

Department of Mathematics and Faculty of Medicine The University of Ottawa



 Biology/epidemiology of Guinea worm disease

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- Mathematical model

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- Implications.

### Background

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- Europeans first saw the disease on the Guinea coast of West Africa in the 17th century.



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The Guinea Worm

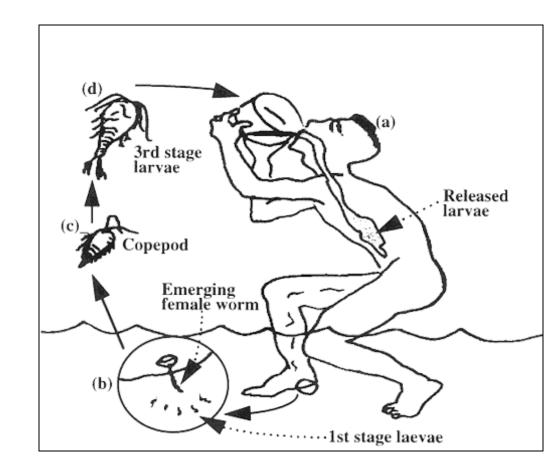
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- It resides here for about a year.



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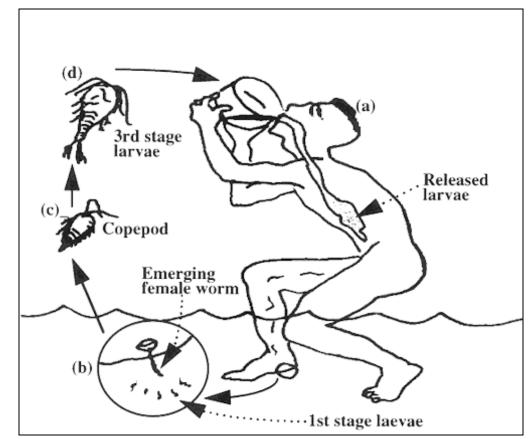
### Transmission

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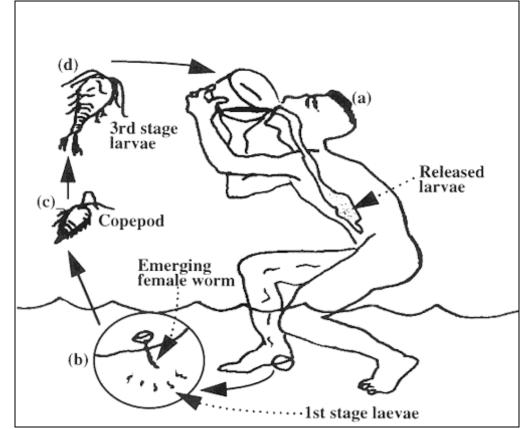
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- At this point, the worm ejects hundreds of thousands of larvae, restarting the cycle.



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- This takes up to two months.



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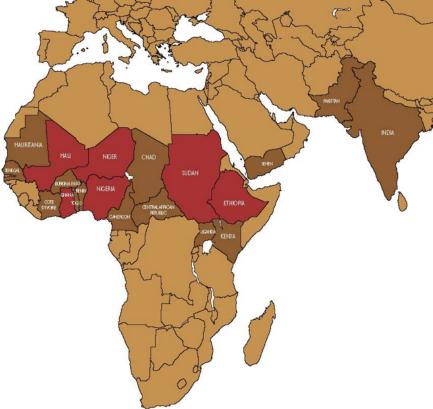
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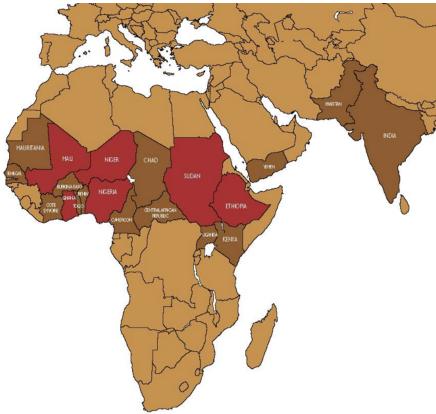
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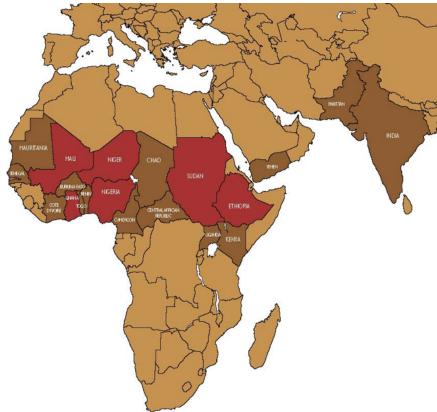
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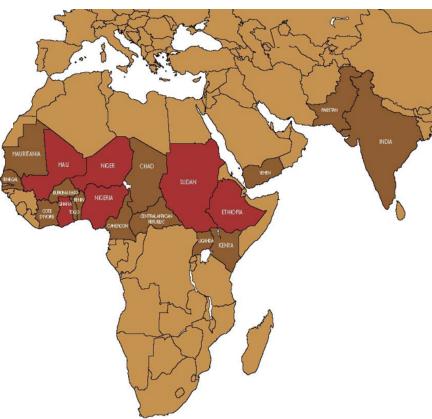
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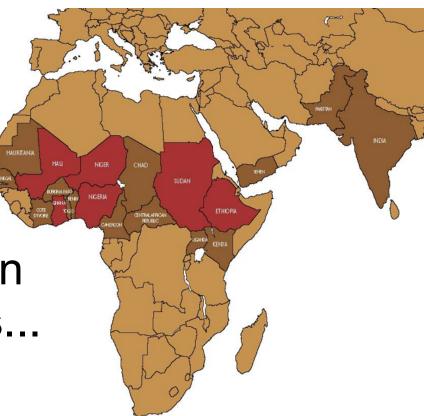
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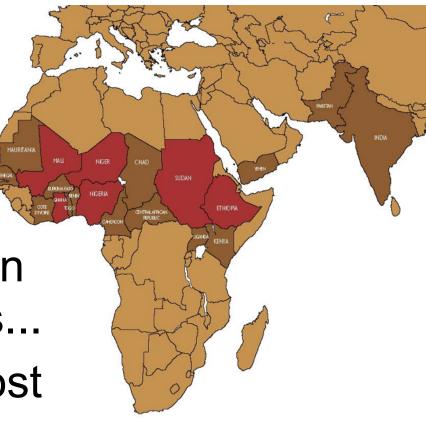
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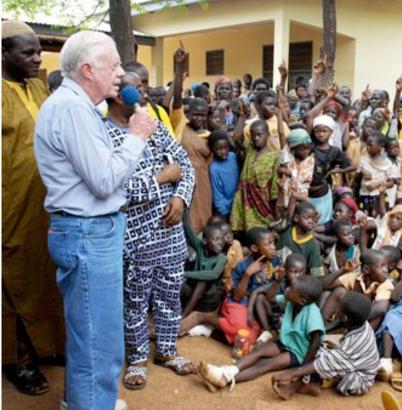


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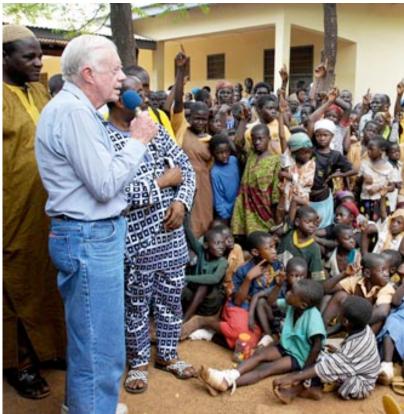
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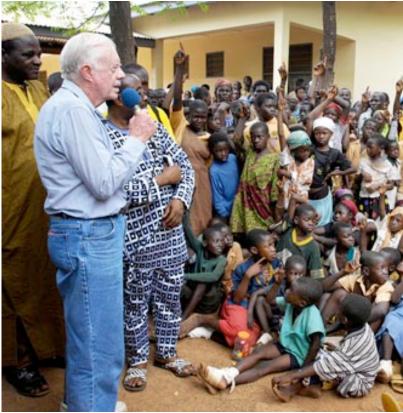
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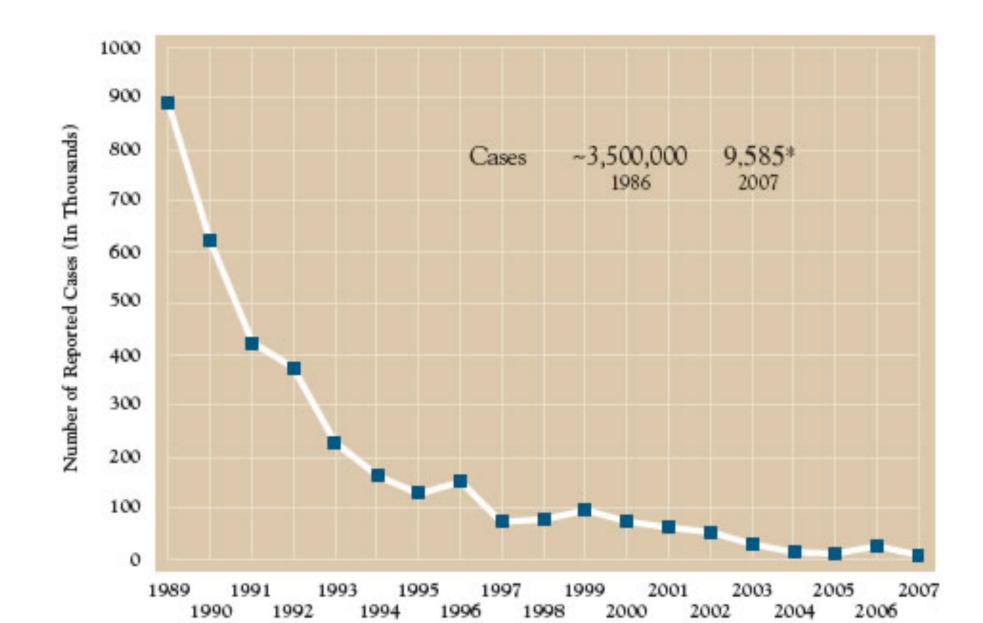


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 If eradicated, it will be the first parasitic disease and also the first to be eradicated using behaviour changes alone.

#### Significant decline



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- Infected individuals can be educated about not submerging wounds in drinking water
- Cloth filters that fit over pots and pans can be distributed to villages
- Nomadic people have received personal-use cloths fitted over pipes, worn around the neck
- Chemical larvacides can be added to stagnant water supplies.

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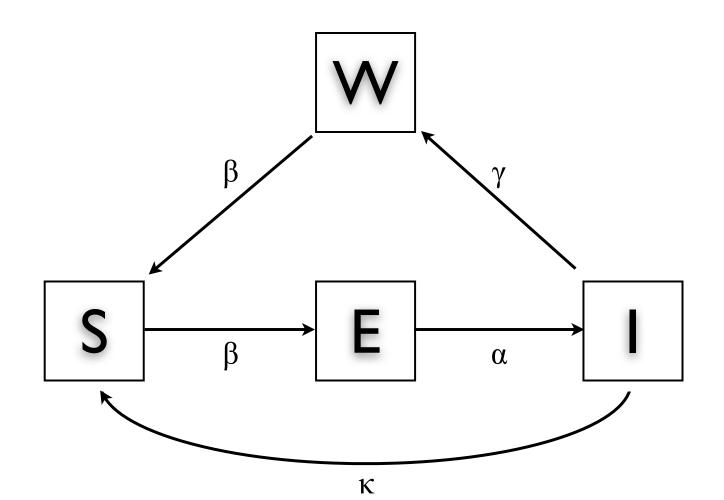


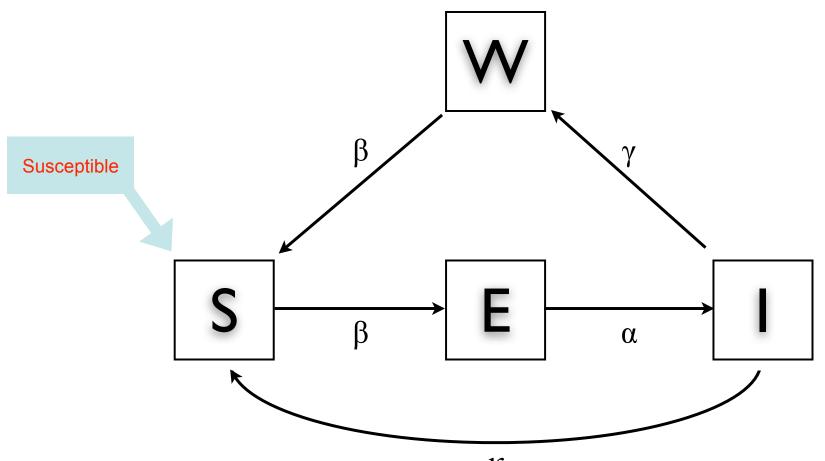
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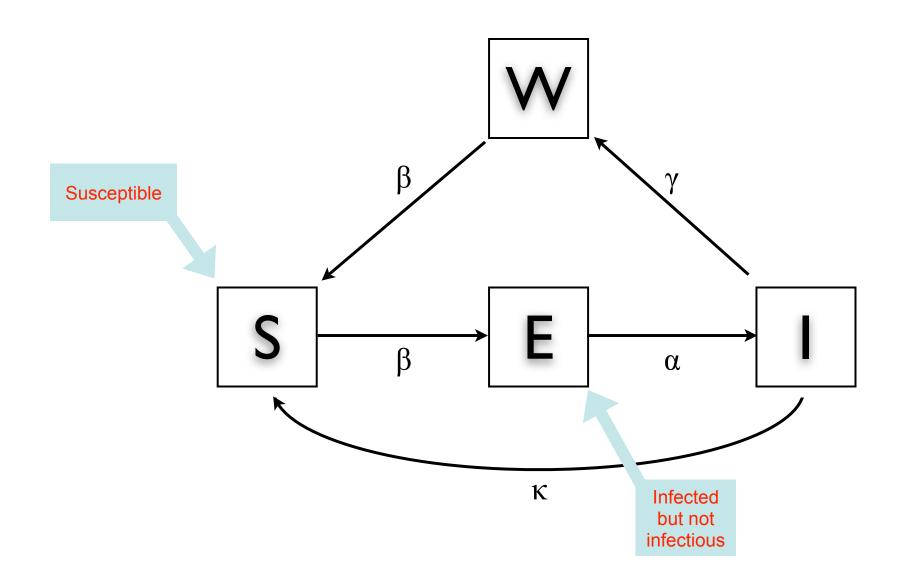
- However, continuous water treatment is neither desirable nor feasible
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- Thus, we consider chlorination at discrete times.

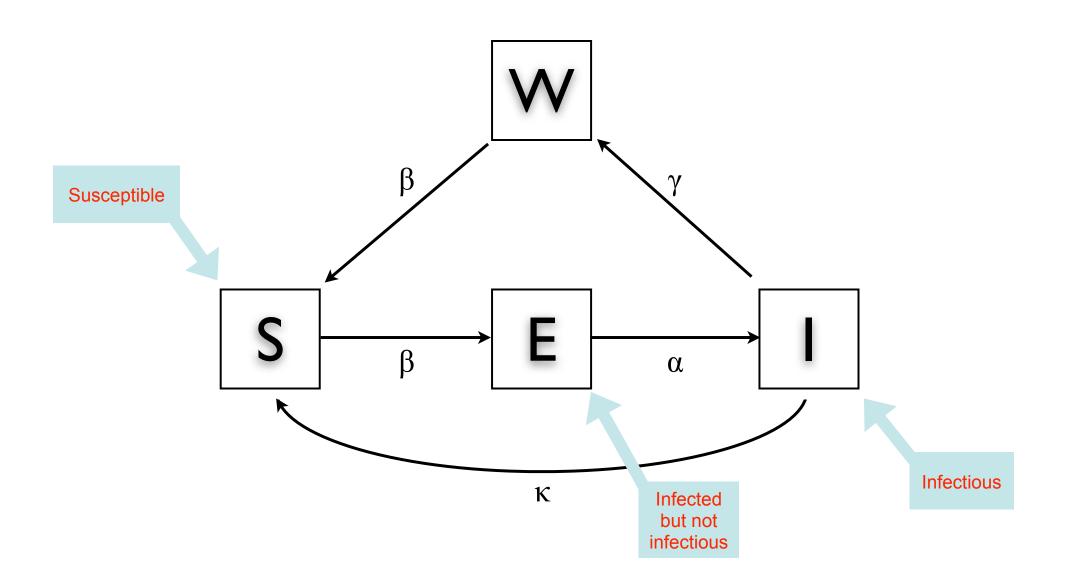


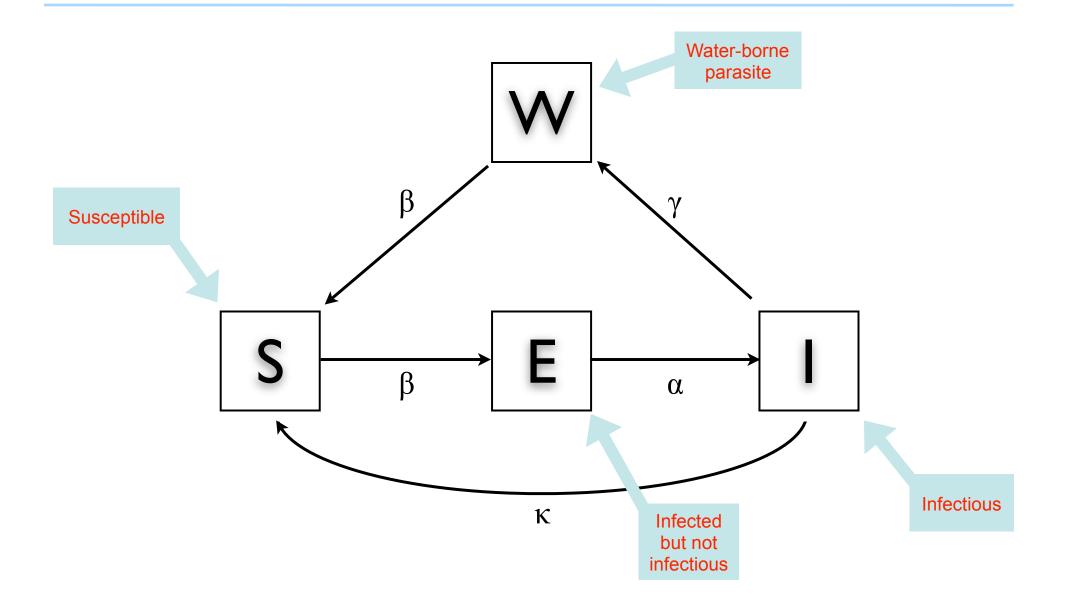


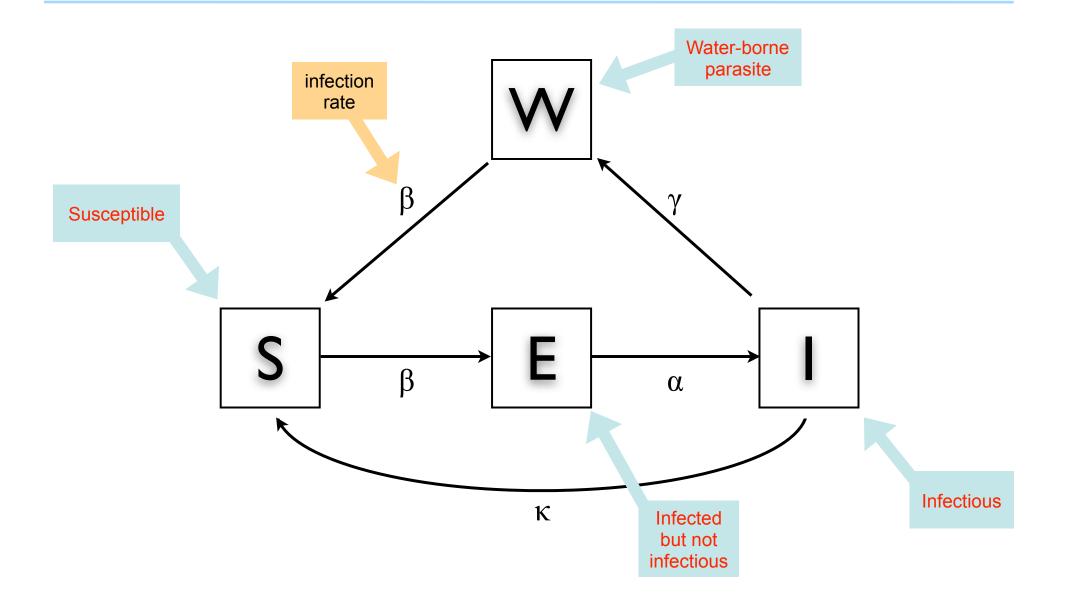


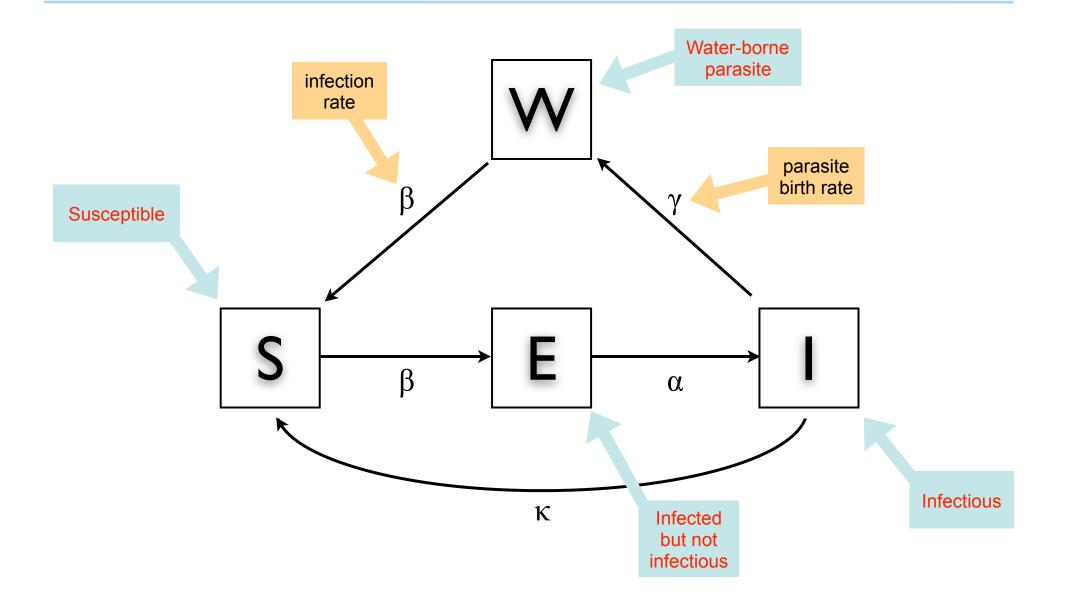
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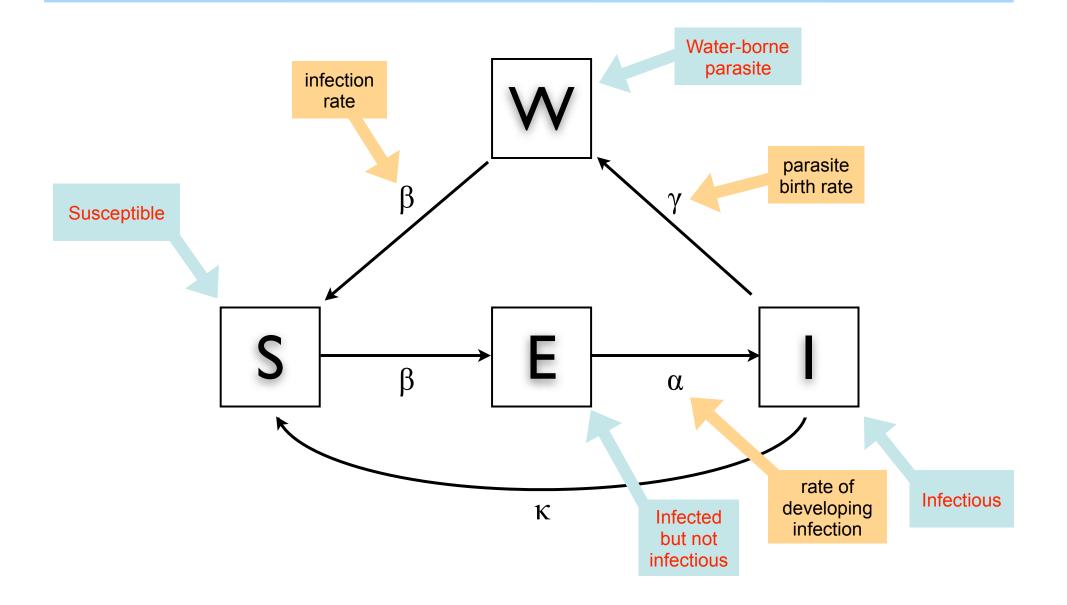


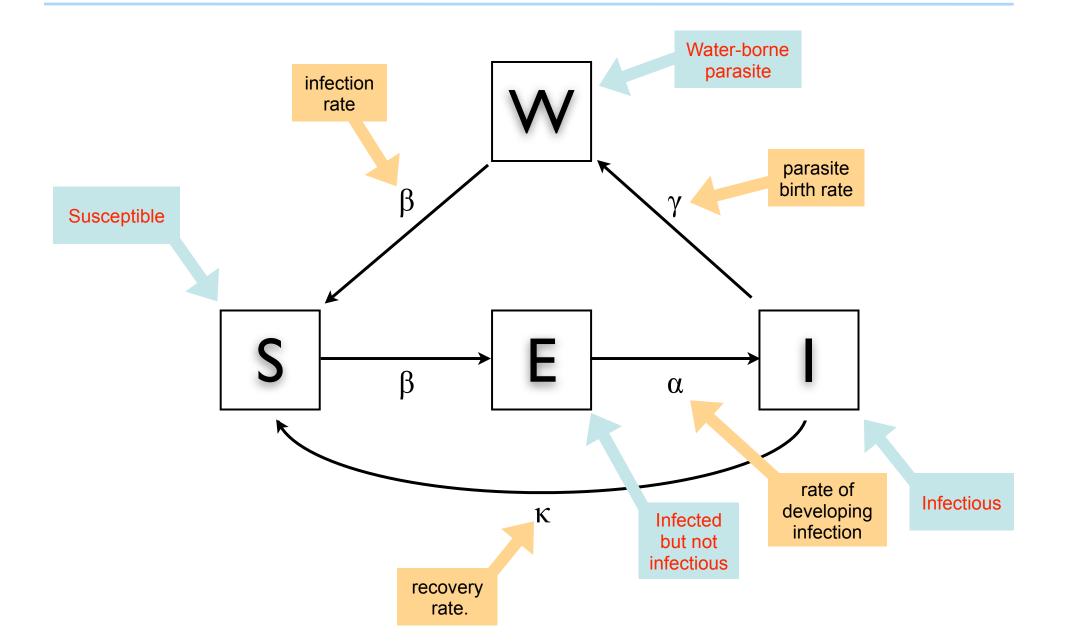












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- That is, the time required for the larvicide to be applied and reach its maximum is assumed to be negligible
- Impulsive differential equations are a useful formulation for systems that undergo rapid changes in their state
- The approximation is reasonable when the time between impulses is large compared to the duration of the rapid change.

# Putting it together

 The model thus consists of a system of ODEs (humans) together with an ODE and a difference equation (parasite).



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$$S' = \Pi - \beta SW - \mu S + \kappa I \qquad t \neq t_k$$
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$$W' = \gamma I - \mu_W W \qquad t \neq t_k$$
$$\Delta W = -rW \qquad t = t_k$$

S=susceptibles  $\Pi$ =birth rate  $\beta$ =transmissability  $\mu$ =background death rate E=exposed I=infectious W=parasite-infested water  $\kappa$ =recovery rate  $\alpha$ =incubation period  $\gamma$ =parasite birth rate  $\mu$ w=parasite death rate r=chlorine effectiveness



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- t<sub>k</sub> is the chlorination time
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- The latter only exists for some parameters.



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- Thus, R<sub>0</sub> is our eradication threshold.

 Education discourages infected individuals from putting infected limbs in the drinking water

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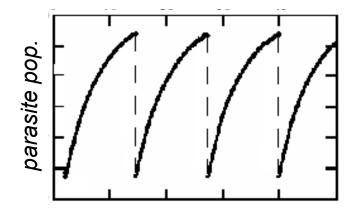
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- (Continuous) chlorination increases  $\mu_W$  and hence decreases  $R_0.$

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This results in a system of *impulsive differential equations*.

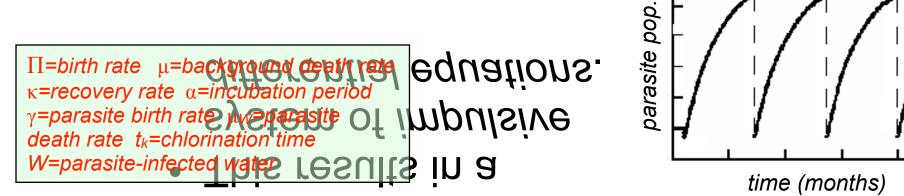
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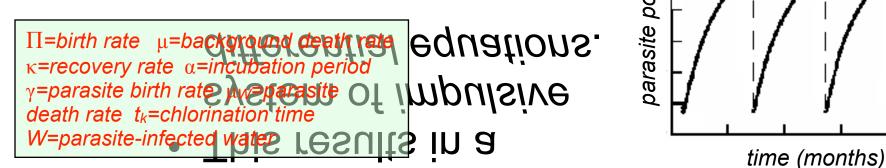
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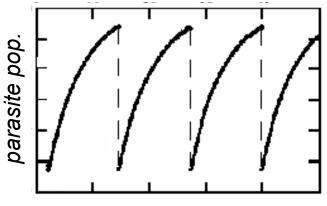


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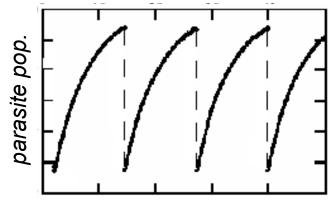


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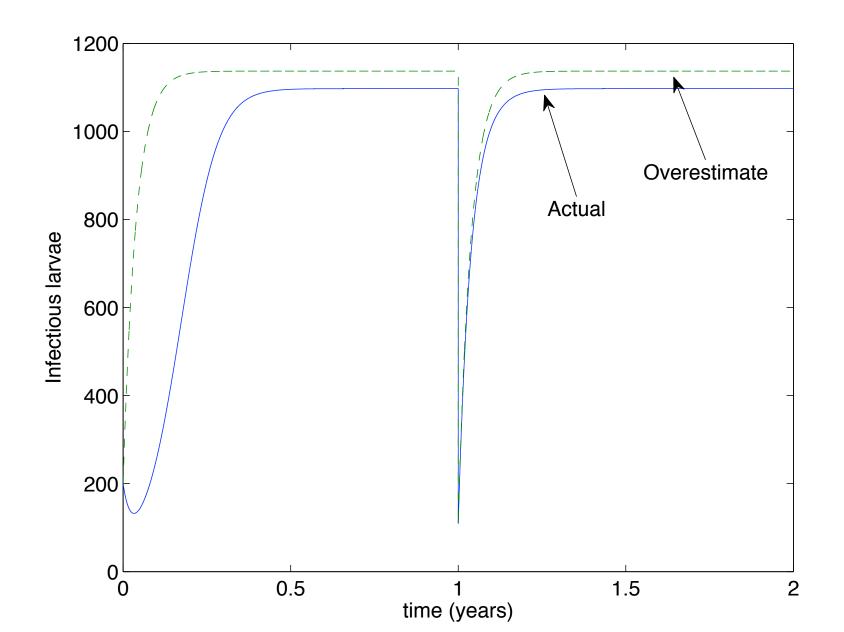
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$$W(t_{k+1}^{-}) = W(t_{k}^{+})e^{-\mu_{W}(t_{k+1}-t_{k})} + \frac{\alpha\Pi\gamma}{\mu\mu_{W}(\kappa+\mu)} \left[1 - e^{-\mu_{W}(t_{k+1}-t_{k})}\right]$$



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#### The degree of overestimation



## An explicit solution

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$$W_{n}^{-} = \frac{\alpha \Pi \gamma}{\mu \mu_{W}(\kappa + \mu)} \left[ (1 - r)^{n-1} e^{-\mu_{W}(t_{n} - t_{1})} + (1 - r)^{n-1} e^{-\mu_{W}(t_{n} - t_{2})} + \cdots + (1 - r) e^{-\mu_{W}(t_{n} - t_{n-1})} + 1 - (1 - r)^{n-2} e^{-\mu_{W}(t_{n} - t_{1})} - (1 - r)^{n-3} e^{-\mu_{W}(t_{n} - t_{2})} - \cdots - e^{-\mu_{W}(t_{n} - t_{n-1})} \right].$$

 $\Pi = birth rate \quad \mu = background \ death \ rate \\ \kappa = recovery \ rate \quad \alpha = incubation \ period \\ \gamma = parasite \ birth \ rate \quad \mu_W = parasite \ death \ rate \\ W = parasite - infected \ water \ t_k = chlorination \\ time \ r = chlorination \ effectiveness$ 



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$$\tau < \frac{1}{\mu_W} \ln \left[ \frac{\alpha \Pi \gamma - (1 - r) W^* \mu \mu_W (\kappa + \mu)}{\alpha \Pi \gamma - W^* \mu \mu_W (\kappa + \mu)} \right]$$

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- This is highly unlikely.



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$$e^{-\mu_W(t_n-t_k)} \approx 0 \text{ for } k > 2$$

 To keep the parasite below the threshold W\*, we thus require

$$t_n < \frac{1}{\mu_W} \ln \left[ \frac{2 - r^2}{1 - r(1 - r)e^{\mu_W t_{n-2}} - (2 - r)e^{\mu_W t_{n-1}} - W^* \mu \mu_W (\kappa + \mu) / (\alpha \Pi \gamma)} \right]$$

 $\Pi$ =birth rate  $\mu$ =background death rate  $\kappa$ =recovery rate  $\alpha$ =incubation period  $\gamma$ =parasite birth rate  $\mu_W$ =parasite death rate  $t_k$ =chlorination time W=parasite-infected water r=chlorination effectiveness

• When r=1, fixed and non-fixed chlorination are equivalent

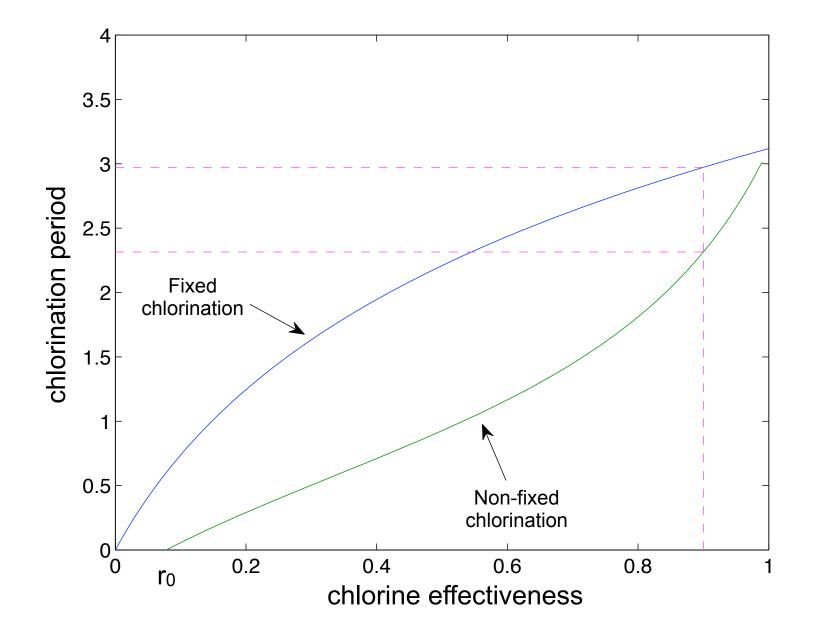
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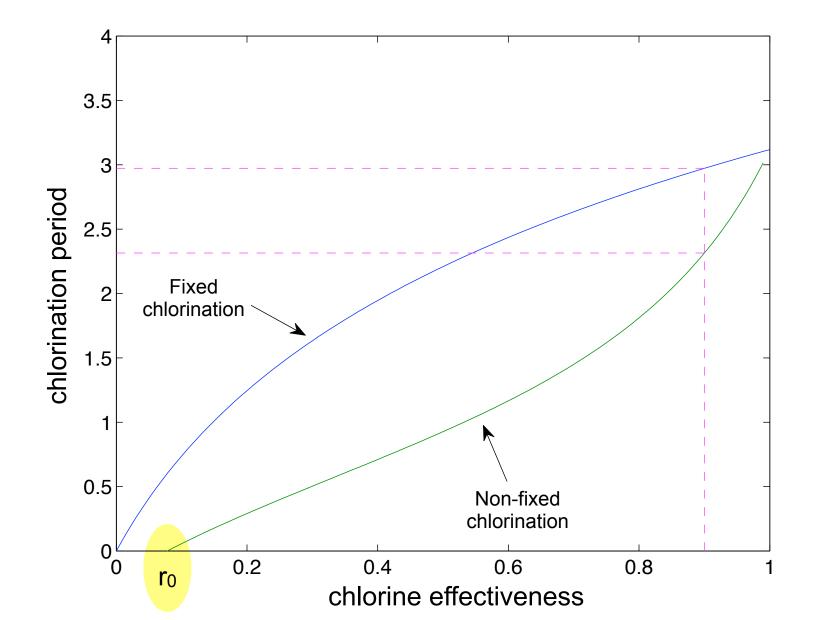
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- Thus, chlorination, whether fixed or nonfixed, can theoretically control the disease (but not eradicate it).

#### Fixed chlorination is always better



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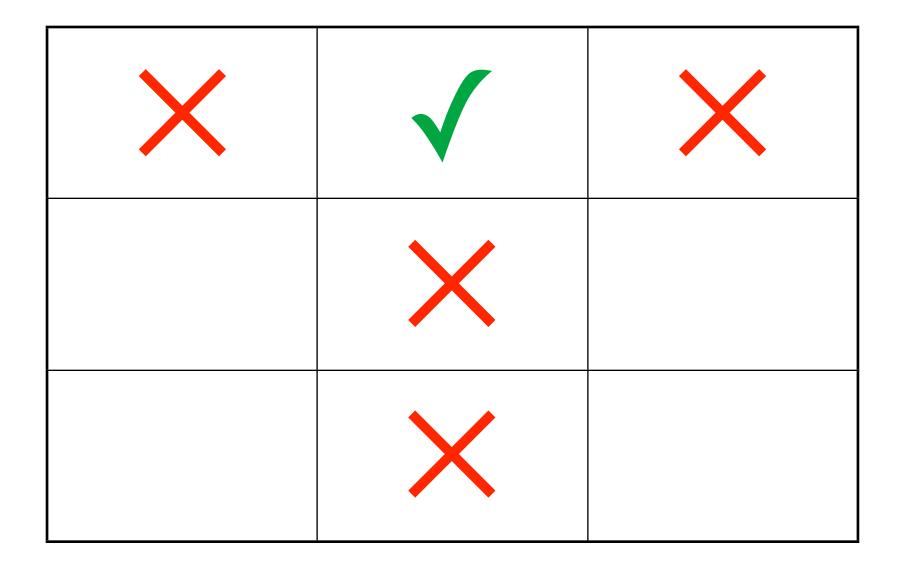
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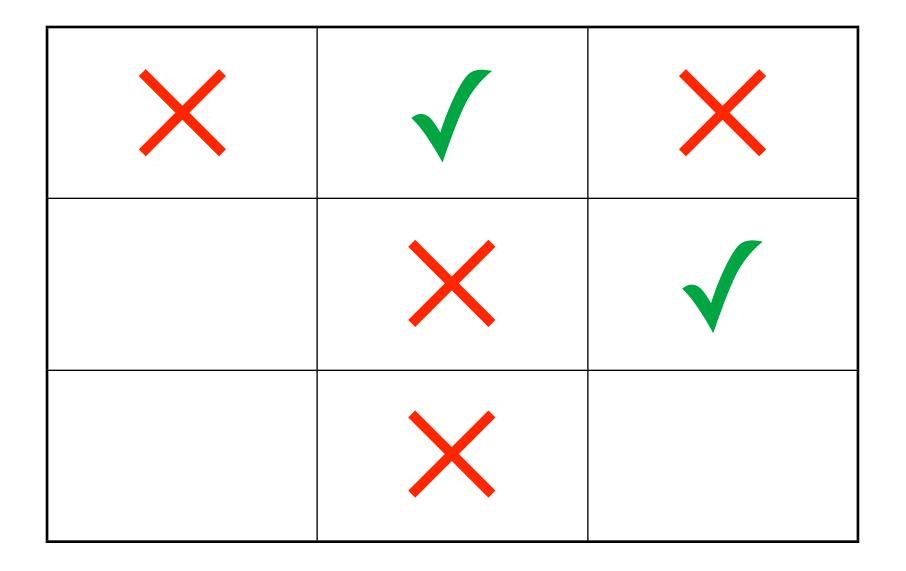
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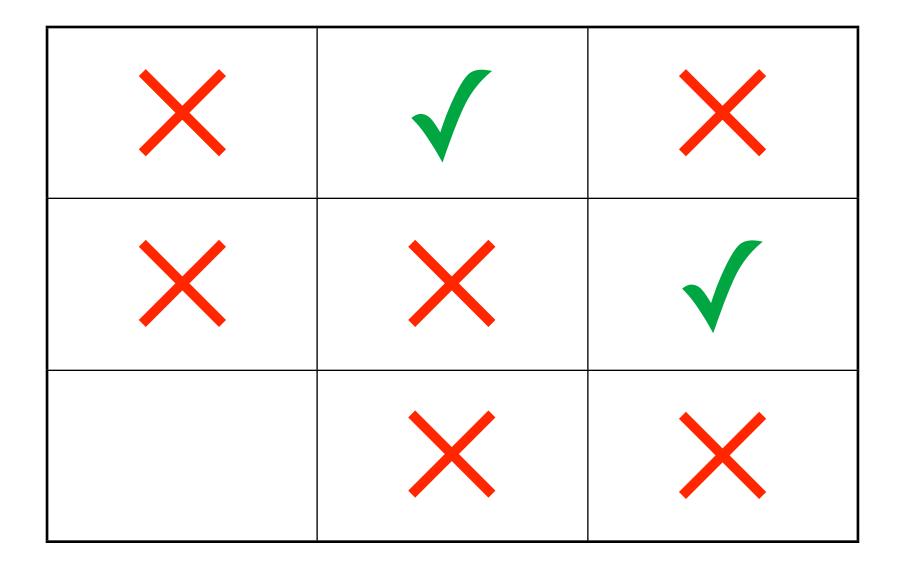
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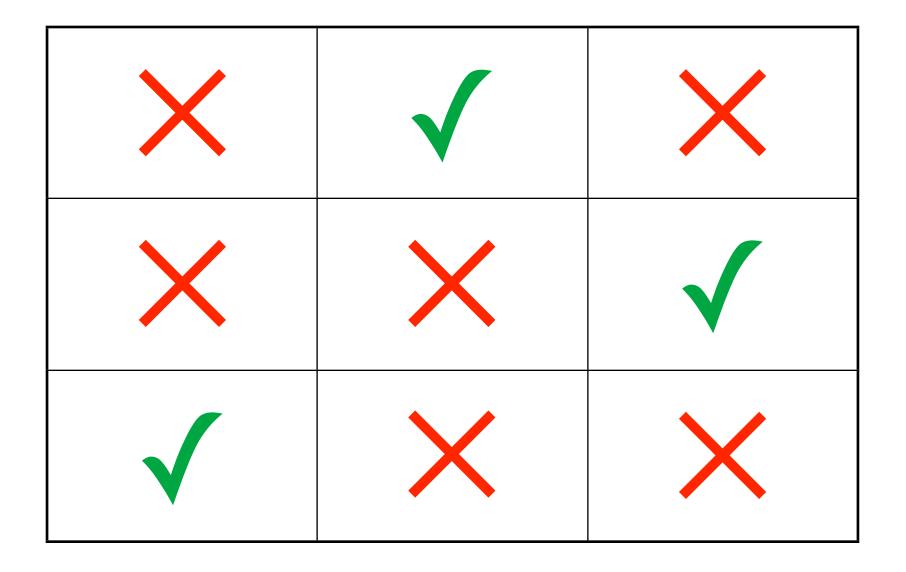
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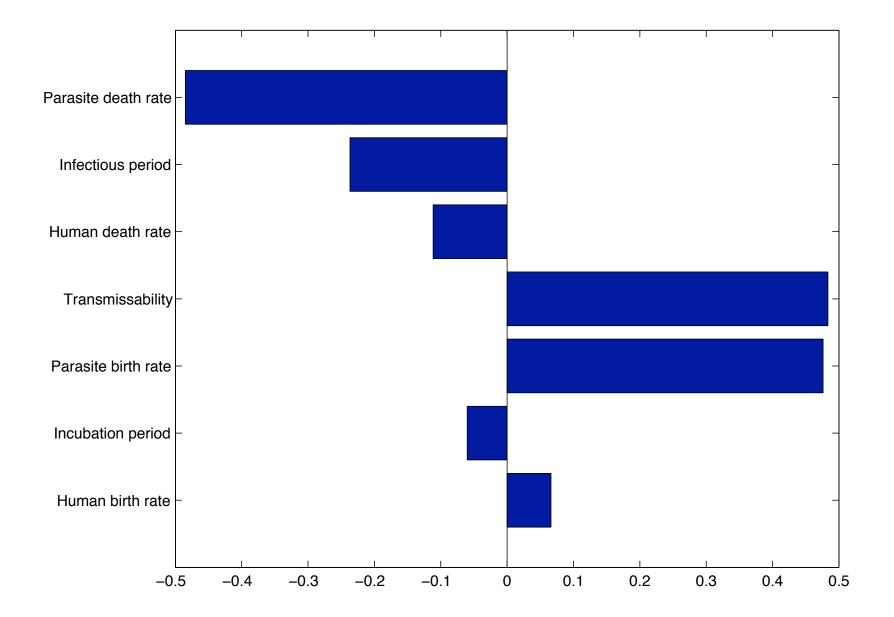
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- PRCCs > 0 will increase R<sub>0</sub> when they are increased
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#### PRCCs



• The three parameters with the most impact on R<sub>0</sub> are



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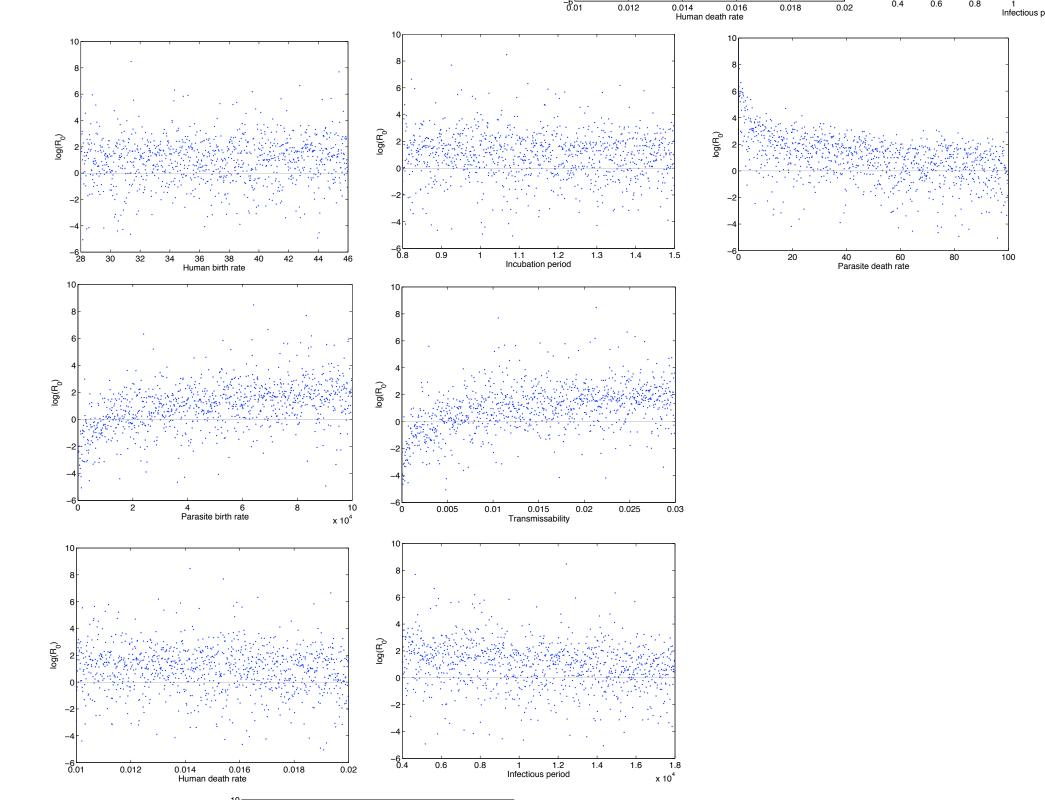
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# Most important parameters

- The three parameters with the most impact on R<sub>0</sub> are
  - the parasite death rate
  - transmissability
  - the parasite birth rate
- These are also the three that we have the most control over, via
  - chlorination
  - filtration
  - education.





• The same three parameters have the greatest impact



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- However, increasing µw (eg via continuous chlorination) is unlikely to lead to eradication

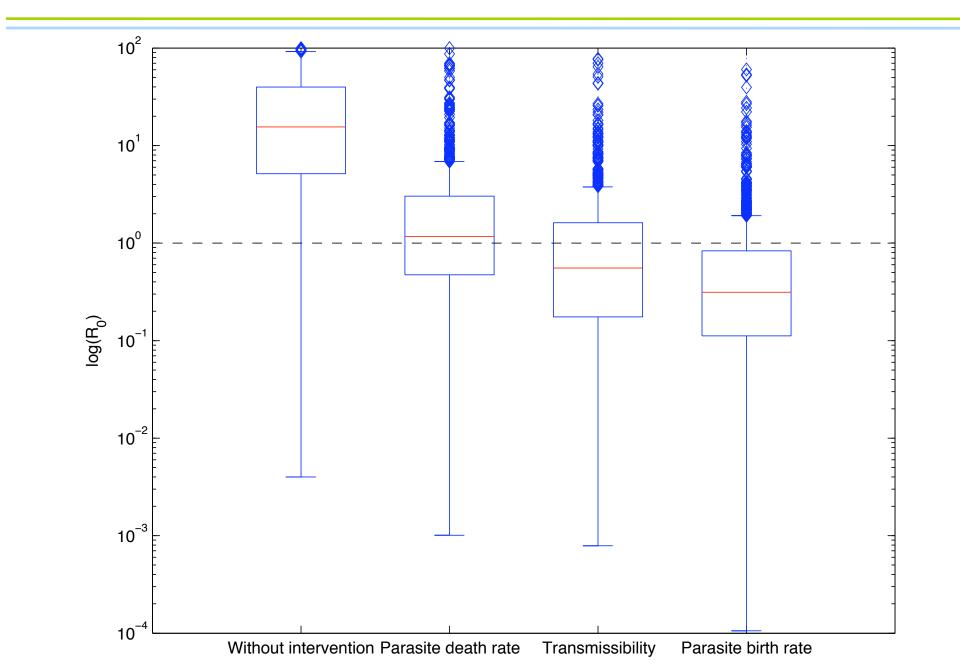


 $\gamma$ =parasite birth rate  $\mu_W$ =parasite death rate  $R_0$ =basic reproductive ratio

- The same three parameters have the greatest impact (as expected)
- However, increasing µw (eg via continuous chlorination) is unlikely to lead to eradication
- Conversely, sufficiently decreasing γ (via education) is likely to bring R<sub>0</sub> below 1.

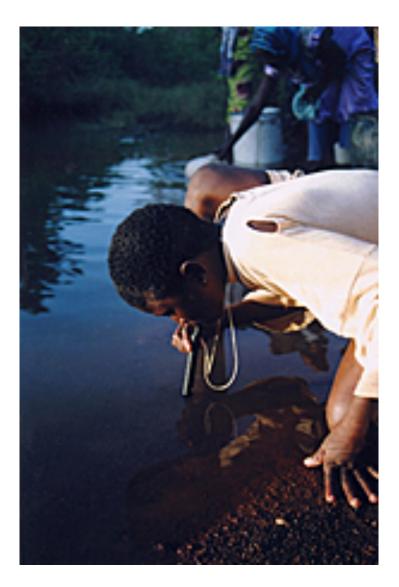


#### Altering parameters by a factor of 100



## **Eradication threshold**

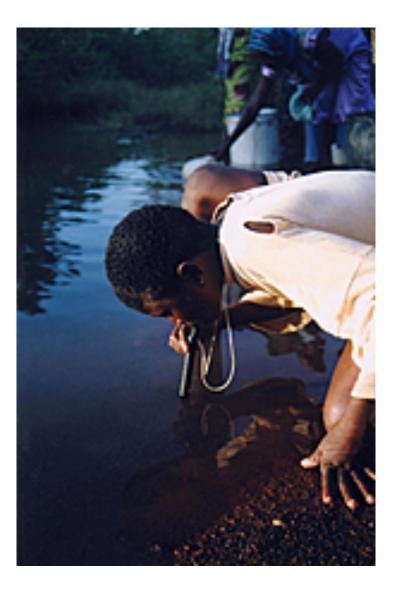
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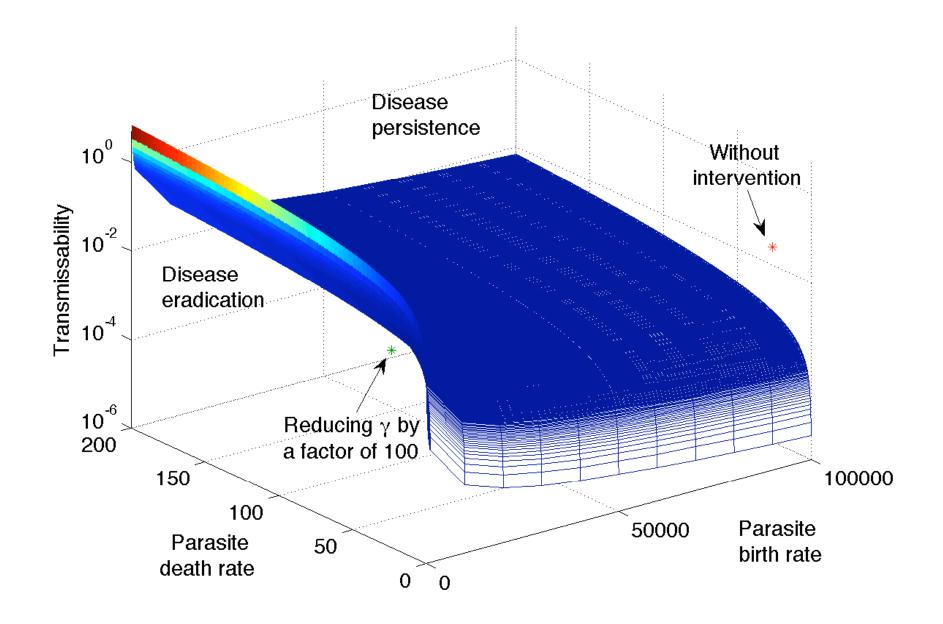


# Eradication threshold

- For R<sub>0</sub>=1, we can plot the threshold surface for our three control parameters (representing education, filtration and chlorination)
- We fixed all other parameters at median values.



#### **Eradication surface**



### Effect of control parameters

- The outcome is significantly dependent on changes in  $\boldsymbol{\gamma}$ 



 $\beta$ =transmissability  $\gamma$ =parasite birth rate  $\mu_W$ =parasite death rate

### Effect of control parameters

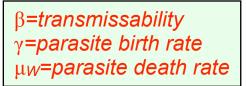
- The outcome is significantly dependent on changes in  $\boldsymbol{\gamma}$
- Even if  $\mu_W$  were increased tenfold, it is still unlikely to lead to eradication



β=transmissability γ=parasite birth rate μ<sub>W</sub>=parasite death rate

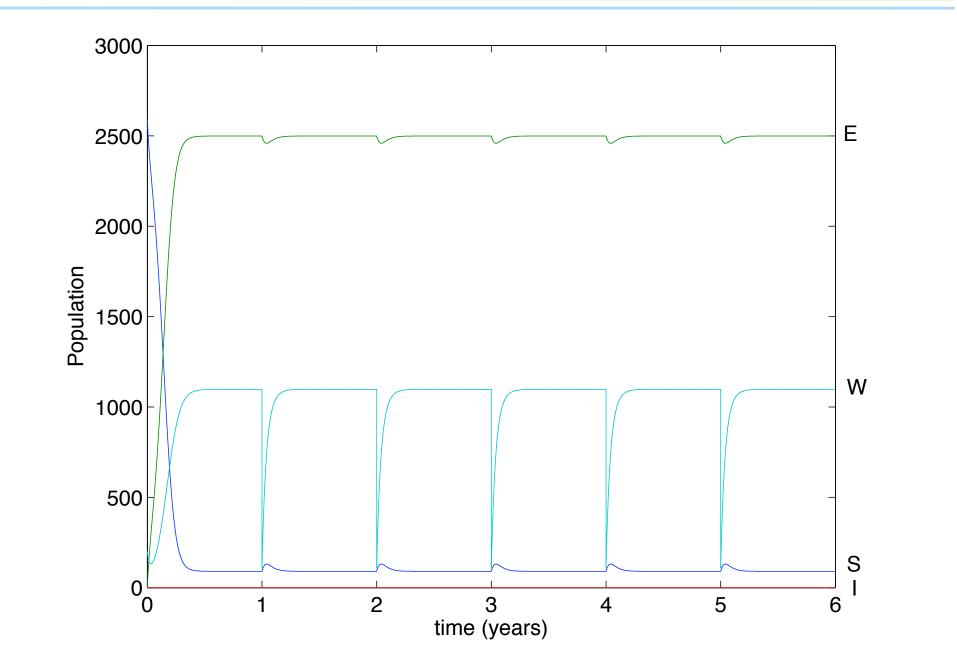
# Effect of control parameters

- The outcome is significantly dependent on changes in  $\gamma$
- Even if  $\mu_W$  were increased tenfold, it is still unlikely to lead to eradication
- β would have to be reduced to extremely low levels.

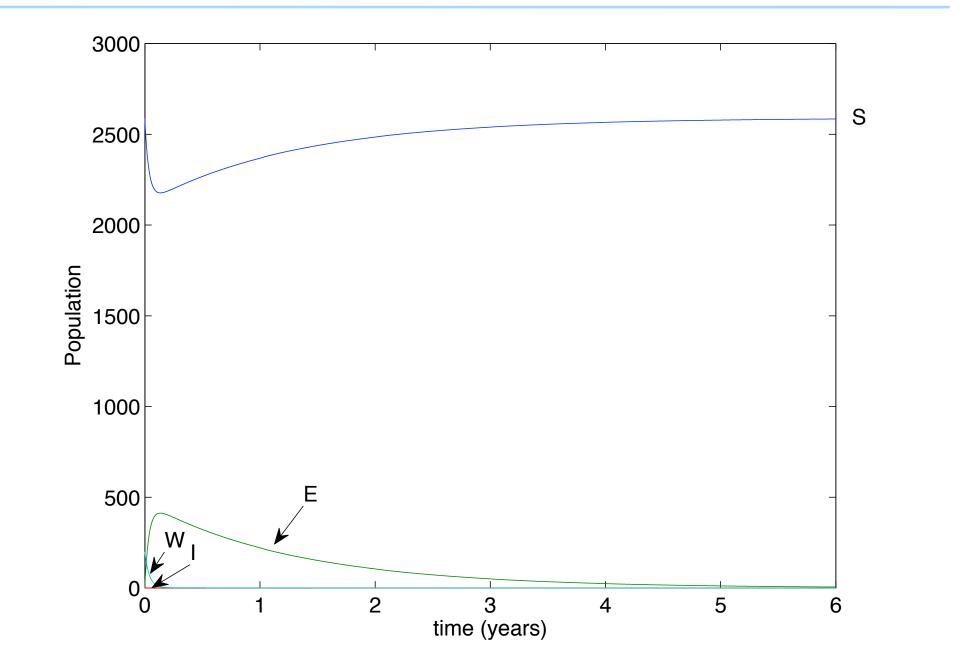




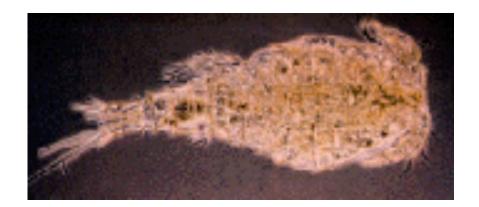
#### Annual chlorination



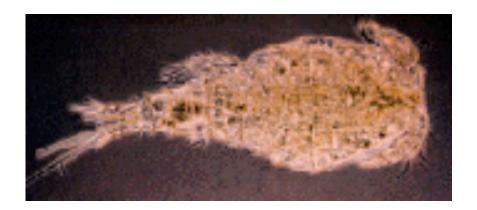
#### Reducing the parasite birthrate by 99%



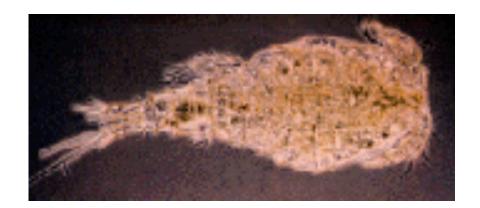
Annual chlorination alone has little effect on the disease



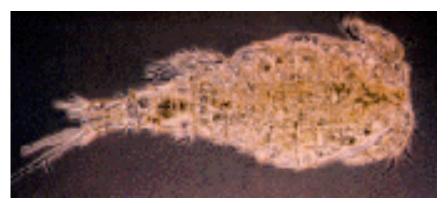
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- The population quickly returns to high levels following chlorination
- Reducing the parasite birth rate by 99% (eg via education) can lead to eradication
- The entire population becomes uninfected.



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  - biological and technical feasibility
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- Guinea worm disease satisfies all three.



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- A critical control tool was photographic recognition cards
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  - lack of societal support.



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- Only one of these was successful
- In 2011, we eradicated rinderpest (a cow disease, from which quarantine was invented)
- This brought our total up to two.

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- However, ongoing efforts mean India was recently declared yaws-free.

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- Education persuading people not to put infected limbs in the drinking water — is the best way to eradicate Guinea worm disease
- Of course, a combination of education, chlorination and filtration is most desirable
- Efforts should be focussed on reaching remote communities.

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- This may reshape our understanding of what it takes to eradicate a disease
- By mustering both scientific and cultural resources, we can successfully defeat one of the oldest diseases in human history.

### Key references

- 1. <u>R.J. Smith?</u>, P. Cloutier, J. Harrison and A. Desforges *A mathematical model for the eradication of Guinea worm disease.* Understanding the Dynamics of Emerging and Reemerging Infectious Diseases Using Mathematical Models, S. Mushayabasa and C.P. Bhunu (eds), 2012, 133-156.
- 2. A. Kealey and <u>R.J. Smith?</u> (2010) *Neglected Tropical Diseases: Infection Modeling and Control.* Journal of Healthcare for the Poor and Underserved 21, 53-69.

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