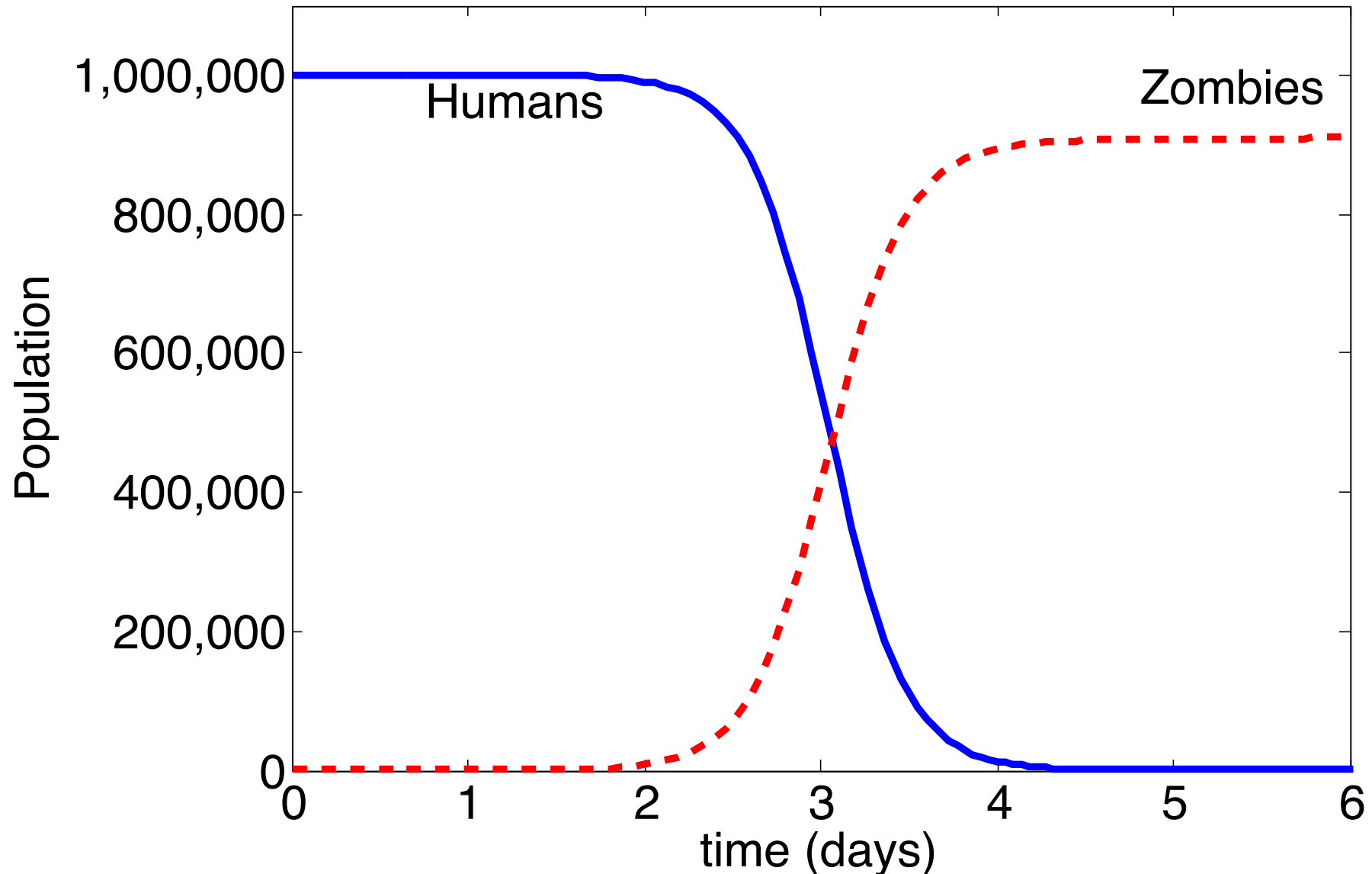
(everyone is a zombie)

- We can prove: the disease-free equilibrium is unstable and the doomsday equilibrium is stable
- This is not good.

*S=humans Z=zombies  
R=dead N=total population*

# Zombies take over, infecting everyone

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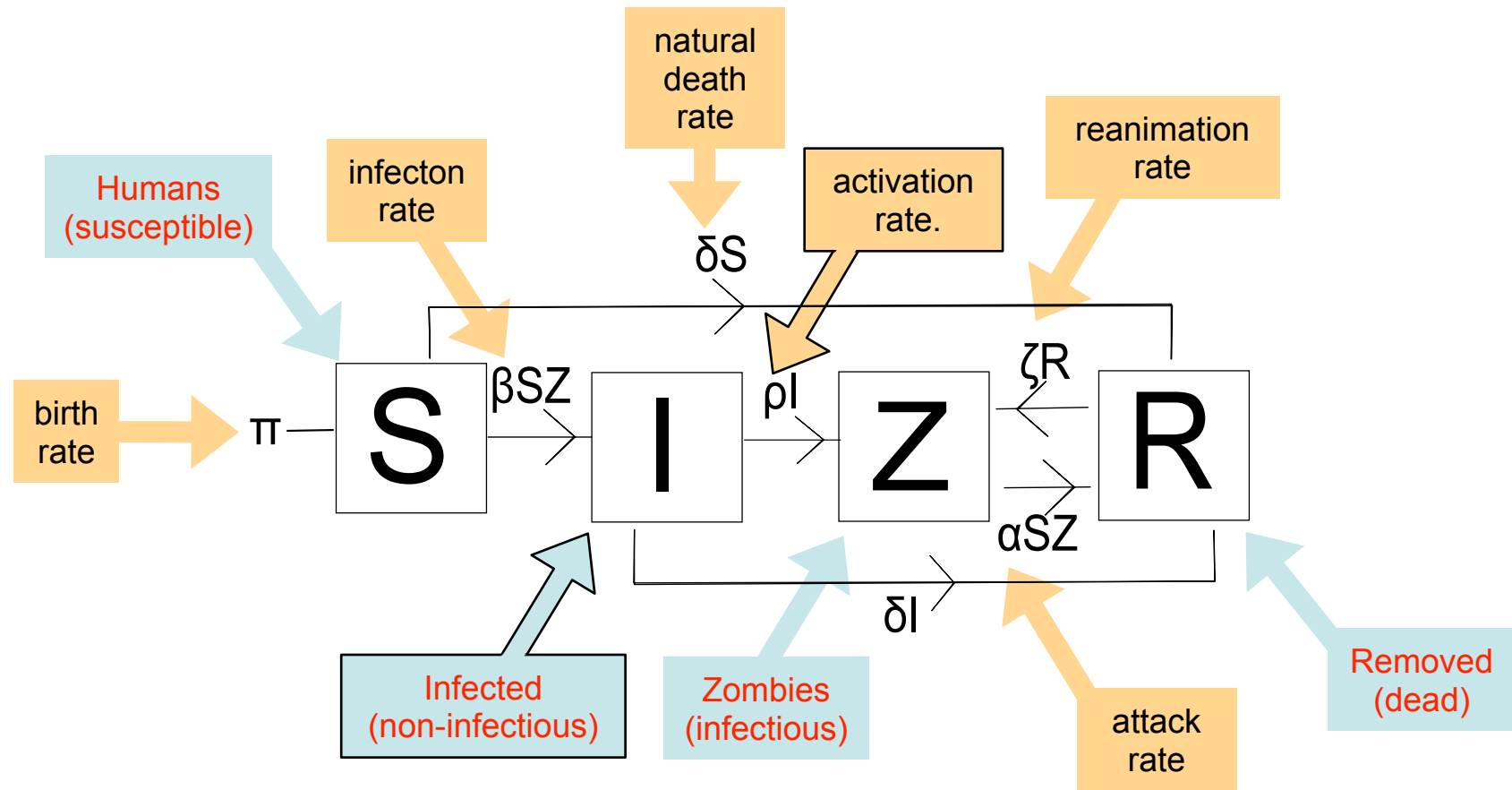
# Model revision: adding a latent class

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- There is a period of time between (approximately 12 hours) after the human susceptible gets bitten before they succumb to their wounds and become a zombie
- During this time, an infected individual will shake, moan and shiver uncontrollably...
- ...yet his friends will have absolutely NO IDEA that anything is wrong.



# The SIZR model



# The SIZR model

---

- The model with latent infection is thus

$$S' = \Pi - \beta SZ - \delta S$$

$$I' = \beta SZ - \rho I - \delta I$$

$$Z' = \rho I + \zeta R - \alpha SZ$$

$$R' = \delta S + \delta I + \alpha(1 - p)SZ - \zeta R$$

- I=infected, not yet infectious
- $\rho$ =activation rate
- As before, we model a short outbreak and set  $\Pi = \delta = 0$ .



# Analysis of the SIZR model

---

- Two equilibria: the disease-free equilibrium

$$(\bar{S}, \bar{I}, \bar{Z}, \bar{R}) = (N, 0, 0, 0)$$

(no zombies)

and the doomsday equilibrium

$$(\bar{S}, \bar{I}, \bar{Z}, \bar{R}) = (0, 0, \bar{Z}, 0)$$

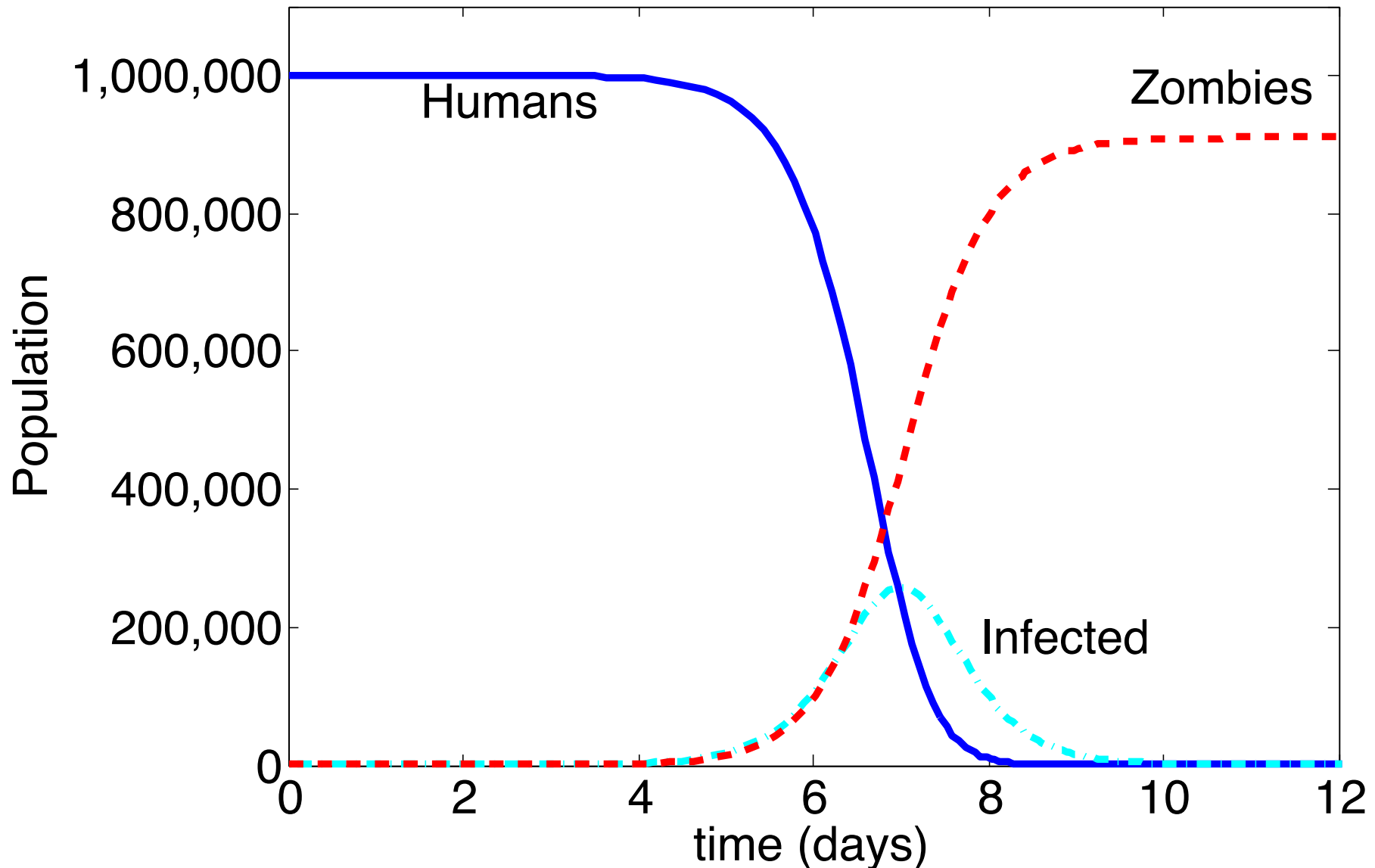
(everyone is a zombie)

- The disease-free equilibrium is always unstable, so the infection persists
- Thus, even with a latent class, zombies will invade.

*S=humans I=infected Z=zombies  
R=dead N=total population*

# Zombies again take over, destroying humanity

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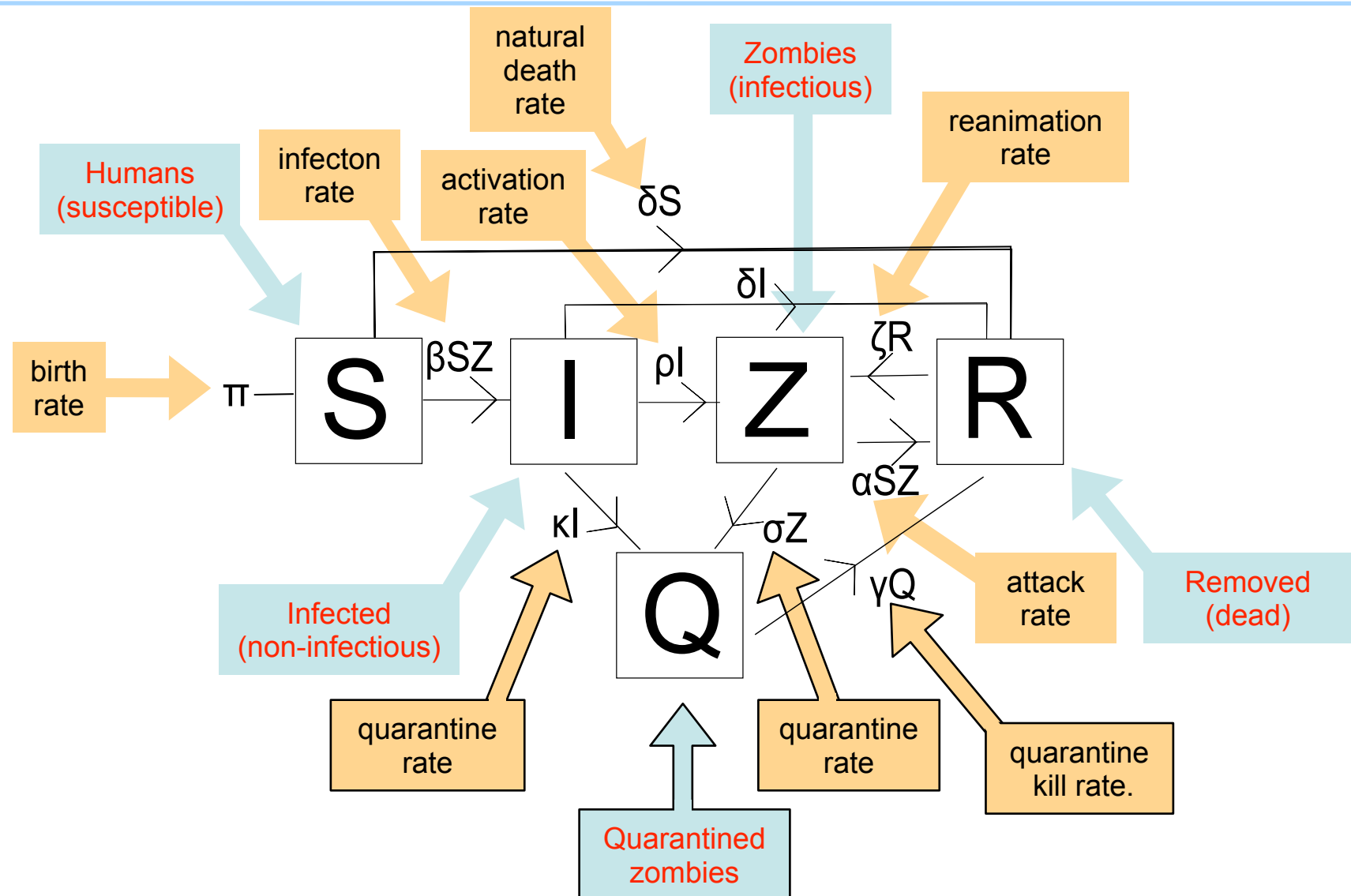
# Intervention 1: Quarantine

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- To contain the outbreak, we modelled the effects of partial quarantine of zombies
- Quarantined individuals are removed from the population and cannot infect new humans while they remain quarantined
- There is a chance some will try to escape, but any that tried to would be killed before finding their “freedom”.



# The SIZRQ model



# The SIZRQ model

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- The model with quarantine is thus

$$S' = \Pi - \beta SZ - \delta S$$

$$I' = \beta SZ - \rho I - \delta I - \kappa I$$

$$Z' = \rho I + \zeta R - \alpha SZ - \sigma Z$$

$$R' = \delta S + \alpha(1 - p)SZ - \zeta R + \gamma(1 - q)Q$$

$$Q' = \kappa I + \sigma Z - \gamma Q$$

- We assume individuals who attempt to escape from quarantine are killed...  
...some permanently, but most temporarily
- So  $q$  may be zero or small.

# Equilibria... of ANNIHILATION!

- For a short outbreak, we have the DFE

$$(\bar{S}, \bar{I}, \bar{Z}, \bar{R}, \bar{Q}) = (N, 0, 0, 0, 0)$$

and, if  $q=0$ , coexistence:

$$(\bar{S}, \bar{I}, \bar{Z}, \bar{R}, \bar{Q}) = \left(0, 0, \bar{Z}, \frac{\sigma \bar{Z}}{\zeta}, \frac{\sigma \bar{Z}}{\gamma}\right)$$

(but no humans)

- If  $q \neq 0$ , this equilibrium is  $(0, 0, 0, 0, 0)$ , corresponding to total population collapse.

*S=humans I=infected Z=zombies R=dead  
Q=quarantined  $\Pi$ =birth rate  $\delta$ =natural  
death rate  $\sigma$ =zombie quarantine rate  
 $\zeta$ =reanimation rate  $q$ =permanent death*



# Basic reproductive ratio

- Using the next-generation method, we determined

$$R_0 = \frac{\beta N \rho}{(\rho + \kappa)(\alpha N + \sigma)}$$

- If the population is large, then

$$R_0 \approx \frac{\beta \rho}{(\rho + \kappa)\alpha}$$

- The disease-free equilibrium is stable if  $R_0 < 1$ .

$\beta$ =infection rate  $N$ =total population  
 $\rho$ =activation rate  $\alpha$ =attack rate  
 $\kappa$ =quarantine rate (infected)  
 $\sigma$ =quarantine rate (zombies)





# Invasion of the living dead

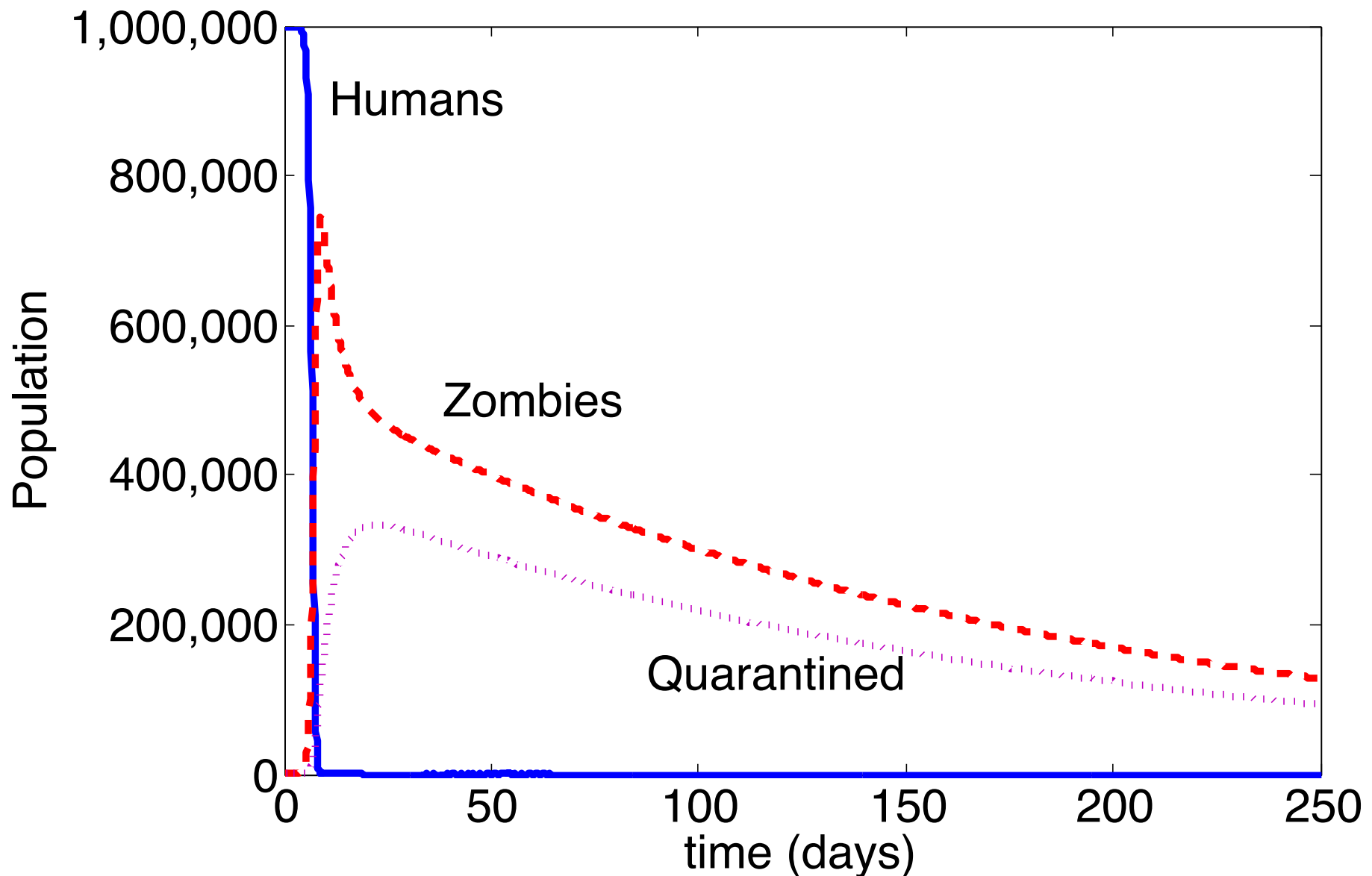
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- We can reduce  $R_0 < 1$  by increasing the quarantine rates  $\kappa$  or  $\sigma$
- However, quarantining a large percentage of infected individuals is unrealistic
  - due to infrastructure limitations
  - identifying infected individuals is challenging
- Thus, we expect  $R_0 > 1$
- Hence, zombies can invade.

$R_0$ =basic reproductive ratio  
 $\kappa$ =quarantine rate (infected)  
 $\sigma$ =quarantine rate (zombies)



# With quarantine, everybody loses



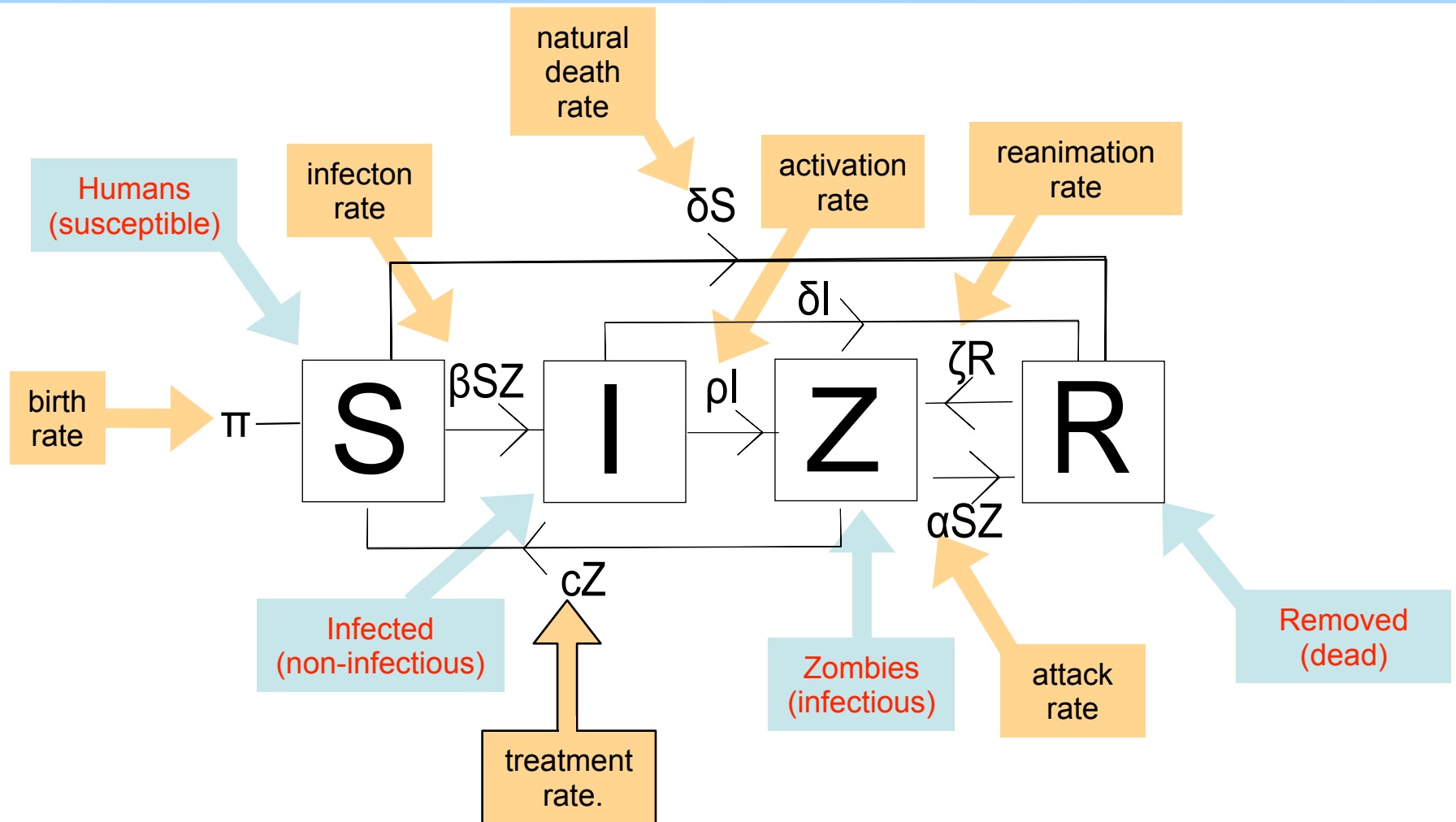
# Intervention 2: Treatment

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- Suppose we are able to quickly produce a cure for zombie-ism
- Our treatment would be able to allow the zombie individual to return to their human form again
- Since we have treatment, we no longer need the quarantine
- Treatment does not provide immunity.



# The model with treatment



# The model with treatment

- The model with treatment is thus

$$S' = \Pi - \beta SZ - \delta S + cZ$$

$$I' = \beta SZ - \rho I - \delta I$$

$$Z' = \rho I + \zeta R - \alpha SZ - cZ$$

$$R' = \delta S + \alpha(1 - p)SZ - \zeta R$$

- As before, we model a short outbreak and set  $\Pi = \delta = 0$
- We have the usual disease-free equilibrium  $(\bar{S}, \bar{I}, \bar{Z}, \bar{R}) = (N, 0, 0, 0)$ .



# Analysis of the treatment model

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- We also have a survivors' equilibrium

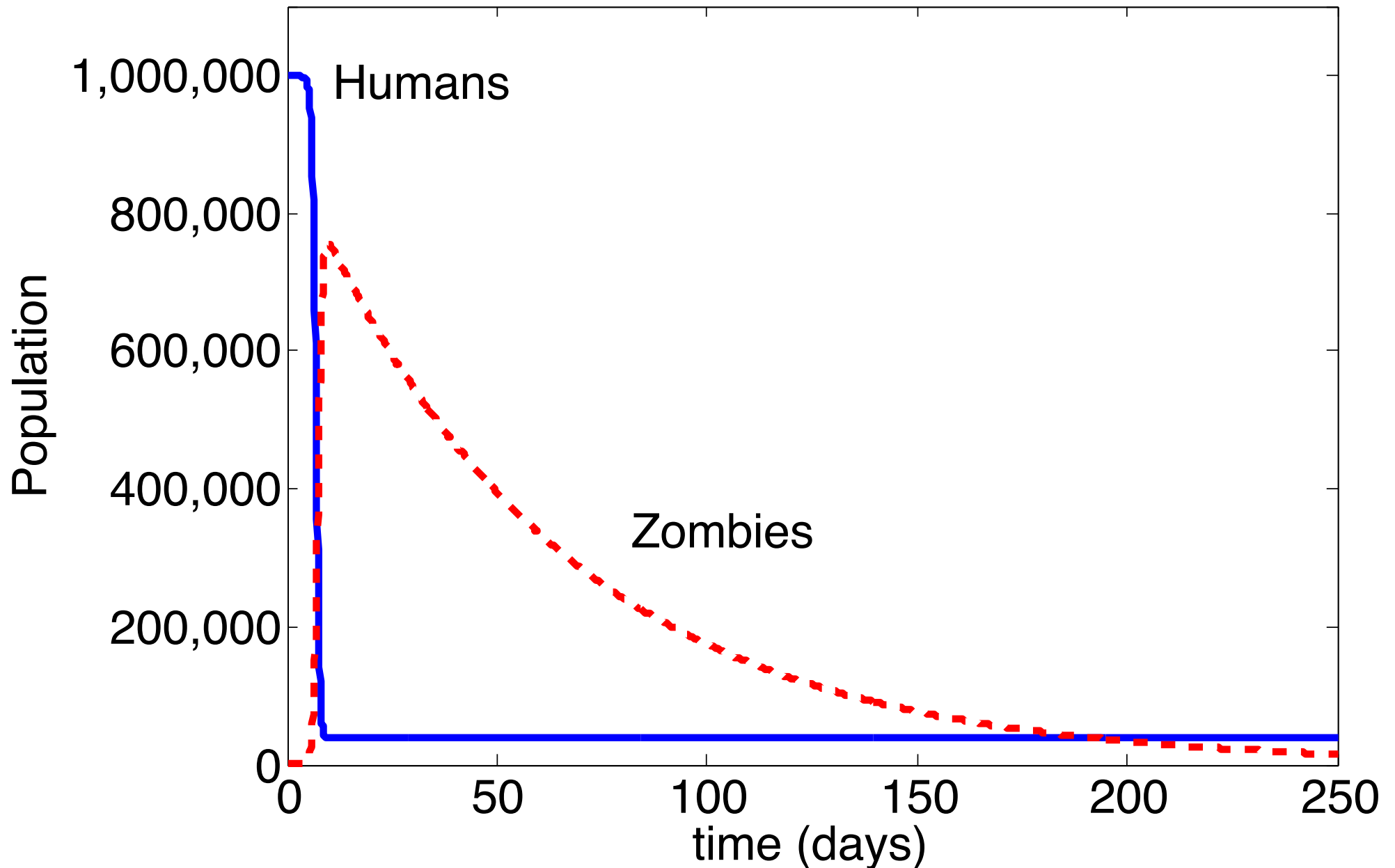
$$(\bar{S}, \bar{I}, \bar{Z}, \bar{R}) = \left( \frac{c}{\beta}, 0, 0, 0 \right)$$

- This equilibrium is always stable
- If zombies can be cured faster than a critical cure rate, the DFE is also stable
  - we thus have bistability
- However, this is unlikely to occur in practice
  - for our parameters, we would need to cure zombies within 5 hours, 20 minutes of activation.

*S=humans I=infected Z=zombies R=dead  
β=infection rate c=treatment rate*



Humans are not eradicated, but exist only in low numbers



# Intervention 3: Impulsive attack

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- Finally, we attempted to control the zombie population by strategically destroying them at such times that our resources permit
- It was assumed that it would be difficult to have the resources and coordination, so we would need to attack more than once, and with each attack try and destroy more zombies
- This results in an impulsive effect.

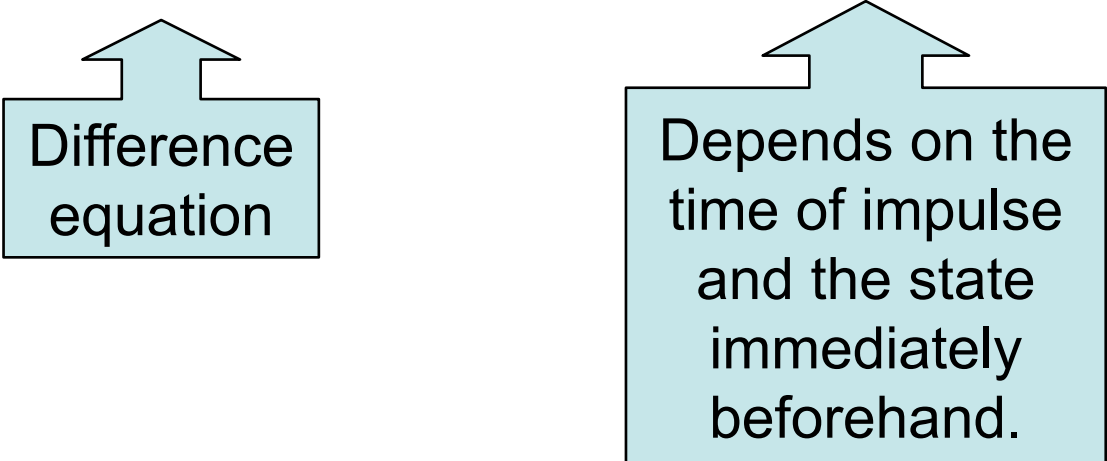


# Impulsive effect... of TERROR!

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- According to impulsive theory, we can describe the nature of the impulse at time  $r_k$  via the difference equation

$$\Delta y \equiv y(r_k^+) - y(r_k^-) = f(r_k, y(r_k^-))$$



Difference  
equation

Depends on the  
time of impulse  
and the state  
immediately  
beforehand.

# Impulsive differential equations

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- Solutions are continuous for  $t \neq r_k$
- Solutions undergo an instantaneous change in state when  $t = r_k$
- Such approximations are reasonable when the cycle time is sufficiently large, compared to the time being approximated
- The model thus consists of a system of ODEs together with a difference equation.



$r_k$ =impulse time

# SZR $\Delta$ Z model

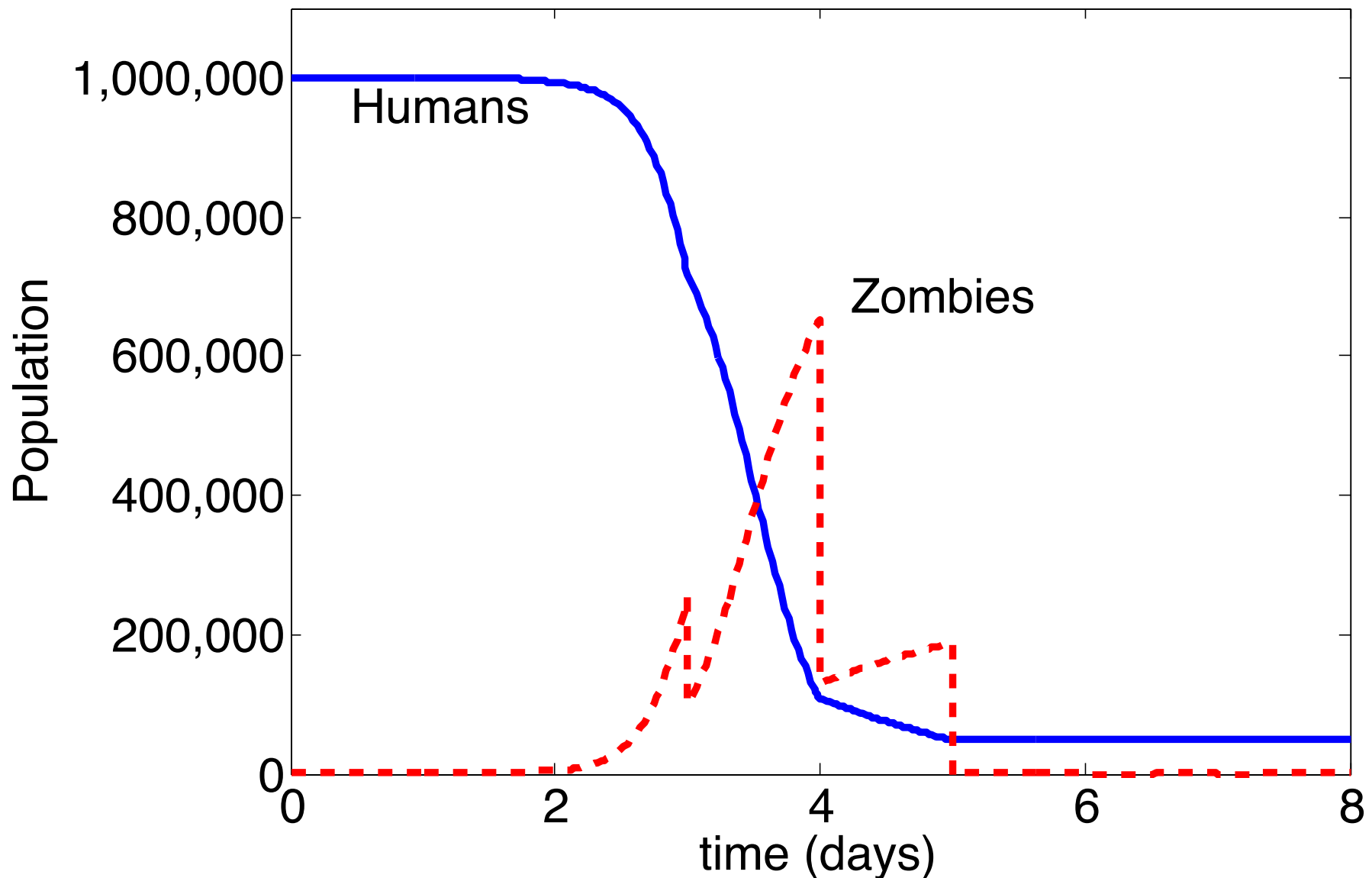
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- We return to the basic model and add in impulsive effect:

$$\begin{aligned}S' &= \Pi - \beta SZ - \delta S & t \neq t_n \\Z' &= \beta SZ + \zeta R - \alpha SZ & t \neq t_n \\R' &= \delta S + \alpha(1 - p)SZ - \zeta R & t \neq t_n \\\Delta Z &= -knZ & t = t_n\end{aligned}$$

- $k \in (0, 1]$  is the kill ratio
- $n$  = number of attacks required until  $kn > 1$
- Thus, we hit zombies with ever-increasing force.

# Only ever-more powerful attacks will stop the zombies







Zombification

Quarantine?

Cure?



Natural death

Reanimation



Zombie death

Impulsive attacks?

# Summary... of DEATH!

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- Extremely aggressive tactics are required
- Quarantine is unable to save us
- Treatment takes most of a year and relies on inventing a cure
- Only frequent attacks, with increasing force, result in eradication...  
...assuming available resources can be mustered in time.



# Limitations

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- We only modelled a short timescale
- Otherwise, the result is the doomsday scenario:
  - an outbreak of zombies results in the collapse of civilisation, with every human infected or dead
- Because human births and deaths will provide the undead with a limitless supply of new bodies to infect, resurrect and convert
- Thus, if zombies arrive, we must act quickly and decisively to eradicate them before they eradicate us.

# Conclusions... of TERROR!

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- A zombie outbreak is likely to lead to the collapse of civilisation, unless it is dealt with quickly
- Quarantine will not contain the epidemic
- A cure may lead to survival in low numbers
- The most effective way to contain the rise of the undead is to hit hard and hit often
- It is imperative that zombies are dealt with quickly...  
...or else we are all in a great deal of trouble.

# Key reference... of FEAR!

P. Munz, I. Hudea, J. Imad and R.J. Smith? When zombies attack!: Mathematical modelling of an outbreak of zombie infection (in: J.M. Tchuenche and C. Chiyaka, eds, Infectious Disease Modelling Research Progress 2009, 133–150).

<http://mysite.science.uottawa.ca/rsmith43>

