

Effect of infection-dependent dispersal on the evolution of parasite virulence in metapopulation epidemiological models

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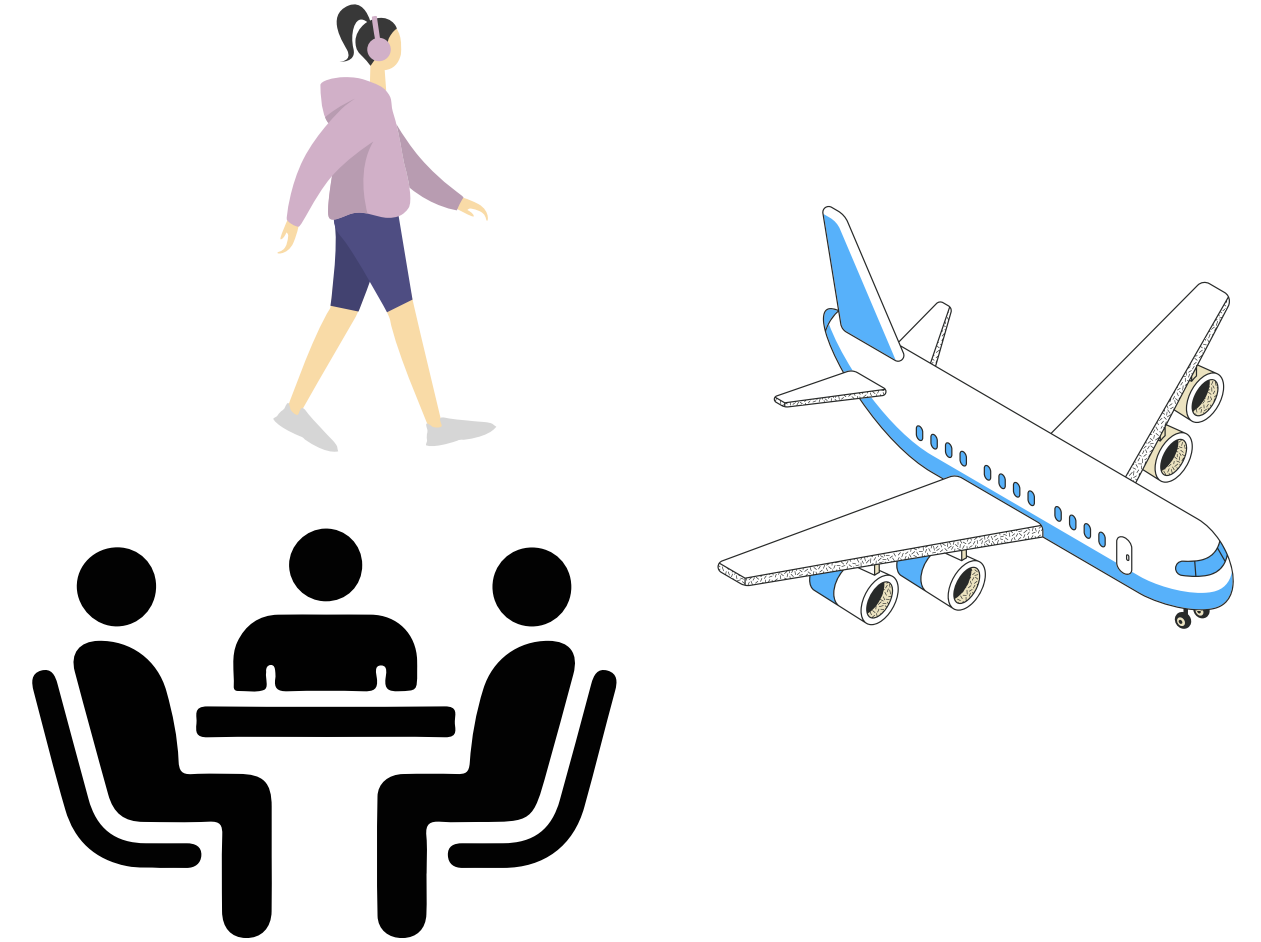
FEEDME project



Introduction

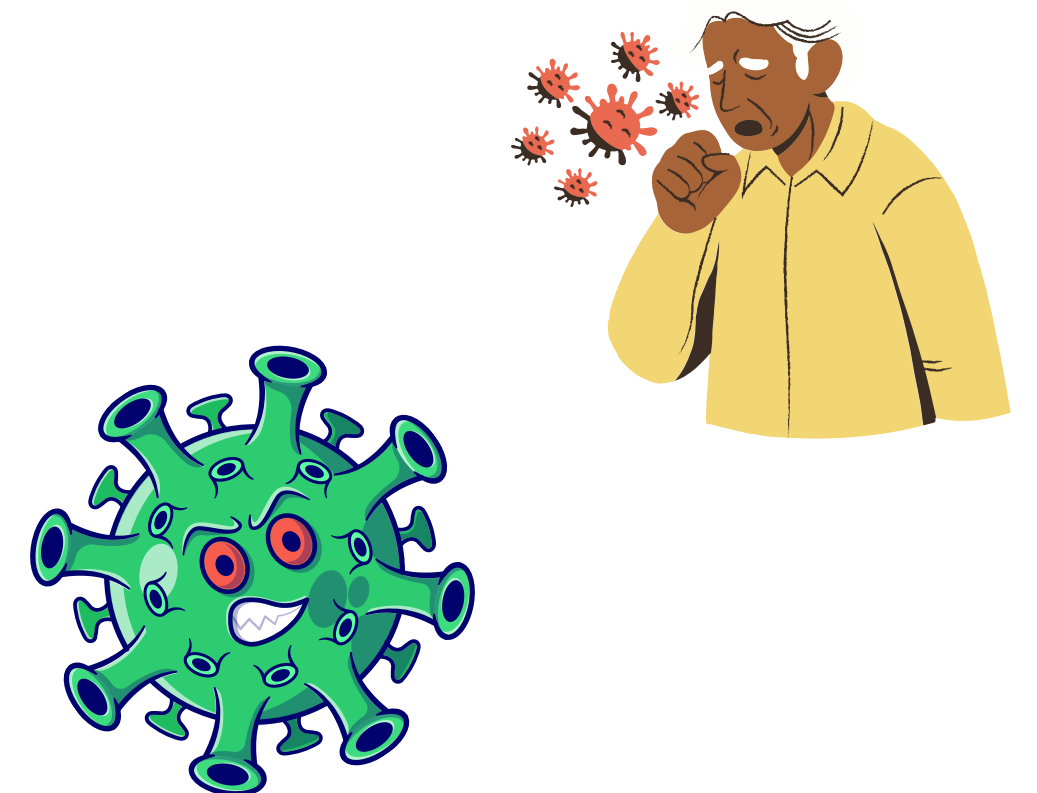
Dispersion of individuals

- Moving in space
- Contact with other individuals



Disease caused by a parasite

- Contact transmission
- Virulence = Mortality of pathogen



Introduction

Dispersion dependent on the epidemiological status of the individual

Good health



+++ Dispersion

Infected



--- Dispersion

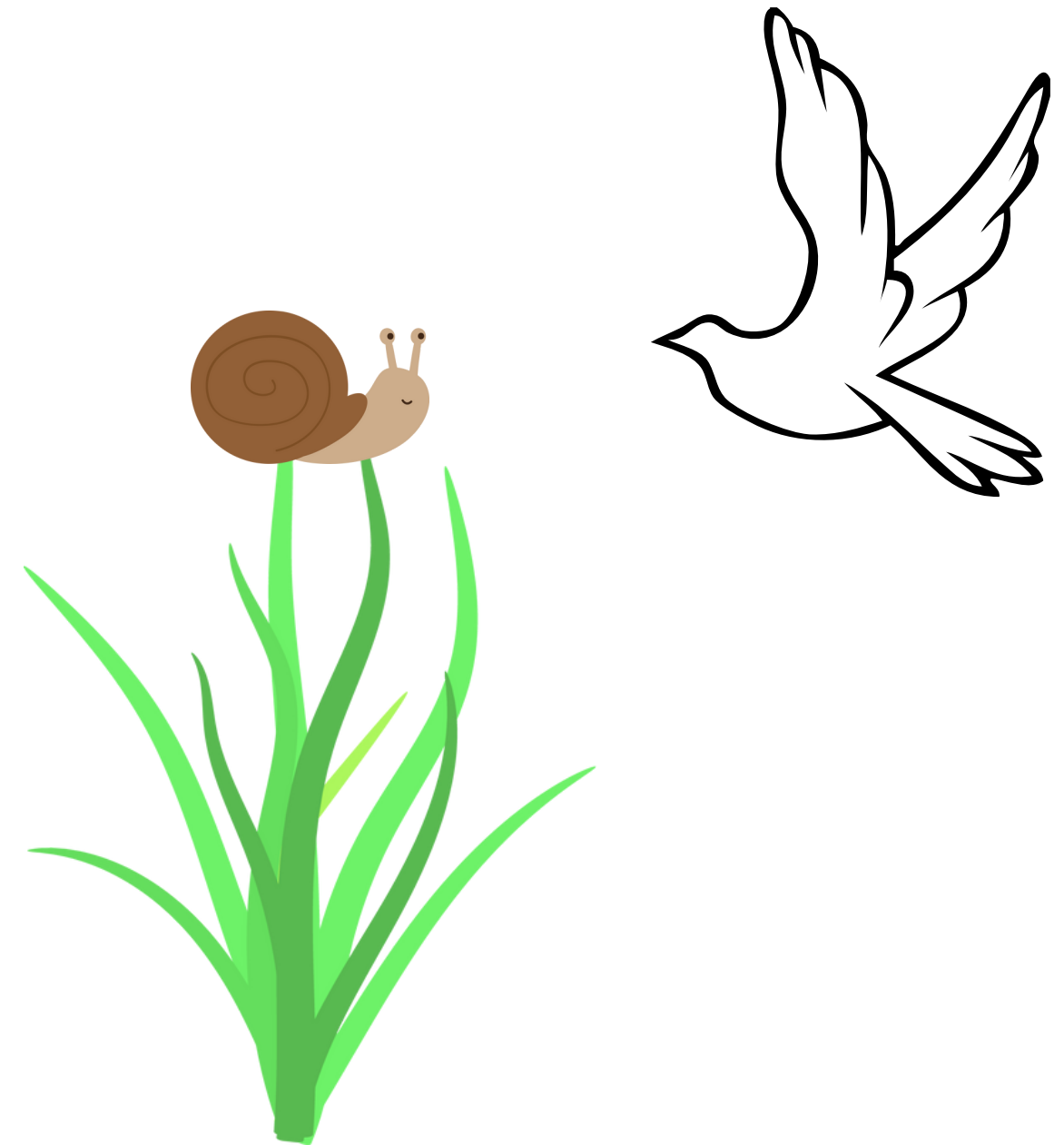
Introduction

Dispersion dependent on the epidemiological status of the individual



Snail + *Leucochloridium paradoxum*

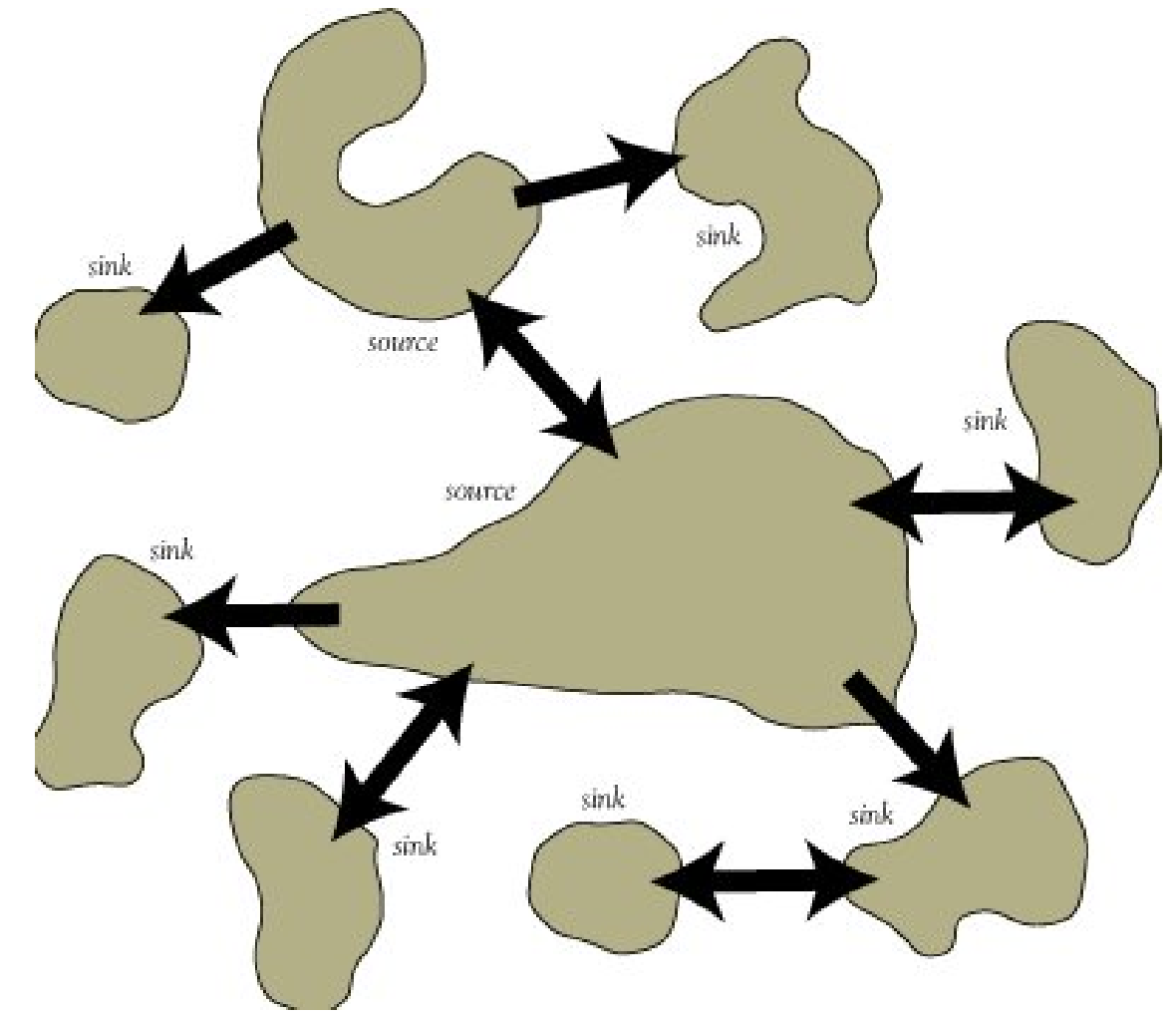
→
+++ Dispersion



Introduction

Metapopulation

- Set of populations of individuals
- Spatially separated
- Connected with dispersion / migration
- Local dynamics for each patch
- Global dynamics with all patches of the metapopulation



Introduction

What effects can infection-dependent dispersal have on the evolution of virulence ?

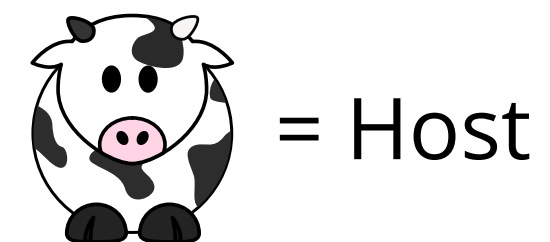
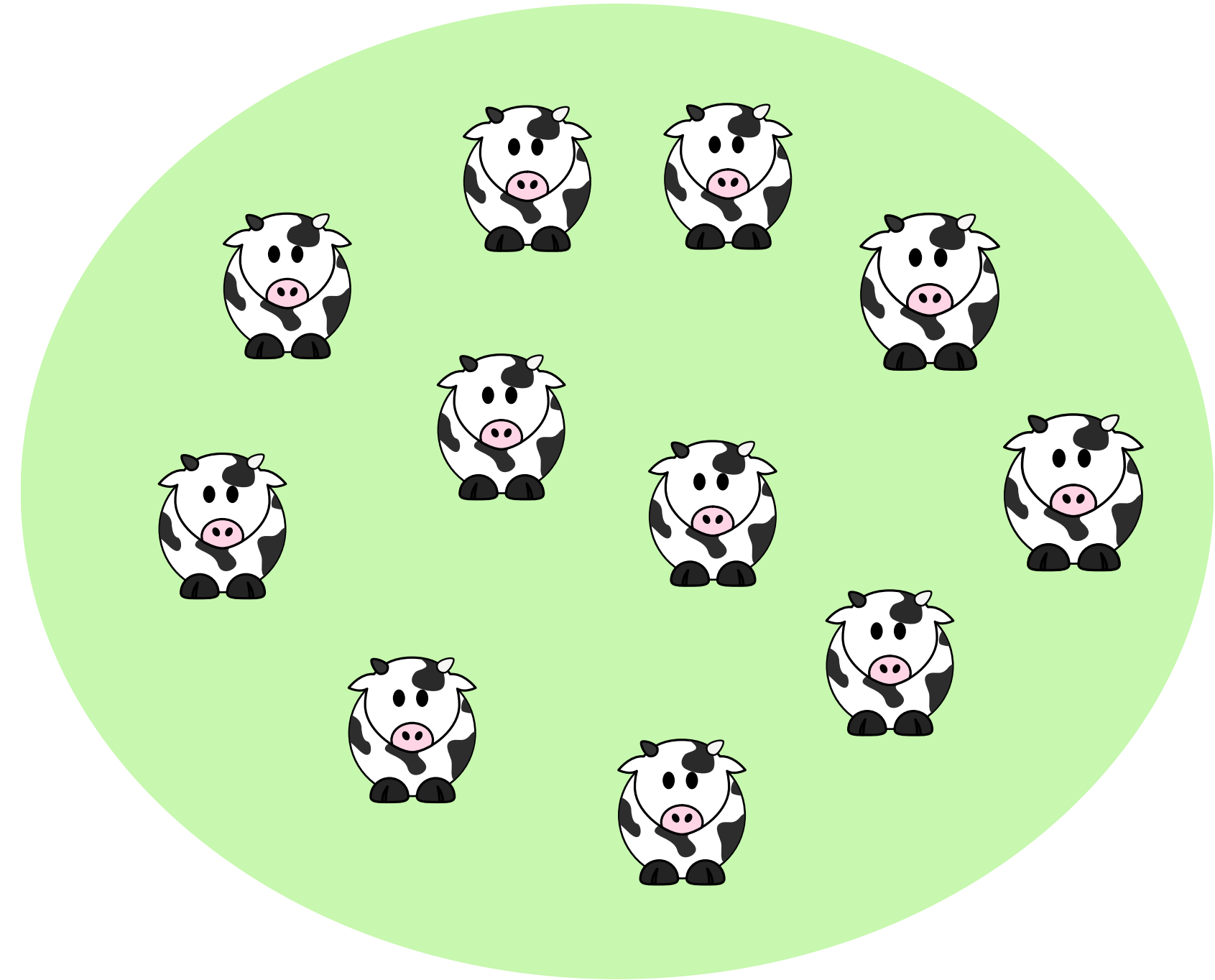
- Infected Dispersal $>$ Susceptible Dispersal
- Infected Dispersal $<$ Susceptible Dispersal

Model

Local Dynamics

Patch with one theoretical species of host

- Birth of individuals (b)
- Death of individuals (μ)
- Carrying Capacity (k)



Model

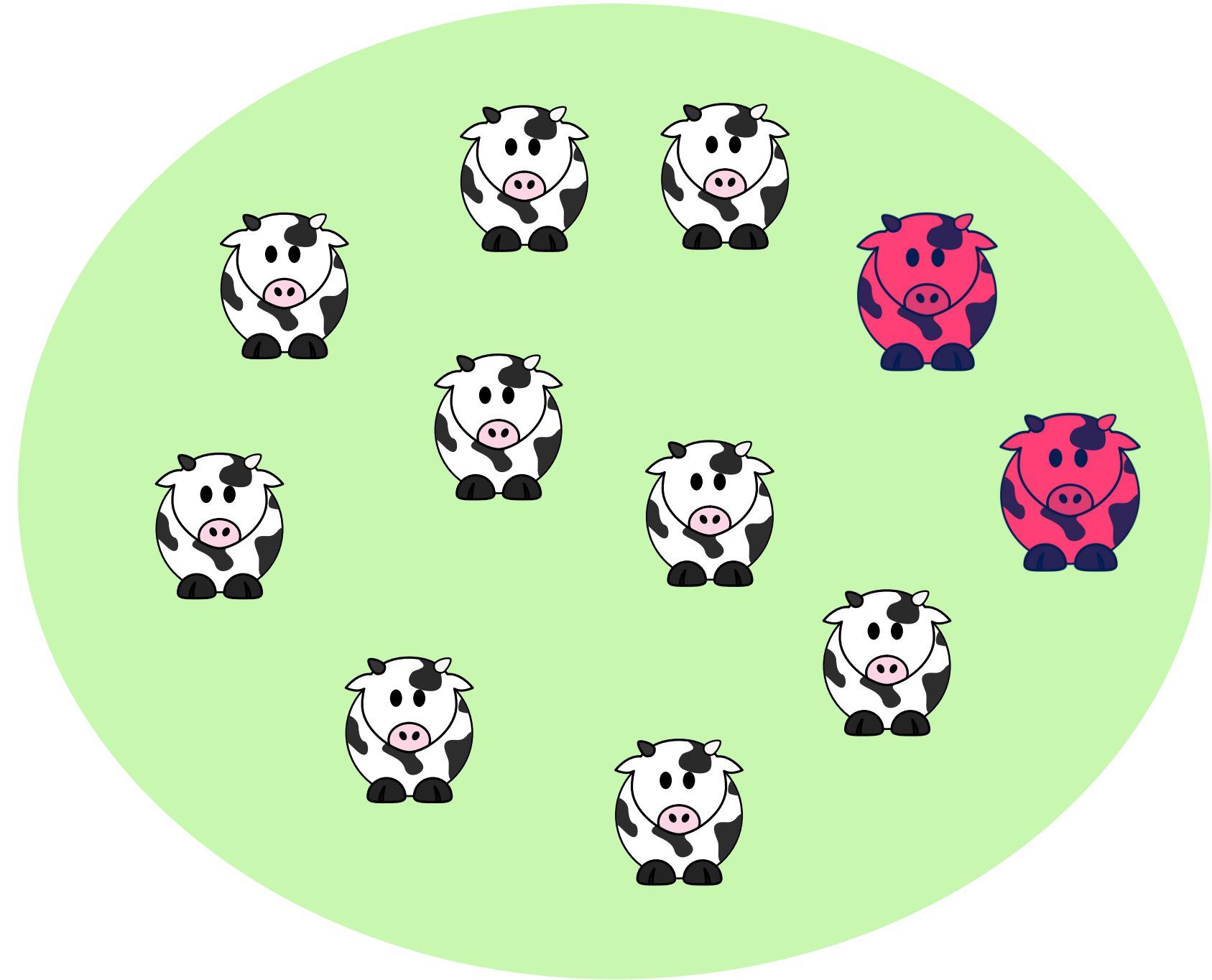
Local Dynamics

Patch with one theoretical species of host

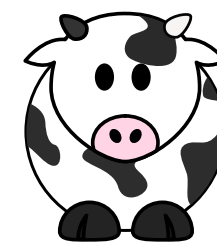
- Birth of individuals (b)
- Death of individuals (μ)
- Carrying Capacity (k)

And one theoretical species of parasite

- 2 different states (S and I)
- Transmission rate (β)
- Remission rate (γ)
- Virulence of the parasite (α)



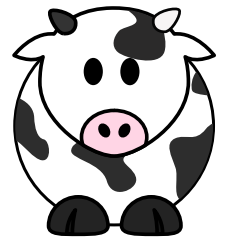
= Infected individuals (I)



= Susceptible individuals (S)

Model

Local Dynamics



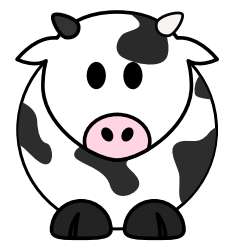
$$\frac{dS}{dt} = (b(1 - (S + I)/k) - \mu)S - \beta SI + \gamma I$$



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

Model

Local Dynamics



$$\frac{dS}{dt} = \underbrace{(b(1 - (S + I)/k) - \mu)S}_{\text{Birth and death of individuals}} - \beta SI + \gamma I$$

Birth and death of individuals :

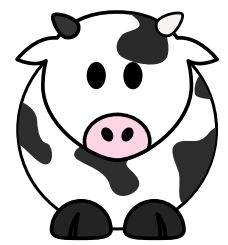
- No reproduction for infected individuals
- Density-dependent effect of k on birth rate



$$\frac{dI}{dt} = \beta SI - \gamma I - \alpha I - \underline{\mu I}$$

Model

Local Dynamics



$$\frac{dS}{dt} = \underbrace{(b(1 - (S + I)/k) - \mu)S}_{\text{Birth and death of individuals}} - \underbrace{\beta SI + \gamma I}_{\text{Transmission of the parasite}}$$

Birth and death of individuals :

- No reproduction for infected individuals
- Density-dependent effect of k on birth rate

Transmission of the parasite :

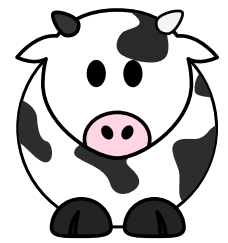
- No spatial structure in a patch



$$\frac{dI}{dt} = \underbrace{\beta SI}_{\text{Transmission of the parasite}} - \gamma I - \alpha I - \underbrace{\mu I}_{\text{Birth and death of individuals}}$$

Model

Local Dynamics



$$\frac{dS}{dt} = \underbrace{(b(1 - (S + I)/k) - \mu)S}_{\text{Birth and death of individuals}} - \underbrace{\beta SI}_{\text{Transmission of the parasite}} + \underbrace{\gamma I}_{\text{Remission of hosts}}$$

Birth and death of individuals :

- No reproduction for infected individuals
- Density-dependent effect of k on birth rate

Remission of hosts :

- No immunity for susceptible individuals

Transmission of the parasite :

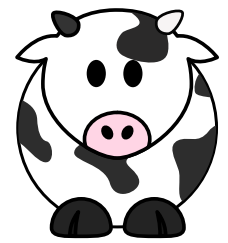
- No spatial structure in a patch



$$\frac{dI}{dt} = \underbrace{\beta SI}_{\text{Transmission of the parasite}} - \underbrace{\gamma I}_{\text{Remission of hosts}} - \underbrace{\alpha I}_{\text{Parasite death}} - \underbrace{\mu I}_{\text{Host death}}$$

Model

Local Dynamics



$$\frac{dS}{dt} = \underbrace{(b(1 - (S + I)/k) - \mu)S}_{\text{Birth and death of individuals}} - \underbrace{\beta SI}_{\text{Transmission of the parasite}} + \underbrace{\gamma I}_{\text{Remission of hosts}}$$

Remission of hosts :

- No immunity for susceptible individuals

Birth and death of individuals :

- No reproduction for infected individuals
- Density-dependent effect of k on birth rate

Transmission of the parasite :

- No spatial structure in a patch



$$\frac{dI}{dt} = \underbrace{\beta SI}_{\text{Transmission of the parasite}} - \underbrace{\gamma I}_{\text{Remission of hosts}} - \underbrace{\alpha I}_{\text{Virulence of the parasite}} - \underbrace{\mu I}_{\text{Birth and death of individuals}}$$

Virulence of the parasite

- Additional mortality due to the parasite

Model

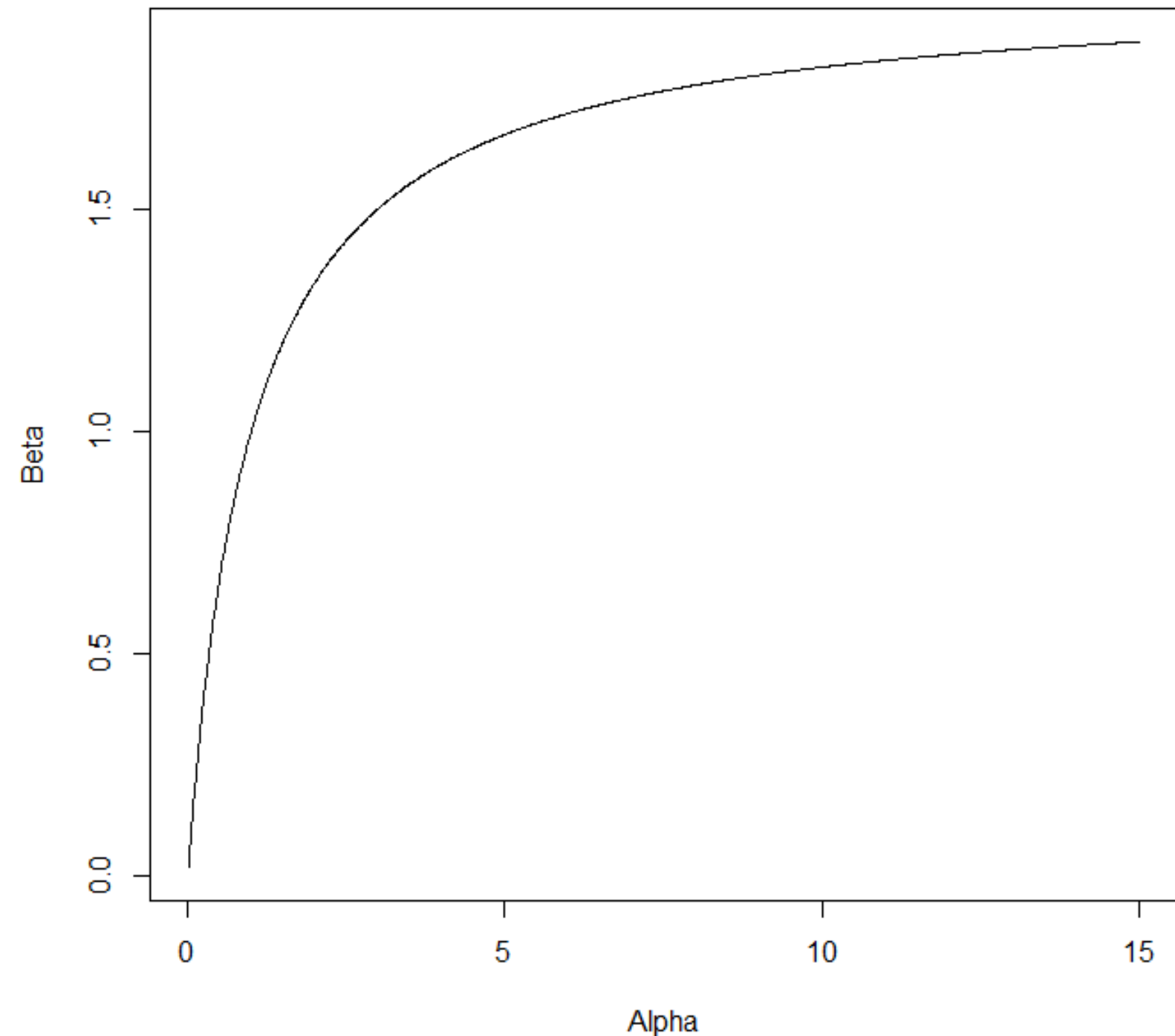
Local Dynamics

Trade-off between Transmission (β) and Virulence of the parasite (α)

$$\beta(\alpha) = \beta_0 * \alpha / (1 + \alpha)$$

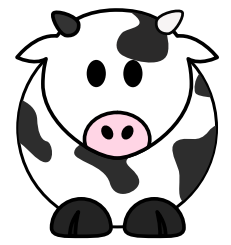
Value of β depends :

- β base value (β_0)
- Virulence (α)



Model

Local Dynamics



$$\frac{dS}{dt} = (b(1 - (S + I)/k) - \mu)S - \beta SI + \gamma I - \underline{mS}$$



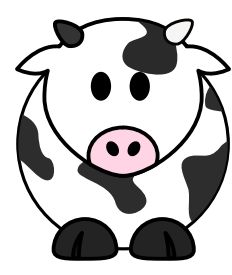

Emigration of hosts = Dispersal of individuals



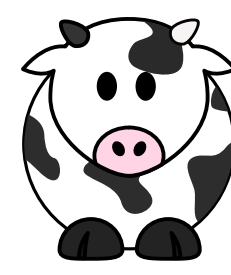

$$\frac{dI}{dt} = \beta SI - \gamma I - \alpha I - \mu I - \underline{mI}$$

Model

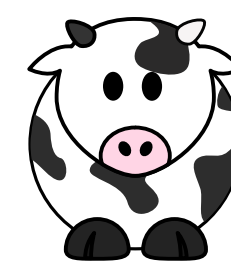

Local Dynamics Equilibrium

 = 0  = 0

- Empty patch

 = S^*  = 0

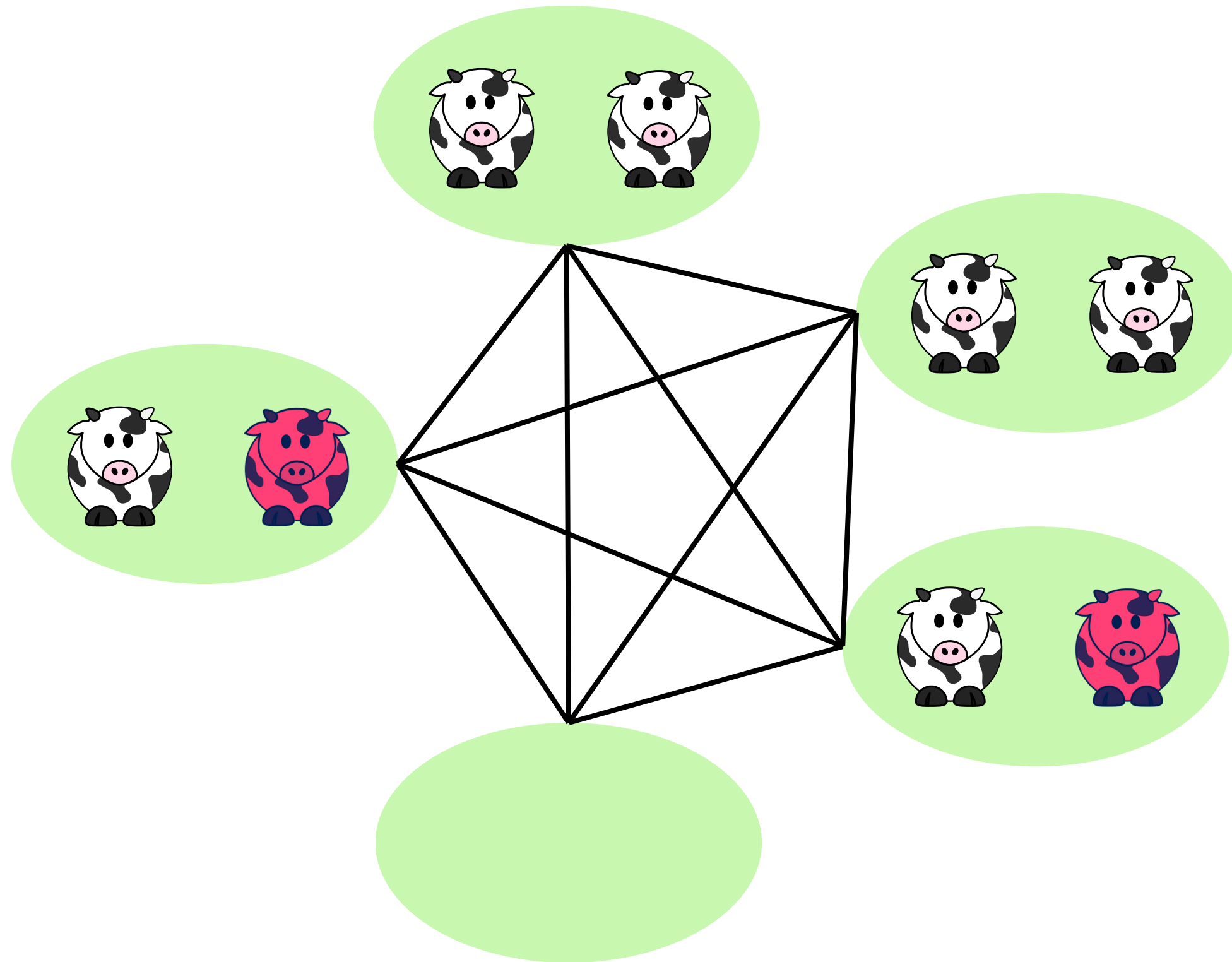
- Only susceptible individuals
- "Disease-free equilibrium" (DFE)

 = \hat{S}  = \hat{I}

- Constant fraction of susceptible and infected hosts
- "Endemic equilibrium"

Model

Metapopulation



Metapopulation :

- All neighbors
- Migration between patches

3 quasi-stationary equilibrium :

- Empty patch
- DFE
- Endemic Equilibrium

ε = Extinction of the population of a patch

Model

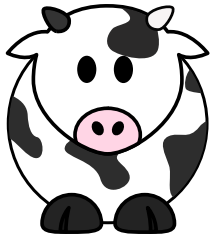
Local Dynamics in a metapopulation


$$\frac{dS_i}{dt} = (b(1 - (S + I)/k) - \mu)S - \beta SI + \gamma I - m_S S + \sum_{j=1}^z m_S(1 - \rho)S_j/z$$

$$\frac{dI_i}{dt} = \beta SI - \gamma I - \alpha I - \mu I - m_I I + \sum_{j=1}^z m_I(1 - \rho)I_j/z$$

Model

Local Dynamics in a metapopulation


$$-m_S S + \sum_{i=1}^z m_S (1 - \rho) S_j / z$$


$$-m_I I + \sum_{j=1}^z m_I (1 - \rho) I_j / z$$

Migration parameters :

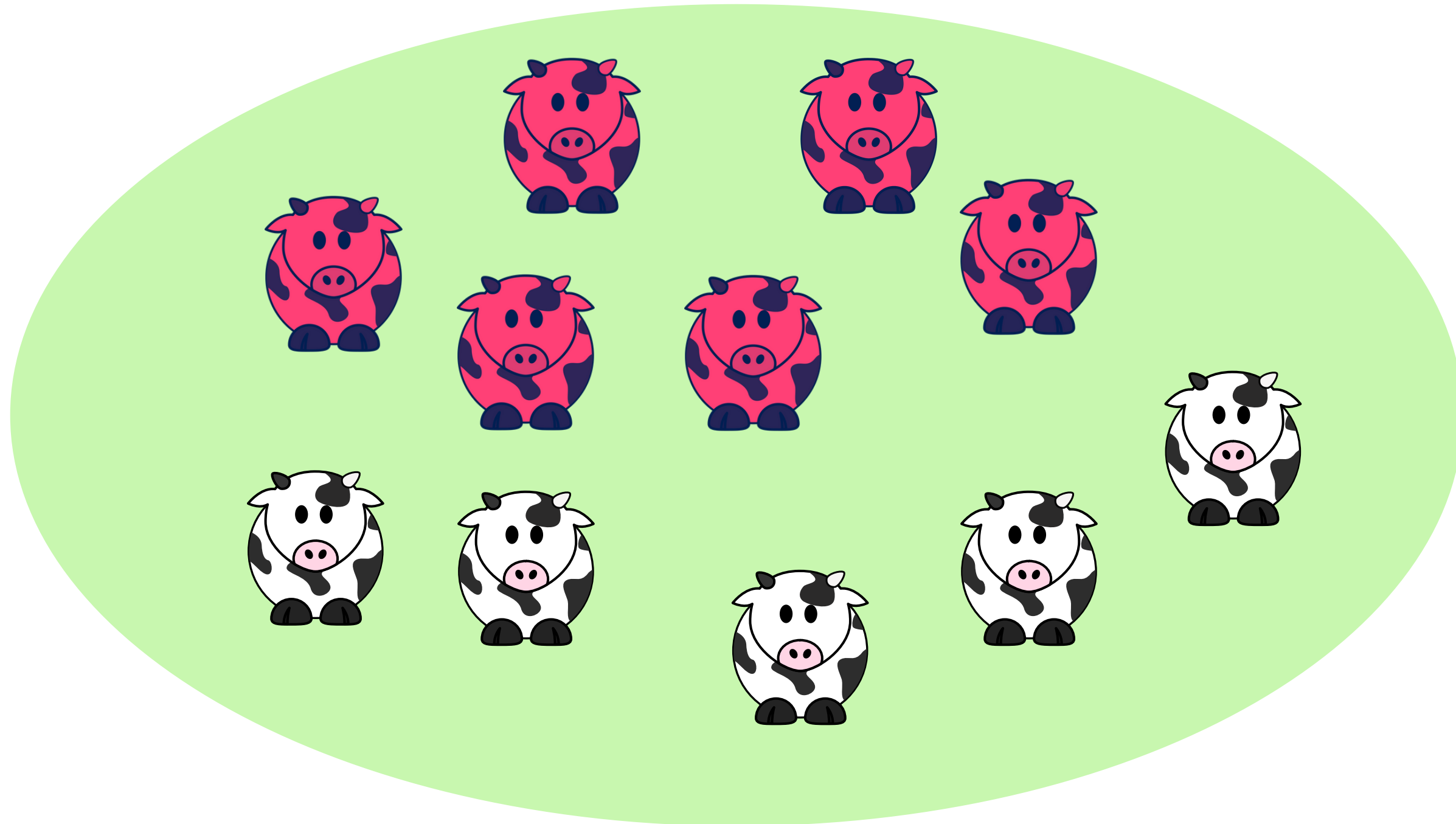
- ρ : Dispersal cost
- z : Number of neighboring patches
- m_S : Dispersal of susceptible individuals
- m_I : Dispersal of infected individuals

Model

Evolution of traits

Evolution of virulence :

- Mortality of the pathogen
- Noted α



Model

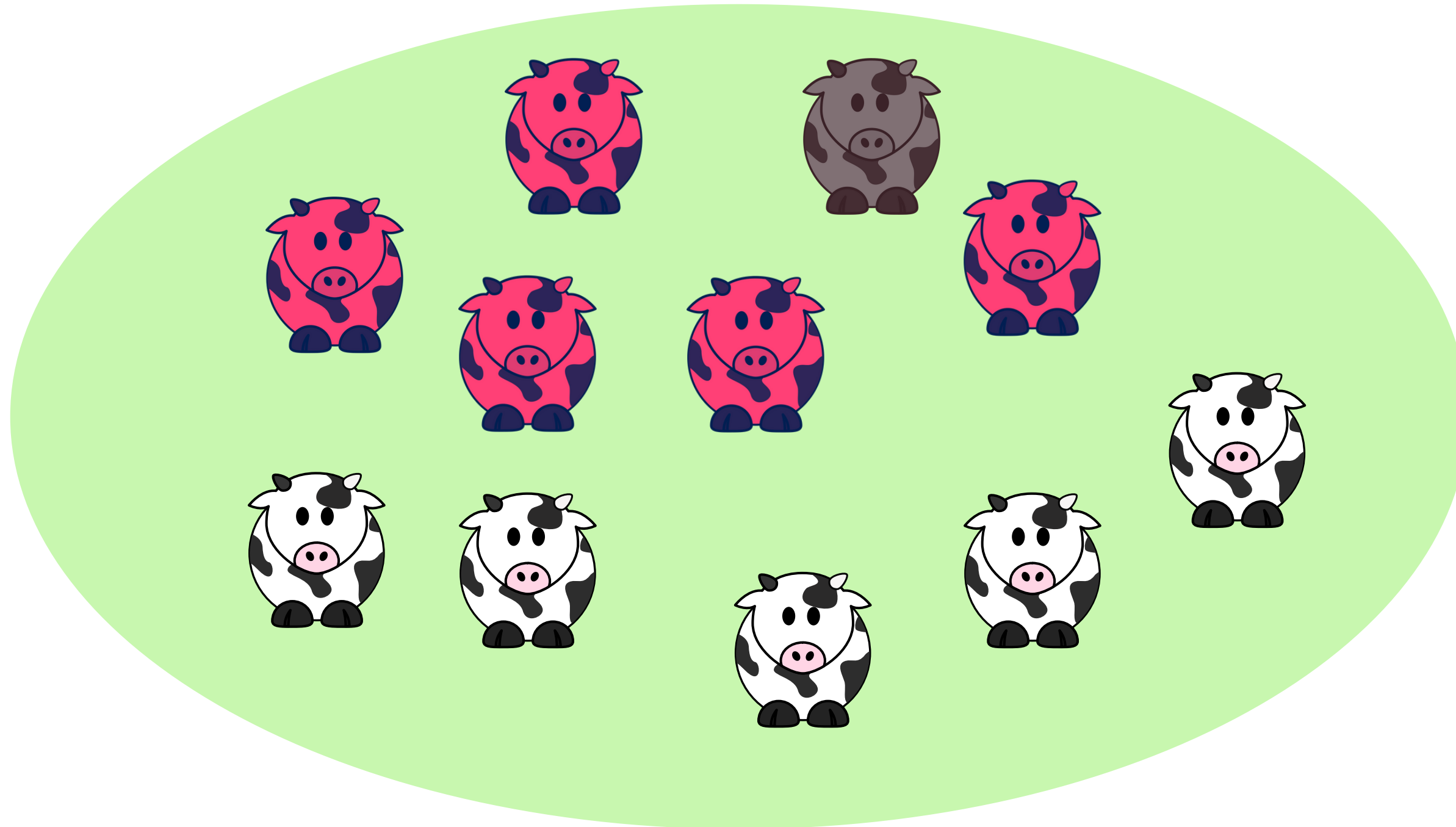
Evolution of traits

Evolution of virulence :

- Mortality of the pathogen
- Noted α

Mutation :

- Rare
- Low effect



Model

Evolution of traits

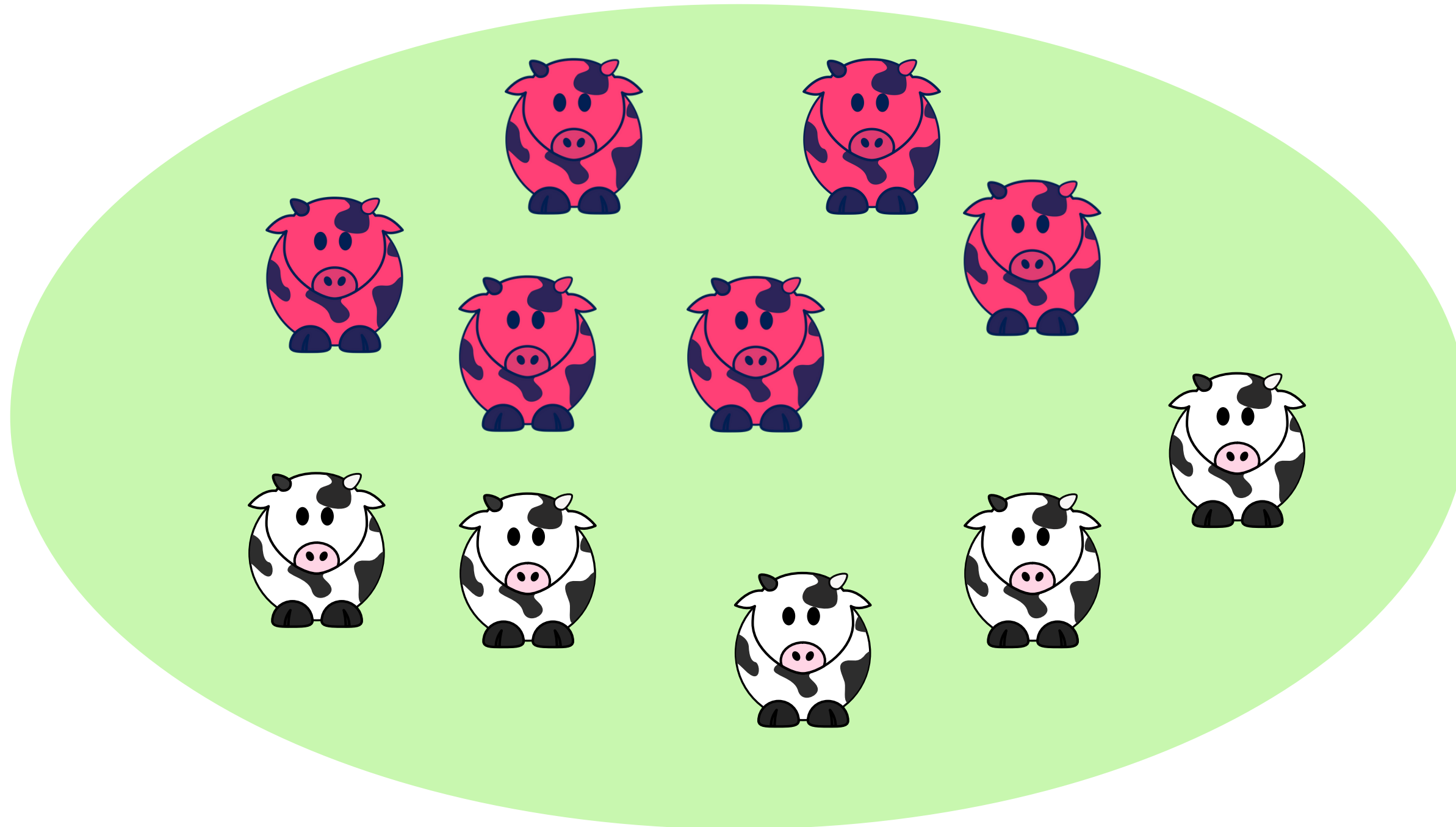
Evolution of virulence :

- Mortality of the pathogen
- Noted α

Mutation :

- Rare
- Low effect

Resident
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Mutant



Dominant
phenotype :



Model

Evolution of traits

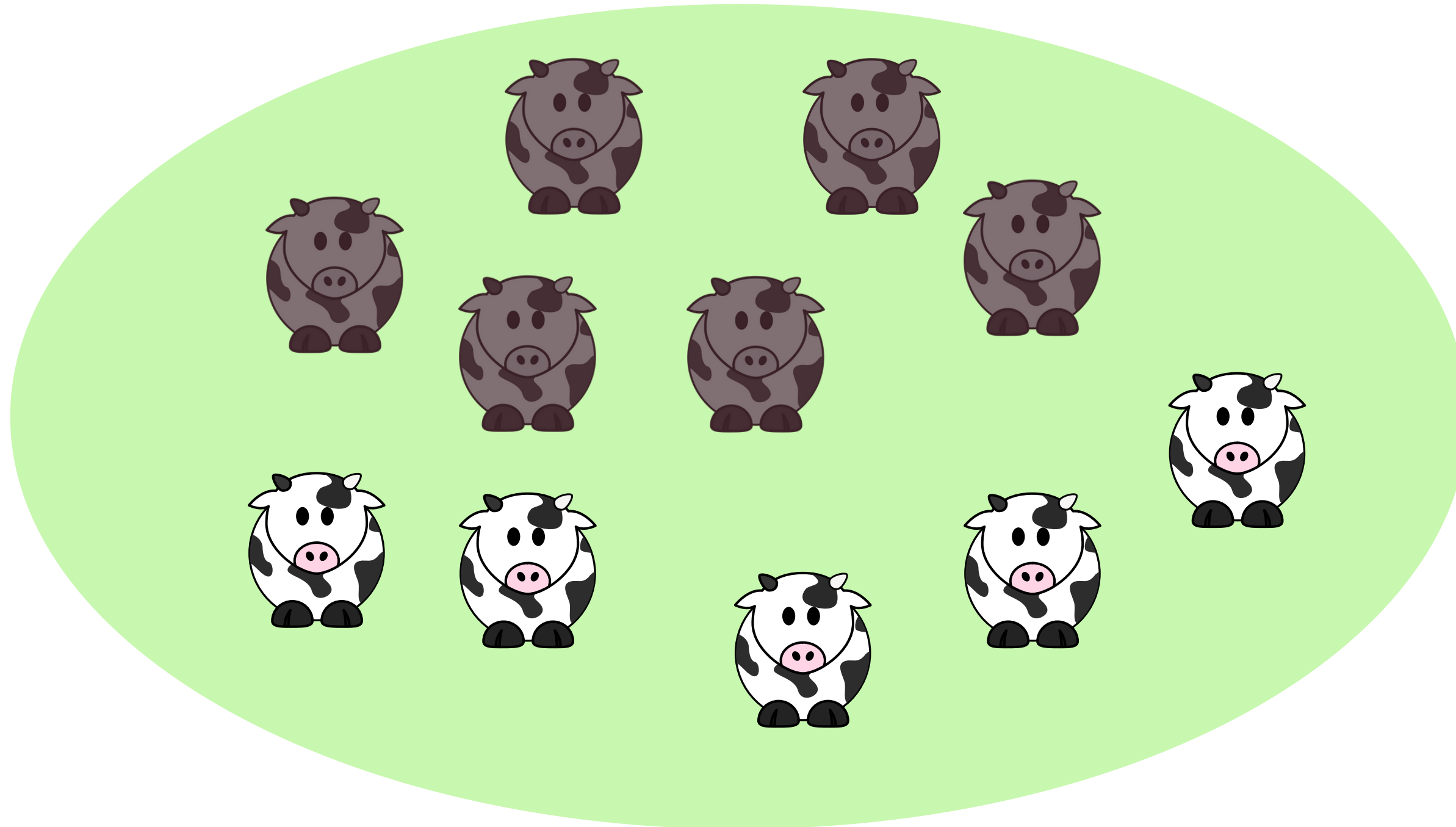
Evolution of virulence :

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Mutation :

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Mutant
>
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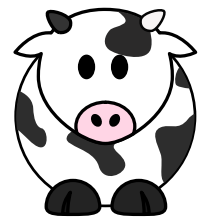


Dominant
phenotype :



Results

Evolution of virulence according to the infected dispersal



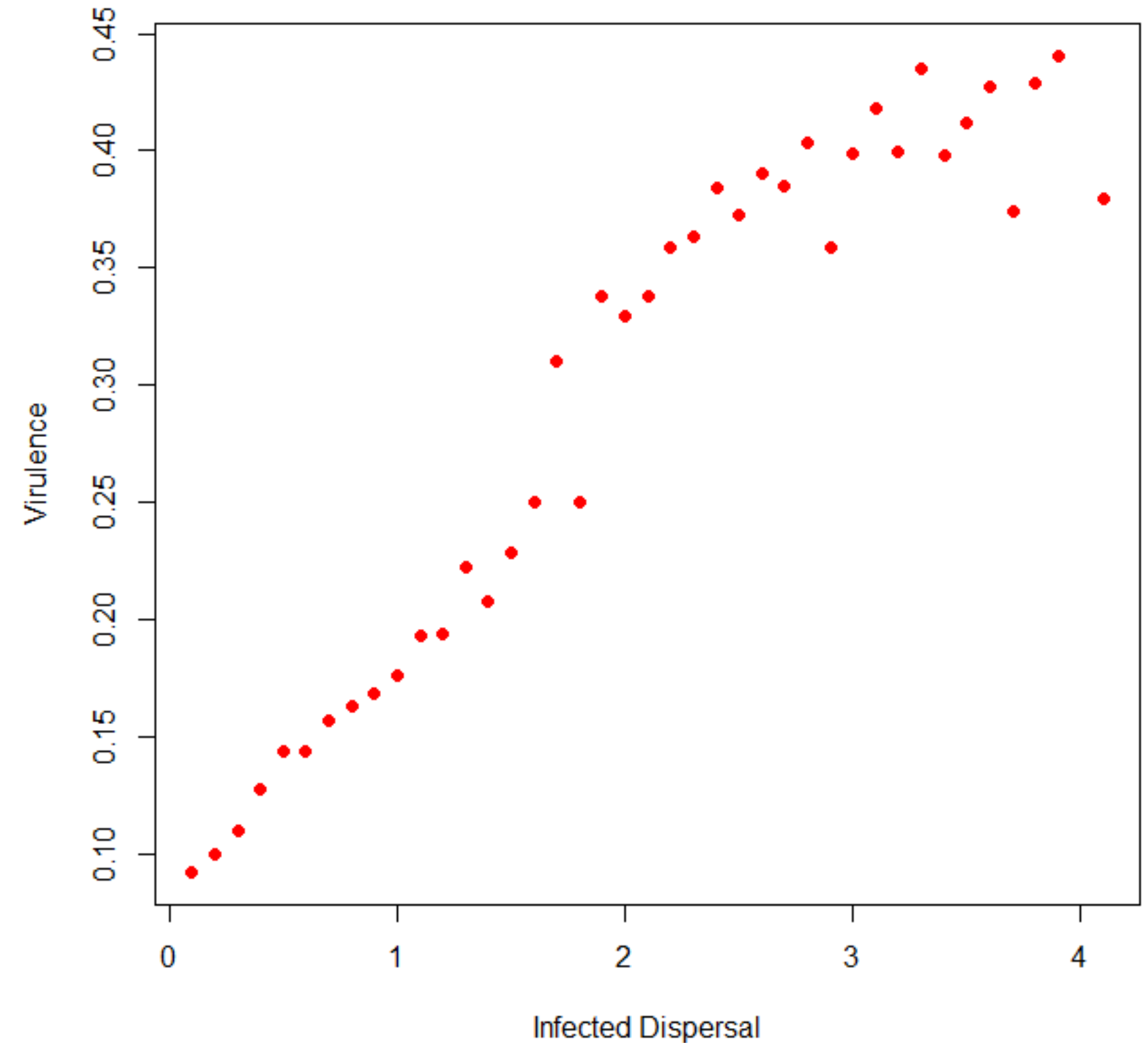
Dispersal value of susceptible hosts

- Fixed at 0.5



Dispersal value of infected hosts

- 0.1 to 4.0



Results

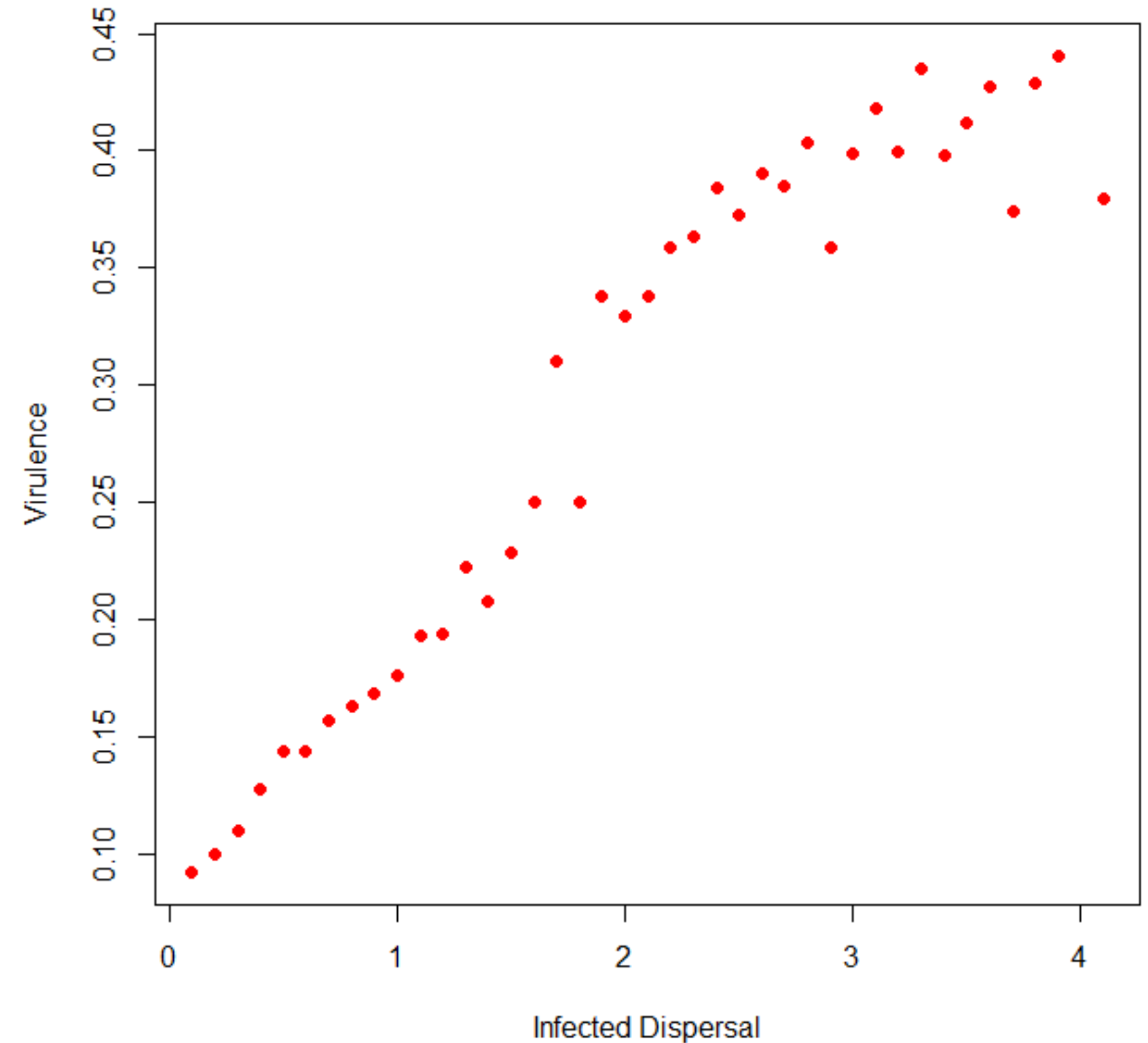
Evolution of virulence according to the infected dispersal

Increase of infected hosts dispersal

➡ Increase of virulence

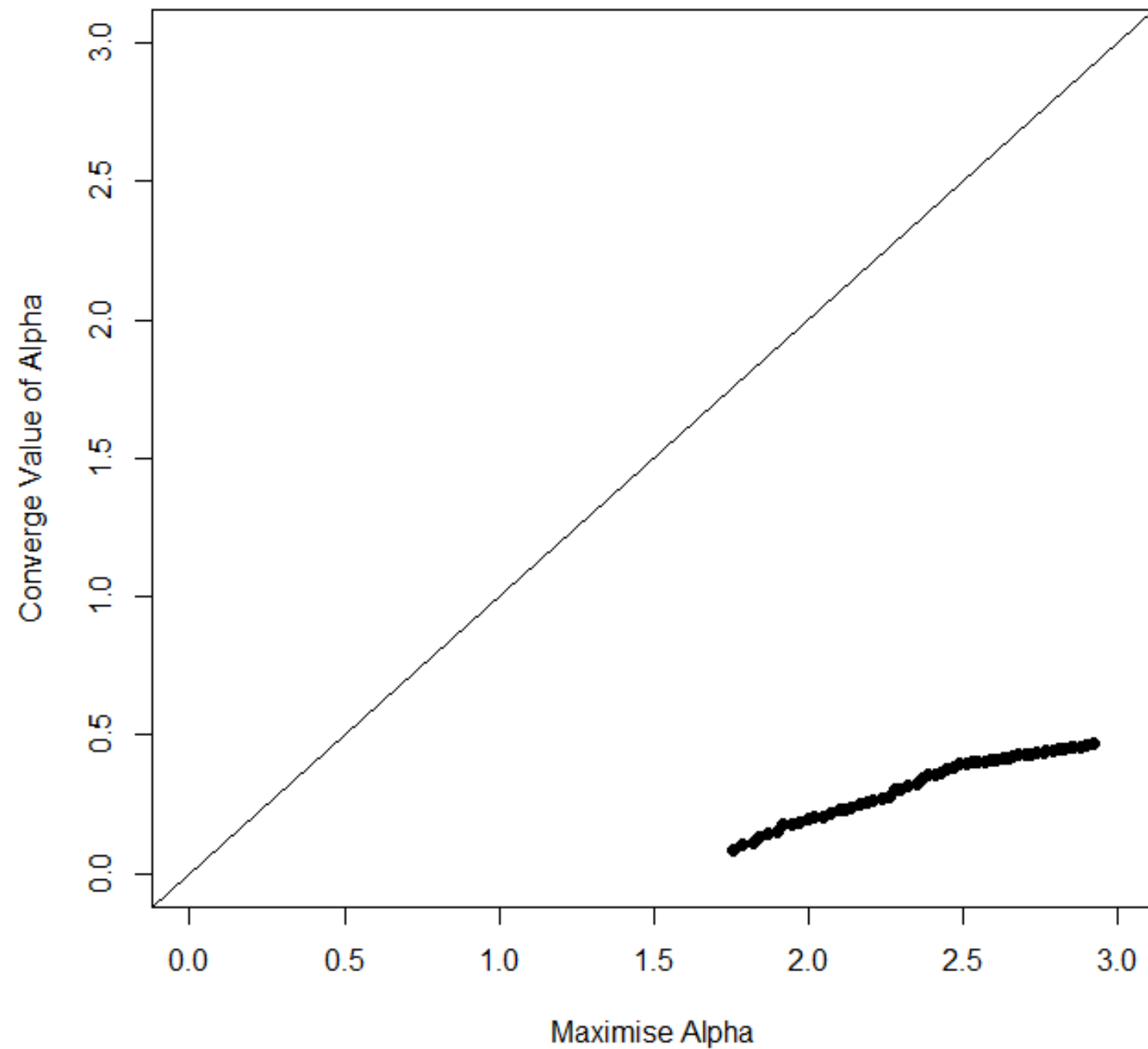
Increase of infected hosts dispersal

➡ More chance of finding patches with many susceptible hosts



Results

Interest of the metapopulation



α obtained with metapopulation

<

α maximise

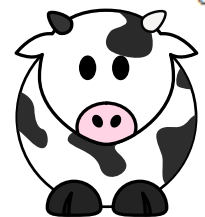
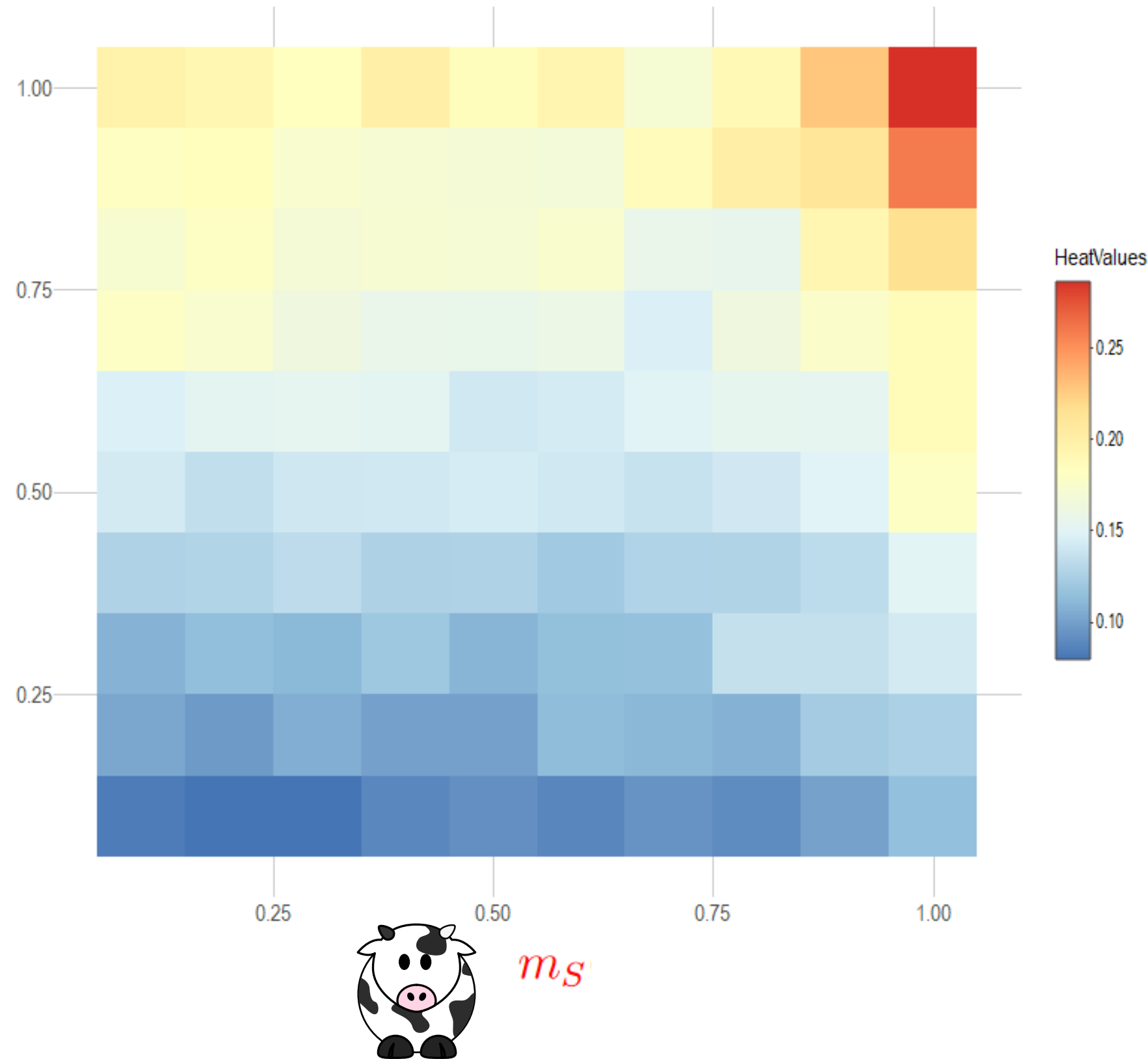
Introduction of a spatial structure

- Alpha evolves towards lower values

Results



m_I

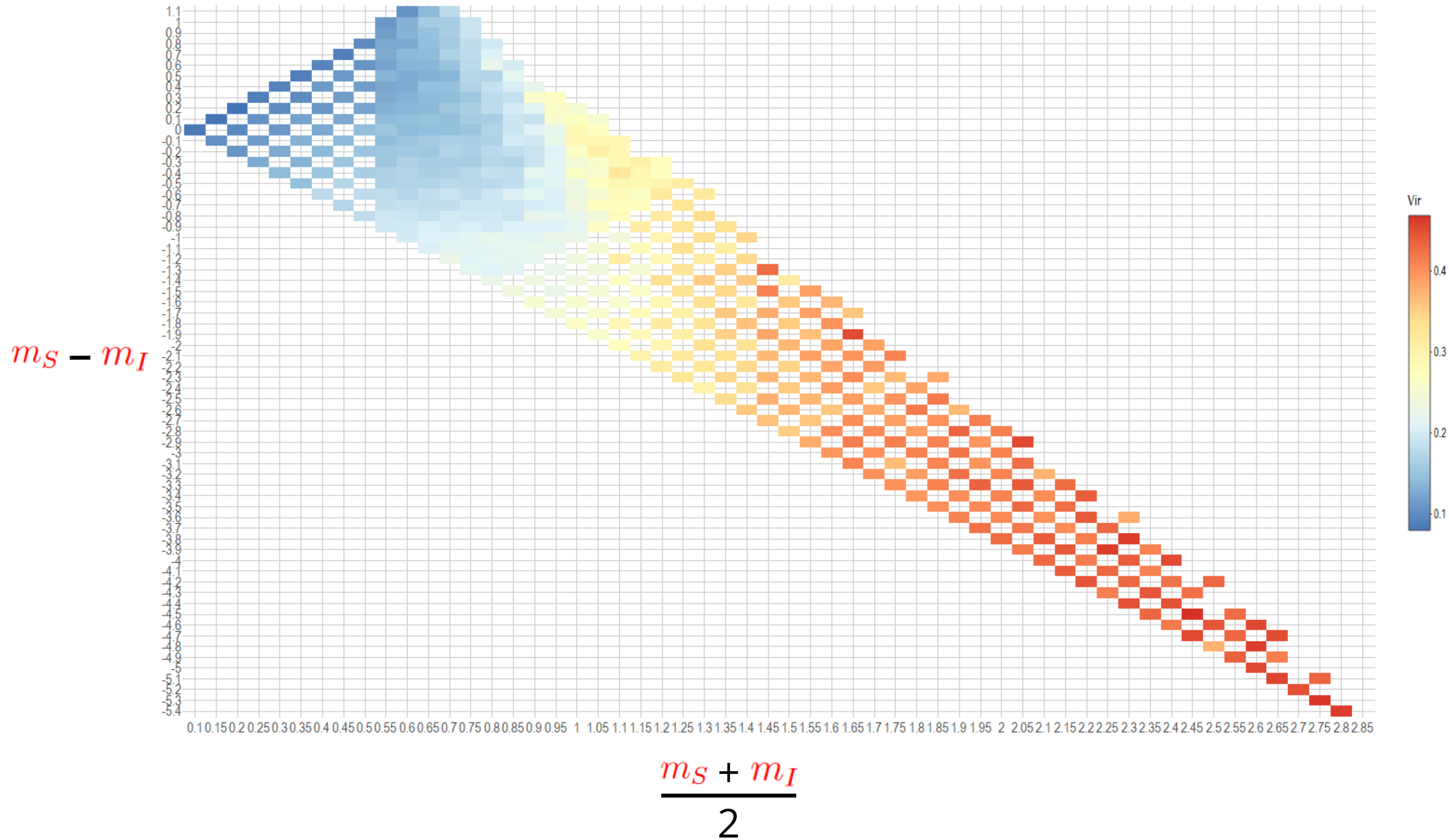


m_S

- Increase in virulence with dispersion of the infected
- Effect of the difference between m_S and m_I ?

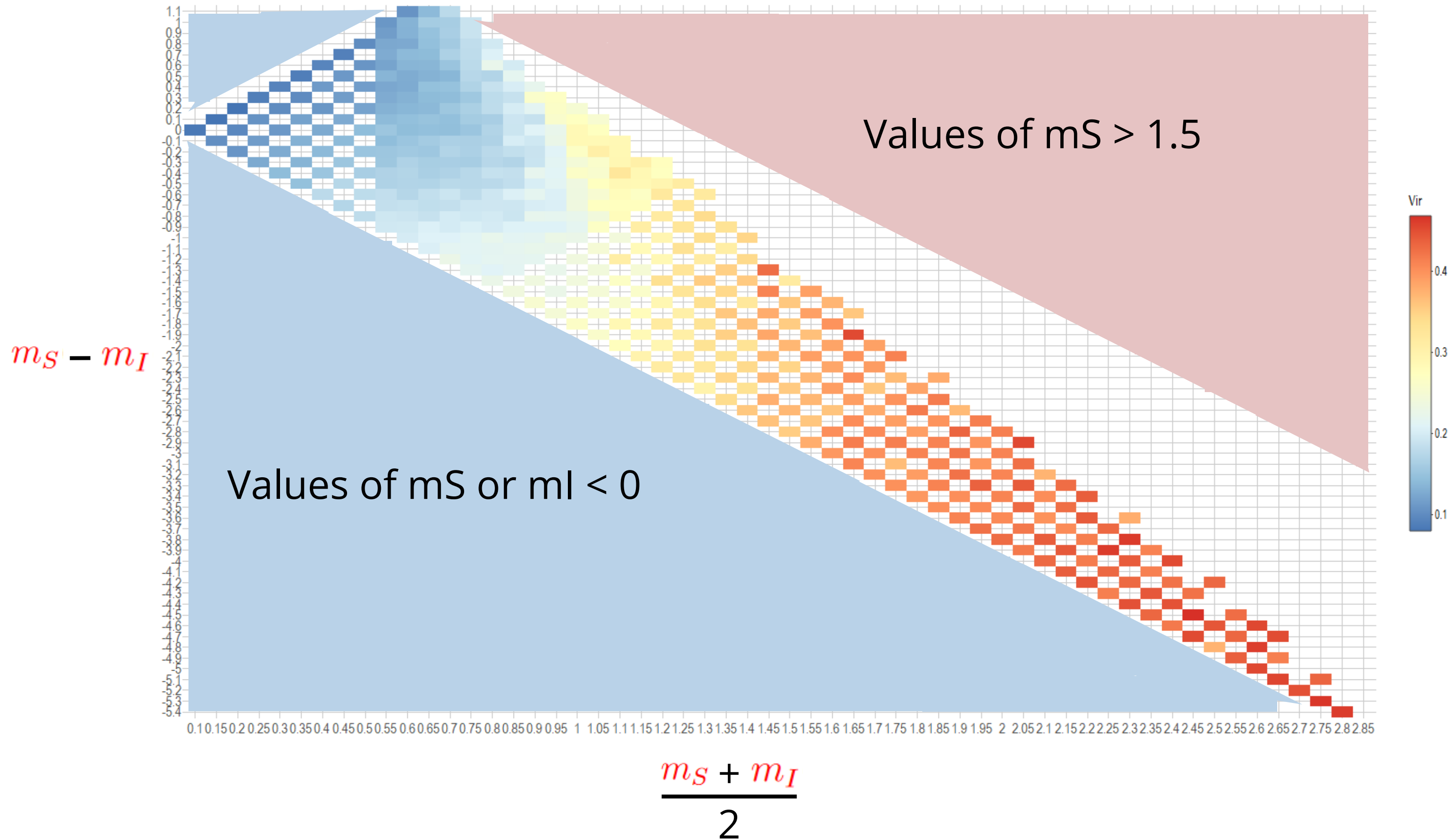
Results

Convergent values of parasite virulence



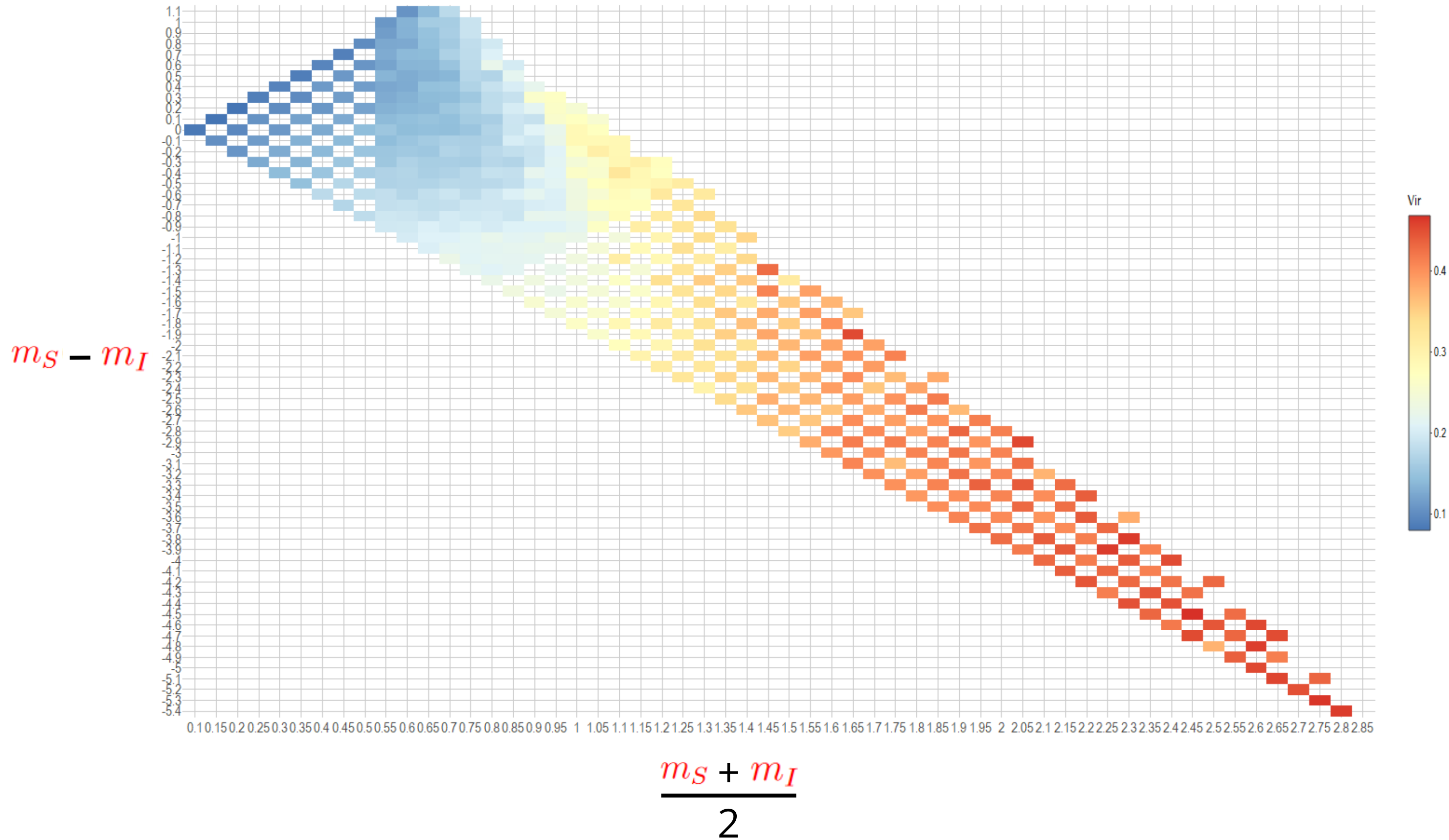
Results

Convergent values of parasite virulence



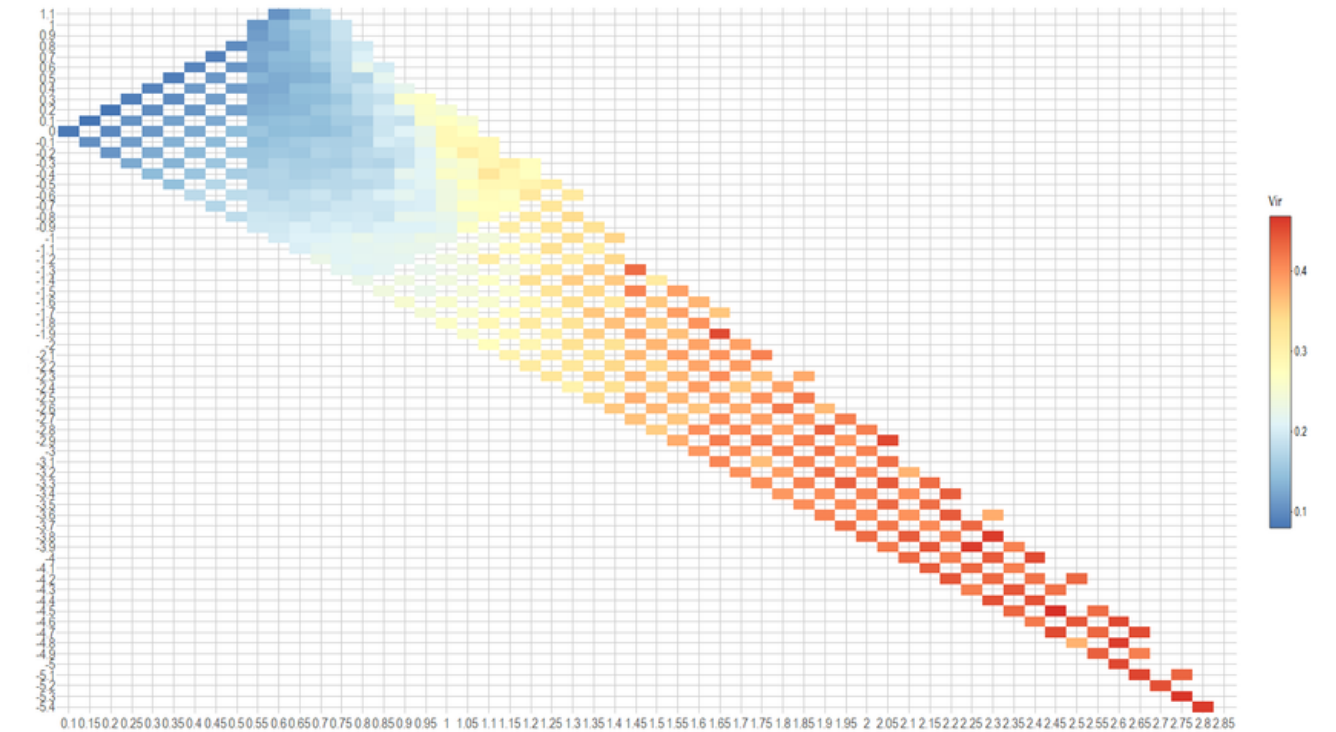
Results

Convergent values of parasite virulence



Results

Convergent values of parasite virulence



$$m_S - m_I$$



- Virulence of the parasite increases
 - More chance of finding patches with many susceptible hosts

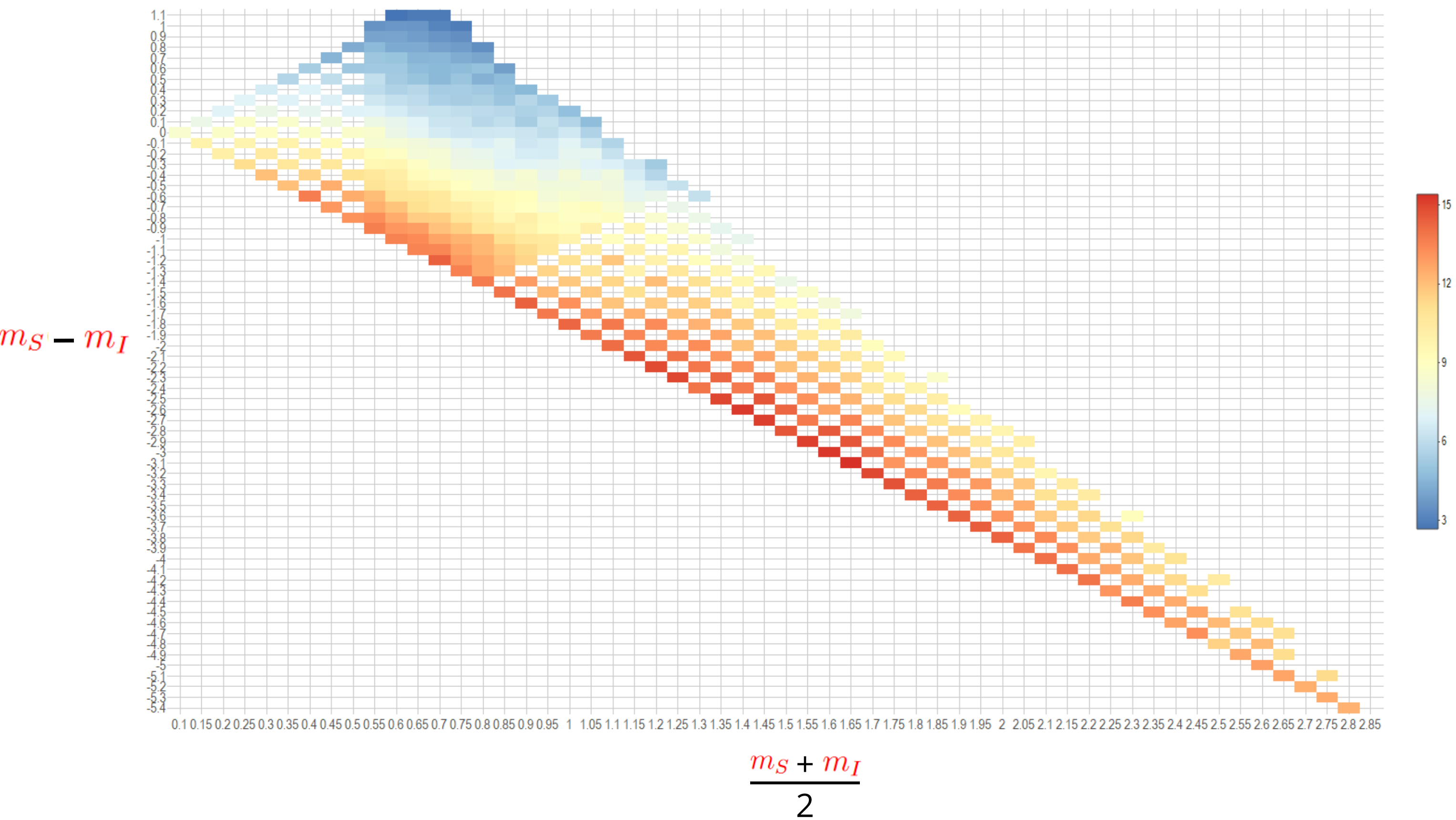
$$\frac{m_S + m_I}{2}$$



- Virulence of the parasite increases
 - More chance of finding empty patches for susceptible individuals
- High values of infected dispersal = Values of virulence reach a limit ?
 - Not enough benefit from the trade off with transmission rate

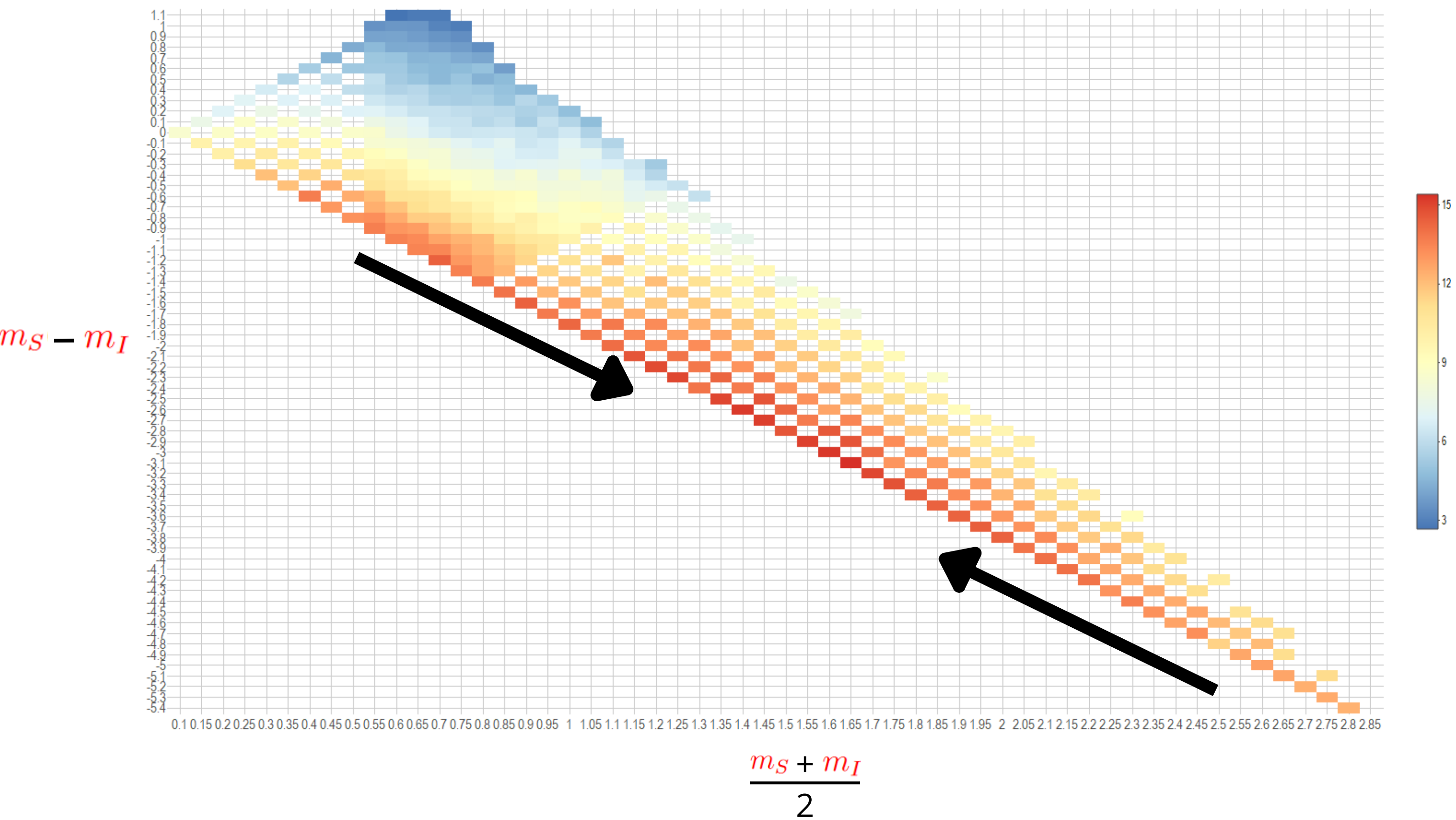
Results

R0 Value



Results

R0 Value

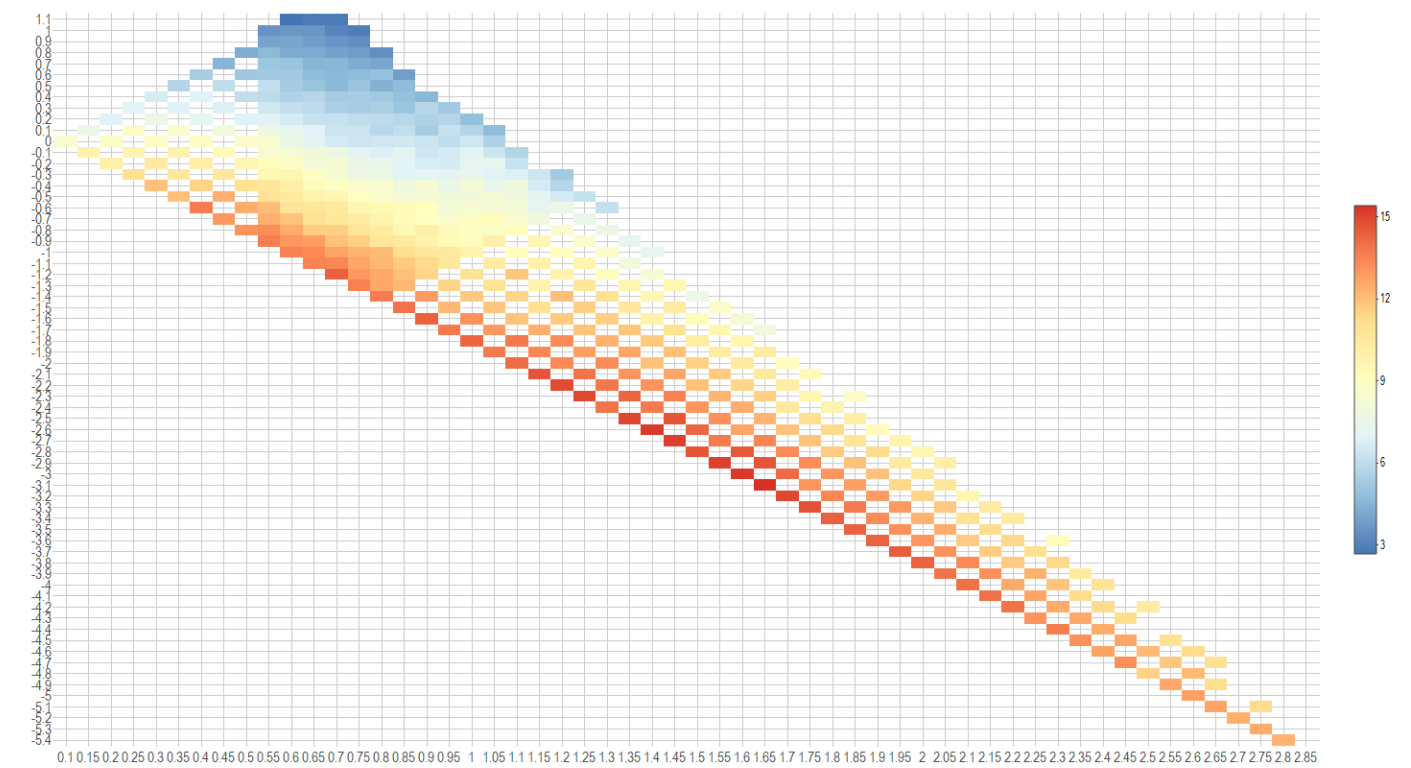


Results

R0 Value

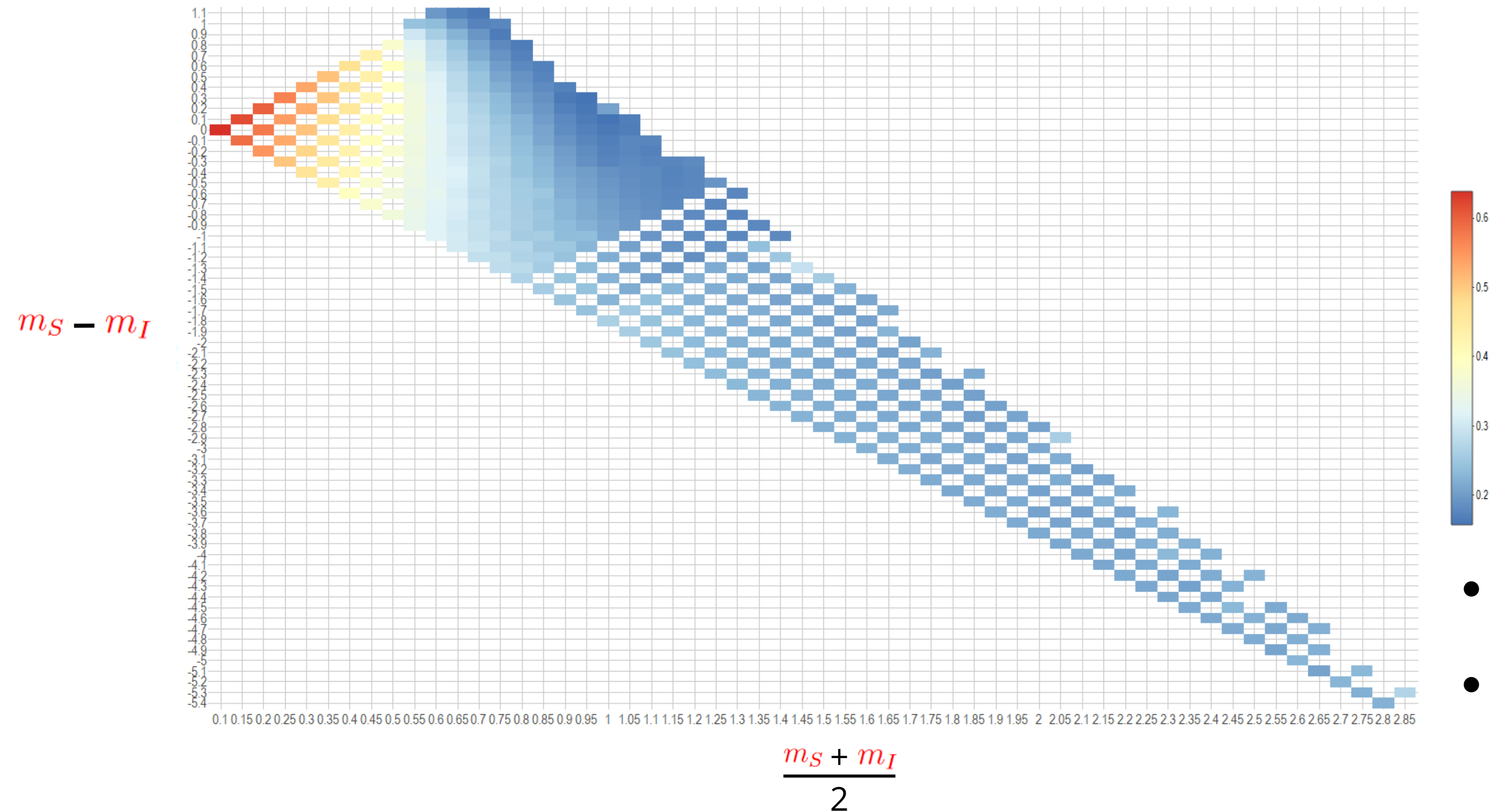
$m_S - m_I$ ↘

- Value of R0 increase
- With small Suceptible dispersal, R0 value has a bell-shaped structure
 - Small Infected dispersal, less transmission for infected
 - High Infected dispersal, Not enough S in patches, less transmission



Results

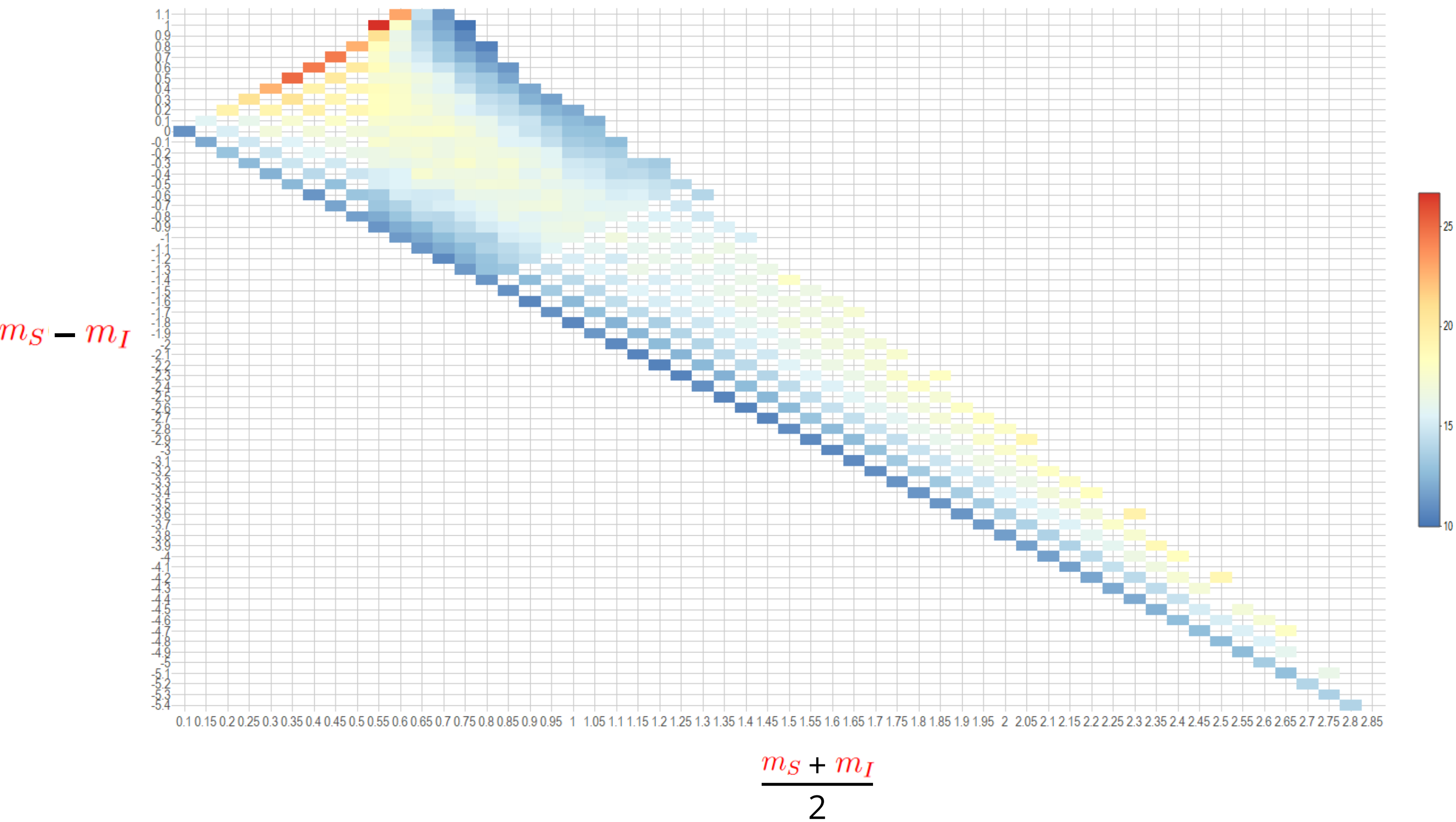
Local prevalence of infected individuals



- Impact of ρ
- Can explain high R_0 and high virulence

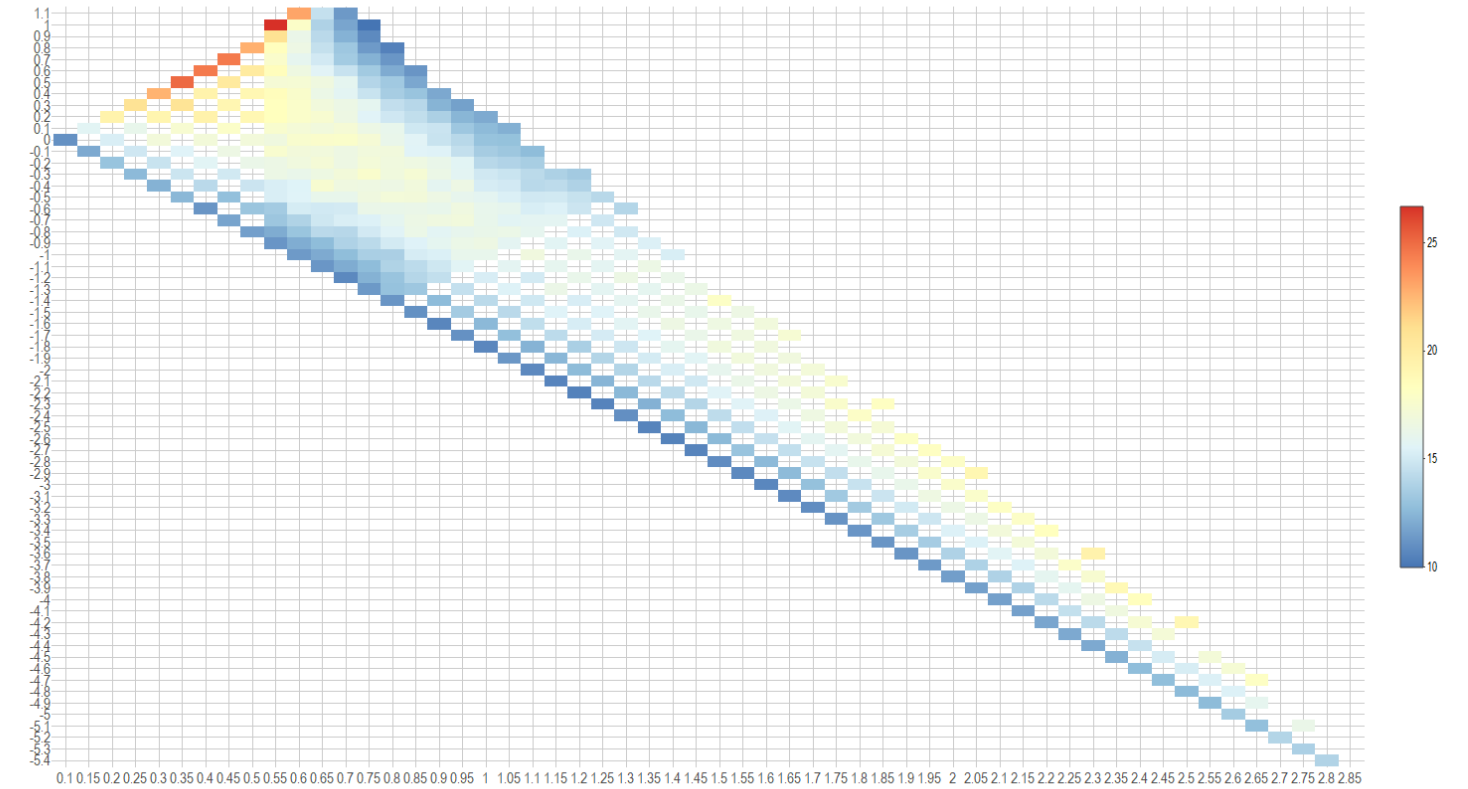
Results

Susceptible individuals colonization



Results

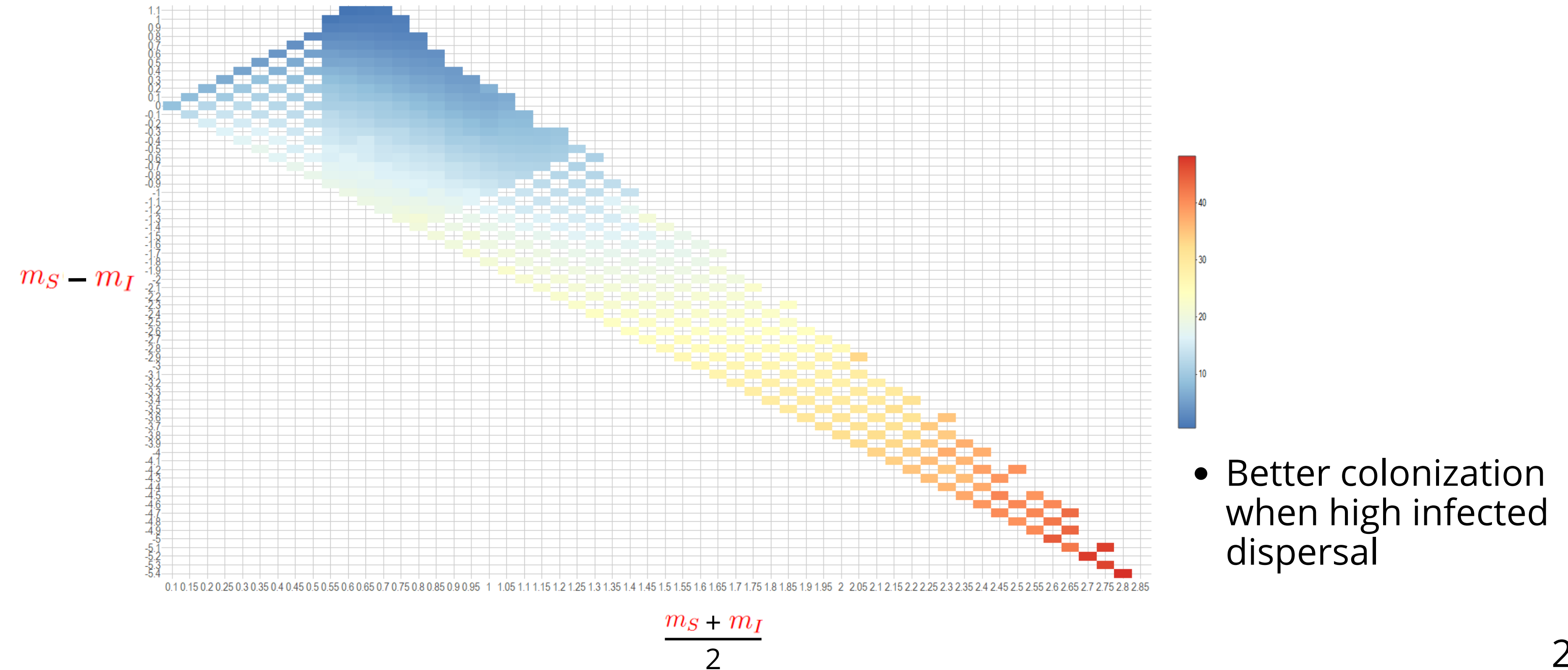
Susceptible individuals colonization



- Optimum of colonization influenced by Susceptible dispersal
- m_S ↘ = Less dispersal for individuals, Fewer colonised patches
- m_S ↗ = All patches occupied with a large population of susceptibles, Less colonisation

Results

Infected individuals colonization



Conclusion

- High Infected dispersal = High values of evolved virulence
- $m_S - m_I \searrow$ = High values of evolved virulence
- Higher infected dispersal not the optimum

Perspectives

Evolution of virulence and Infected dispersal

- Evolution of α and m_I
- Same probability of mutation
- No trade-off between for infected dispersal, like α and β
- What values of infected dispersal will be selected ?

Perspectives

Evolution of virulence and Infected dispersal

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Thank you for
your attention