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> #####
> # Coevolution: approximation to fast social information dynamics & fast parasite evolution #
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> restart :
> with( VectorCalculus ) :
> with( LinearAlgebra ) :
> interface( imaginaryunit = _I ) :
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> # Assume parasite evolves rapidly to maximise R0
> beta := kappa·sqrt(alpha) : # This is the transmission-virulence trade-off we are assuming
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> A := 1 -  $\frac{\sigma}{\tau \cdot c \cdot c}$  :
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> R0 :=  $\frac{\beta \cdot c^2}{(d \cdot (1 - (1 - a) \cdot A) + \alpha + \gamma)}$  :
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> # Fitness gradient for the parasite
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> R0_1 := simplify(diff(R0, alpha));
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$$R0_1 := \frac{(c^2 (a d - \alpha + \gamma) \tau - d \sigma (-1 + a)) \kappa c^4 \tau}{2 \sqrt{\alpha} (c^2 (a d + \alpha + \gamma) \tau - d \sigma (-1 + a))^2} \quad (1)$$

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> # Optimal virulence
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> alpha_ss := simplify(solve(R0_1, alpha));
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$$\alpha_{ss} := \frac{c^2 (a d + \gamma) \tau - d \sigma (-1 + a)}{c^2 \tau} \quad (2)$$

```
> # Optimal transmission
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> beta_ss := subs(alpha = alpha_ss, beta);
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$$\beta_{ss} := \kappa \sqrt{\frac{c^2 (a d + \gamma) \tau - d \sigma (-1 + a)}{c^2 \tau}} \quad (3)$$

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> # Host evolution
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> # First calculate information awareness in mutant when rare (Ams)
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> dSA_m :=  $\frac{cm \cdot c}{N} \cdot (\tau \cdot S U_m \cdot A \cdot N) - \sigma \cdot S A_m$  :
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> dIA_m :=  $\frac{cm \cdot c}{N} \cdot (\tau \cdot I U_m \cdot A \cdot N) - \sigma \cdot I A_m$  :
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> dA_m :=  $\frac{1}{N_m} \cdot \left( \frac{cm \cdot c}{N} \cdot (\tau \cdot (1 - A_m) \cdot N_m \cdot A \cdot N) - \sigma \cdot A_m \cdot N_m \right)$  :
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> Ams := solve(dA_m, A_m);
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$$Ams := \frac{cm (\tau c^2 - \sigma)}{c^2 cm \tau + \sigma c - cm \sigma} \quad (4)$$

>

> # Now calculate resident equilibrium

$$> dS := (b - q \cdot (S + I)) \cdot (S + I) - \frac{\text{beta} \cdot c \cdot c \cdot S \cdot I}{(S + I)} - d \cdot (1 - (1 - a) \cdot A) \cdot S + \text{gamma} \cdot I :$$

$$> dI := \frac{\text{beta} \cdot c \cdot c \cdot S \cdot I}{(S + I)} - (d \cdot (1 - (1 - a) \cdot A) + \text{alpha} + \text{gamma}) \cdot I :$$

$$> dN := (b - q \cdot N) \cdot N - d \cdot (1 - (1 - a) \cdot A) \cdot N - \text{alpha} \cdot I :$$

$$> \text{sol} := \text{solve}([dS, dI], [S, I]) :$$

$$> \text{eq1} := \text{simplify}(\text{sol}[2]) :$$

$$> Ns := \text{simplify}(\text{subs}(\text{eq1}, S + I));$$

$$Ns := \frac{1}{\kappa c^4 \tau q} \left( \alpha^3 |^2 c^2 \tau + (c^2 (a d + \gamma) \tau - d \sigma (-1 + a)) \sqrt{\alpha} + \kappa c^2 (-\tau (a d + \alpha - b) c^2 + d \sigma (-1 + a)) \right) \quad (5)$$

>

> # Mutant dynamics

$$> dSm := (b - q \cdot N) \cdot (Sm + Im) - \frac{\text{beta} \cdot cm \cdot c \cdot Sm \cdot I}{N} - d \cdot (1 - (1 - a) \cdot Ams) \cdot Sm + \text{gamma} \cdot Im :$$

$$> dIm := \frac{\text{beta} \cdot cm \cdot c \cdot Sm \cdot I}{N} - (d \cdot (1 - (1 - a) \cdot Ams) + \text{alpha} + \text{gamma}) \cdot Im :$$

>

> # Calculate the Jacobian

$$> J := (\text{Jacobian}([dSm, dIm], [Sm, Im]));$$

$$J := \begin{bmatrix} -q N + b - \frac{\kappa \sqrt{\alpha} cm c I}{N} - d \left( 1 - \frac{(1 - a) cm (\tau c^2 - \sigma)}{c^2 cm \tau + c \sigma - cm \sigma} \right), -q N + b + \gamma \\ \left[ \frac{\kappa \sqrt{\alpha} cm c I}{N}, -d \left( 1 - \frac{(1 - a) cm (\tau c^2 - \sigma)}{c^2 cm \tau + c \sigma - cm \sigma} \right) - \alpha - \gamma \right] \end{bmatrix} \quad (6)$$

>

> # Split the Jacobian into components F and V as follows

$$> F := \langle (b - q \cdot N, 0) | (b - q \cdot N, 0) \rangle ;$$

$$F := \begin{bmatrix} -q N + b & -q N + b \\ 0 & 0 \end{bmatrix} \quad (7)$$

$$> V := F - J;$$

$$V := \begin{bmatrix} \left[ \frac{\kappa \sqrt{\alpha} cm c I}{N} + d \left( 1 - \frac{(1 - a) cm (\tau c^2 - \sigma)}{c^2 cm \tau + c \sigma - cm \sigma} \right), -\gamma \right] \end{bmatrix} \quad (8)$$

$$\left[ -\frac{\kappa \sqrt{\alpha} cm c I}{N}, d \left( 1 - \frac{(1-a) cm (\tau c^2 - \sigma)}{c^2 cm \tau + c \sigma - cm \sigma} \right) + \alpha + \gamma \right]$$

> # Now calculate the next-generation matrix

> VI := MatrixInverse(V) :

> NG := simplify(F • VI) :

> # Fitness is equal to the largest eigenvalue of the NG matrix minus 1

> w := simplify(NG[1, 1]) - 1;

$$w := \left( (cm \kappa ((\tau c^2 - \sigma) cm + c \sigma) c I \sqrt{\alpha} + N (-(-\tau c^2 + \sigma) (a d + \alpha + \gamma) cm + \sigma c (\alpha + \gamma + d))) ((\tau c^2 - \sigma) cm + c \sigma) (q N - b) \right) / \left( -cm \kappa ((\tau c^2 - \sigma) cm + c \sigma)^2 c I \alpha^{3/2} + (a (-\tau c^2 + \sigma) cm - c \sigma) (cm \kappa ((\tau c^2 - \sigma) cm + c \sigma) c I \sqrt{\alpha} + N (-(-\tau c^2 + \sigma) (a d + \alpha + \gamma) cm + \sigma c (\alpha + \gamma + d))) d \right) - 1 \quad (9)$$

>

> # Calculate the fitness gradient

> dw0 := simplify(subs(cm = c, diff(w, cm))) :

> dw := simplify(subs(eql, (subs(N = Ns, dw0))));

$$dw := \left( (-\alpha^{3/2} c^2 \tau + (-c^2 (a d + \gamma) \tau + d \sigma (-1 + a)) \sqrt{\alpha} + \kappa c^2 (\tau (a d + \alpha) c^2 - d \sigma (-1 + a))) \left( -\alpha^{3/2} c^8 \kappa \tau^3 - (\tau^2 (a d + \gamma) c^4 - 2 d \tau \sigma (-1 + a) c^2 + d \sigma^2 (-1 + a)) \kappa c^4 \tau \sqrt{\alpha} - d \tau^2 \kappa^2 \sigma (-1 + a) c^8 + ((a d + \alpha + \gamma)^2 \tau^2 + d \kappa^2 \sigma^2 (-1 + a)) \tau c^6 - 3 d \tau^2 \sigma (-1 + a) (a d + \alpha + \gamma) c^4 + 3 \sigma^2 d (-1 + a) \left( \left( a - \frac{2}{3} \right) d + \frac{\alpha}{3} + \frac{\gamma}{3} \right) \tau c^2 - d^2 \sigma^3 (-1 + a)^2 \right) \alpha \right) / \left( (\alpha^{3/2} c^4 \kappa \tau + d \kappa c^2 (a c^2 \tau - \sigma (-1 + a)) \sqrt{\alpha} - (c^2 (a d + \alpha + \gamma) \tau - d \sigma (-1 + a)) \alpha)^2 \kappa c^7 \tau^2 \right) \quad (10)$$

>

> # Calculate evolutionary stability (output hidden for brevity)

> E0 := simplify(subs(cm = c, diff(w, cm, cm))) :

> E := simplify(subs(eql, (subs(N = Ns, E0)))) :

>

>

> # Special case - 1) only information is viable

>

> eql := simplify(sol[1]);

$$eql := \left[ S = \frac{-c^2 (a d - b) \tau + d \sigma (-1 + a)}{c^2 q \tau}, I = 0 \right] \quad (11)$$

>  $Ns := \text{simplify}(\text{subs}(eql, S + I));$

$$Ns := \frac{-c^2 (a d - b) \tau + d \sigma (-1 + a)}{c^2 q \tau} \quad (12)$$

> # Mutant dynamics

>  $dSm := (b - q \cdot S)Sm - d \cdot (1 - (1 - a) \cdot Ams) \cdot Sm :$

>

> # Invasion fitness

>  $w := \text{simplify}\left(\text{subs}\left(eql, \frac{dSm}{Sm}\right)\right);$

$$w := \frac{d \sigma (\tau c^2 - \sigma) (c - cm) (-1 + a)}{\tau c^2 (c^2 cm \tau + c \sigma - cm \sigma)} \quad (13)$$

> # Fitness gradient

>  $dw := \text{simplify}(\text{subs}(cm = c, \text{diff}(w, cm)));$

$$dw := -\frac{d \sigma (\tau c^2 - \sigma) (-1 + a)}{\tau^2 c^5} \quad (14)$$

>

>

> # Special case - 2) only disease is viable

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> restart :

> with(VectorCalculus) :

> with(LinearAlgebra) :

> interface(imaginaryunit = \_I) :

>

> # Assume parasite evolves rapidly to maximise  $R_0$

>  $\text{beta} := \text{kappa} \cdot \text{sqrt}(\text{alpha}) :$  # This is the transmission-virulence trade-off we are assuming

>  $A := 0 :$

$$R_0 := \frac{\text{beta} \cdot c^2}{(d \cdot (1 - (1 - a) \cdot A) + \text{alpha} + \text{gamma})} :$$

>

> # Fitness gradient for the parasite

>  $R0\_1 := \text{simplify}(\text{diff}(R_0, \text{alpha}));$

$$R0\_1 := \frac{\kappa c^2 (-\alpha + \gamma + d)}{2 \sqrt{\alpha} (d + \alpha + \gamma)^2} \quad (15)$$

> # Optimal virulence

>  $\text{alpha\_ss} := \text{simplify}(\text{solve}(R0\_1, \text{alpha}));$

$$\text{alpha\_ss} := \gamma + d \quad (16)$$

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> # Optimal transmission
> beta_ss := subs(alpha = alpha_ss, beta);

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$$beta\_ss := \kappa \sqrt{\gamma + d} \quad (17)$$

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>
> # Host evolution
> Ams := 0 :
>
> # Now calculate resident equilibrium
> dS := (b - q*(S + I))*(S + I) - \frac{beta \cdot c \cdot c \cdot S \cdot I}{(S + I)} - d \cdot (1 - (1 - a) \cdot A) \cdot S + gamma \cdot I :
> dI := \frac{beta \cdot c \cdot c \cdot S \cdot I}{(S + I)} - (d \cdot (1 - (1 - a) \cdot A) + alpha + gamma) \cdot I :
> dN := (b - q \cdot N) \cdot N - d \cdot (1 - (1 - a) \cdot A) \cdot N - alpha \cdot I :
> sol := solve([dS, dI], [S, I]) :
> eql := simplify(sol[2]) :
> Ns := simplify(subs(eql, S + I));

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$$Ns := \frac{\alpha^{3/2} + (\gamma + d) \sqrt{\alpha} + (b - d - \alpha) c^2 \kappa}{\kappa c^2 q} \quad (18)$$

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>
> # Mutant dynamics
> dSm := (b - q \cdot N) \cdot (Sm + Im) - \frac{beta \cdot cm \cdot c \cdot Sm \cdot I}{N} - d \cdot (1 - (1 - a) \cdot Ams) \cdot Sm + gamma
    \cdot Im :
> dIm := \frac{beta \cdot cm \cdot c \cdot Sm \cdot I}{N} - (d \cdot (1 - (1 - a) \cdot Ams) + alpha + gamma) \cdot Im :
>
> # Calculate Jacobian
> J := (Jacobian([dSm, dIm], [Sm, Im]));

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$$J := \begin{bmatrix} -qN + b - \frac{\kappa \sqrt{\alpha} cm c I}{N} - d & -qN + b + \gamma \\ \frac{\kappa \sqrt{\alpha} cm c I}{N} & -d - \alpha - \gamma \end{bmatrix} \quad (19)$$

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> # Split the Jacobian into components F and V as follows
> F := <<b - q \cdot N, 0>>|<b - q \cdot N, 0>>;

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$$F := \begin{bmatrix} -qN + b & -qN + b \\ 0 & 0 \end{bmatrix} \quad (20)$$

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> V := F - J;

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$$V := \begin{bmatrix} \frac{\kappa \sqrt{\alpha} c m c I}{N} + d & -\gamma \\ -\frac{\kappa \sqrt{\alpha} c m c I}{N} & d + \alpha + \gamma \end{bmatrix} \quad (21)$$

> # Now calculate the next-generation matrix

>  $V1 := \text{MatrixInverse}(V) :$

>  $NG := \text{simplify}(F \cdot V1) :$

>

> # Fitness is equal to the largest eigenvalue of the NG matrix minus 1

>  $w := \text{simplify}(NG[1, 1]) - 1;$

$$w := -\frac{\left(\kappa \sqrt{\alpha} c m c I + N(d + \alpha + \gamma)\right)(q N - b)}{I \alpha^{3/2} c m \kappa + d \left(\kappa \sqrt{\alpha} c m c I + N(d + \alpha + \gamma)\right)} - 1 \quad (22)$$

> # Calculate the fitness gradient

>  $dw0 := \text{simplify}(\text{subs}(cm = c, \text{diff}(w, cm))) :$

>  $dw := \text{simplify}(\text{subs}(eq1, (\text{subs}(N = Ns, dw0))));$

$dw :=$  (23)

$$-\frac{\left(\kappa \sqrt{\alpha} c^2 - \gamma - \alpha - d\right) \alpha (d + \alpha + \gamma) \left(-\alpha^{3/2} + (-d - \gamma) \sqrt{\alpha} + c^2 \kappa (d + \alpha)\right)}{\kappa c^3 \left(\alpha^{3/2} c^2 \kappa + \sqrt{\alpha} c^2 d \kappa - \alpha (d + \alpha + \gamma)\right)^2}$$

>

> # Calculate evolutionary stability

>  $E0 := \text{simplify}(\text{subs}(cm = c, \text{diff}(w, cm, cm))) :$

>  $E := \text{simplify}(\text{subs}(eq1, (\text{subs}(N = Ns, E0))));$

$$E := \left(2 \left(\kappa \sqrt{\alpha} c^2 - \gamma - \alpha - d\right)^2 \alpha (d + \alpha + \gamma) \left(-\alpha^{3/2} + (-d - \gamma) \sqrt{\alpha} + c^2 \kappa (d + \alpha)\right) (d + \alpha)\right) / \left(\kappa c^4 \left(\alpha^{3/2} c^2 \kappa + \sqrt{\alpha} c^2 d \kappa - \alpha (d + \alpha + \gamma)\right)^3\right) \quad (24)$$

>

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