Clancey et al. Mechanistic Model (STOPPP)

SIR Model with Waning Antibodies and Waning Immunity

N is the total population size, S is the number of susceptible individuals, I is the number of infected individuals, I is the number of seropositive and recovered individuals, and I is the number of seronegative and recovered individuals.

```
In[1]:= \dot{\mathbf{N}} = \dot{\mathbf{S}} + \dot{\mathbf{I}} + \dot{\mathbf{R}}\dot{\mathbf{A}} + \dot{\mathbf{R}}\dot{\mathbf{T}}

Out[1]:= \dot{\mathbf{R}}\dot{\mathbf{A}} + \dot{\mathbf{R}}\dot{\mathbf{T}} + \dot{\mathbf{S}} + \dot{\mathbf{I}}

In[2]:= \dot{\mathbf{S}} = \mathbf{b} \, \mathbf{N} - \boldsymbol{\beta} \, \mathbf{S} \, \mathbf{I} - \mathbf{S} \, (\boldsymbol{\mu} + \mathbf{k} \, \mathbf{N}) + \boldsymbol{\omega}_{\mathbf{T}} \, \mathbf{R} \mathbf{T}

Out[2]:= -\mathbf{S} \, \boldsymbol{\beta} \, \mathbf{I} + \mathbf{b} \, \mathbf{N} - \mathbf{S} \, (\boldsymbol{\mu} + \mathbf{k} \, \mathbf{N}) + \mathbf{R} \mathbf{T} \, \boldsymbol{\omega}_{\mathbf{T}}

In[3]:= \dot{\mathbf{I}} = \boldsymbol{\beta} \, \mathbf{S} \, \mathbf{I} - \boldsymbol{\gamma} \, \mathbf{I} - \mathbf{I} \, (\boldsymbol{\mu} + \mathbf{k} \, \mathbf{N})

out[3]:= \mathbf{S} \, \boldsymbol{\beta} \, \mathbf{I} - \boldsymbol{\gamma} \, \mathbf{I} - \mathbf{I} \, (\boldsymbol{\mu} + \mathbf{k} \, \mathbf{N})

In[4]:= \dot{\mathbf{R}}\dot{\mathbf{A}} = \boldsymbol{\gamma} \, \mathbf{I} - \mathbf{R} \mathbf{A} \, (\boldsymbol{\mu} + \mathbf{k} \, \mathbf{N}) - \boldsymbol{\omega}_{\mathbf{A}} \, \mathbf{R} \mathbf{A}

Out[4]:= \dot{\mathbf{R}}\dot{\mathbf{T}} = \boldsymbol{\omega}_{\mathbf{A}} \, \mathbf{R} \mathbf{A} - \mathbf{R} \mathbf{T} \, (\boldsymbol{\mu} + \mathbf{k} \, \mathbf{N}) - \boldsymbol{\omega}_{\mathbf{T}} \, \mathbf{R} \mathbf{T}

Out[5]:= \dot{\mathbf{R}}\dot{\mathbf{T}} = \boldsymbol{\omega}_{\mathbf{A}} \, \mathbf{R} \mathbf{A} - \mathbf{R} \mathbf{T} \, (\boldsymbol{\mu} + \mathbf{k} \, \mathbf{N}) - \boldsymbol{\omega}_{\mathbf{T}} \, \mathbf{R} \mathbf{T}

Out[5]:= -\mathbf{R}\mathbf{T} \, (\boldsymbol{\mu} + \mathbf{k} \, \mathbf{N}) + \mathbf{R} \mathbf{A} \, \boldsymbol{\omega}_{\mathbf{A}} - \mathbf{R} \mathbf{T} \, \boldsymbol{\omega}_{\mathbf{T}}
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Equilibria and \mathcal{R}_0

Disease Free Equilibria (DFE)

```
\begin{array}{ll} & \text{In}[6]:=& \dot{\mathbf{N}} = \text{FullSimplify} \left[ \dot{\mathbf{S}} + \dot{\mathbf{I}} + \dot{\mathbf{R}} \dot{\mathbf{A}} + \dot{\mathbf{R}} \dot{\mathbf{T}} \right] \text{ /. } \left\{ \text{RA} + \text{RT} + \mathbf{S} + \mathbf{I} \rightarrow \mathbf{N} \right\} \\ & \text{Out}[6]:=& \mathbf{b} \ \mathbf{N} - \mathbf{N} \ (\mu + \mathbf{k} \ \mathbf{N}) \\ & \text{In}[7]:=& \text{Solve} \left[ \dot{\mathbf{N}} == \mathbf{0}, \ \mathbf{N} \right] \\ & \text{Out}[7]:=& \left\{ \left\{ \mathbf{N} \rightarrow \mathbf{0} \right\}, \ \left\{ \mathbf{N} \rightarrow \frac{\mathbf{b} - \mu}{\mathbf{k}} \right\} \right\} \end{array}
```

$$\begin{aligned} & \text{In}[8] &= & \text{Solve} \left[\left(\dot{S} \ / . \ \left\{ E \rightarrow \emptyset, \ I \rightarrow \emptyset, \ RA \rightarrow \emptyset, \ RT \rightarrow \emptyset \right\} \right) \ == \ \emptyset, \ S \right] \ / . \ \left\{ N \rightarrow \frac{b - \mu}{k} \right\} \end{aligned}$$

$$& \text{Out}[8] &= \ \left\{ \left\{ S \rightarrow \frac{b - \mu}{k} \right\} \right\}$$

$$& \text{In}[9] &= \ DFE \ = \ \left\{ S \rightarrow \frac{b - \mu}{k} \right\}, \ E \rightarrow \emptyset, \ I \rightarrow \emptyset, \ RA \rightarrow \emptyset, \ RT \rightarrow \emptyset \right\};$$

Pathogen Present Equilibria

$$\begin{aligned} & \text{In[10]:=} \quad \text{FullSimplify} \Big[\text{Solve} \Big[\Big\{ \emptyset = \dot{S}, \ \emptyset = \dot{I}, \ \emptyset = \dot{R}\dot{A}, \ \emptyset = \dot{R}\dot{T} \Big\}, \ \{ S, \ I, \ RA, \ RT \} \Big] \ /. \ \Big\{ N \rightarrow \frac{b - \mu}{k} \Big\} \Big] \\ & \text{Out[10]:=} \\ & \left\{ \Big\{ S \rightarrow \frac{b - \mu}{k}, \ I \rightarrow \emptyset, \ RA \rightarrow \emptyset, \ RT \rightarrow \emptyset \Big\}, \ \Big\{ S \rightarrow \frac{b + \gamma}{\beta}, \ I \rightarrow -\frac{(b \ (k - \beta) + k \ \gamma + \beta \ \mu) \ (b + \omega_{A}) \ (b + \omega_{T})}{k \ \beta \ ((b + \gamma) \ (b + \omega_{T}) + \omega_{A} \ (b + \gamma + \omega_{T}))} \right\} \\ & \text{RA} \rightarrow -\frac{\gamma \ (b \ (k - \beta) + k \ \gamma + \beta \ \mu) \ (b + \omega_{T})}{k \ \beta \ ((b + \gamma) \ (b + \omega_{T}) + \omega_{A} \ (b + \gamma + \omega_{T}))} \right\} \Big\} \end{aligned}$$

Calculate \mathcal{R}_0 using the Next Generation Method (NGM)

Build vectors \mathcal{F} and \mathcal{V} to linearize the infection subsystem

 $\mathcal F$ represents the rate of appearance of new infections in compartment i, $\mathcal V_i^*(x)$ represents the rate of transfer of individuals into compartment i by all other means, and $\mathcal{V}_i^-(x)$ represents the rate of transfer of individuals out of compartment i, where $\mathcal{V}_i(x) = \mathcal{V}_i^-(x)$. The infected compartments $x = \{1\}$ and the non-infected compartments are y={S,RA,RT}. Thus, this can be written as $\frac{dx}{dt} = \mathcal{F}(x) - \mathcal{V}(x)$.

$$In[11]:= \mathcal{F} = \{\beta \, \mathbf{S} \, \mathbf{I} \}$$

$$Out[11]:= \{\mathbf{S} \, \beta \, \mathbf{I} \}$$

$$In[12]:= \mathcal{V} = -\{-\gamma \, \mathbf{I} \, -\mathbf{I} \, (\mu + \mathbf{k} \, \mathbf{N}) \}$$

$$Out[12]:= \{\gamma \, \mathbf{I} + \mathbf{I} \, (\mu + \mathbf{k} \, \mathbf{N}) \}$$

Find the Jacobian of \mathcal{F} and \mathcal{V} around the DFE

$$In[13]:=$$
 F = Grad[\mathcal{F} , {I}]
Out[13]=
 $\{\{S \beta\}\}$

Out[14]=

$$\Big\{\Big\{\frac{\beta\ (b-\mu)}{k}\Big\}\Big\}$$

In[15]:= MatrixForm[Fdfe]

Out[15]//MatrixForm=

$$\left(\begin{array}{c} \beta \left(b-\mu\right) \\ \mathbf{k} \end{array}\right)$$

$$In[16]:= V = Grad[V, \{I\}]$$

Out[16]=

$$\{\,\{\gamma+\mu+\mathbf{k}\,\mathbb{N}\,\}\,\}$$

Out[17]=

$$\{ \{ \gamma + \mu + \mathbf{k} \, \mathbb{N} \} \}$$

In[18]:= MatrixForm[Vdfe]

Out[18]//MatrixForm=

$$(\gamma + \mu + \mathbf{k} N)$$

Take the inverse of $\mathcal V$

Vinverse = Inverse[Vdfe] In[19]:=

Out[19]=

$$\left\{ \left\{ \frac{1}{\gamma + \mu + k \, \mathrm{N}} \right\} \right\}$$

In[20]:= MatrixForm[Vinverse]

Out[20]//MatrixForm=

$$\left(\begin{array}{c} \mathbf{1} \\ \gamma + \mu + \mathbf{k} \ \mathbf{N} \end{array}\right)$$

Out[21]=

$$\left\{ \left\{ \frac{\beta \ (\mathsf{b} - \mu)}{\mathsf{k} \ (\gamma + \mu + \mathsf{k} \ \mathbb{N})} \right\} \right\}$$

In[22]:= MatrixForm[FVinverse]

Out[22]//MatrixForm=

$$\left(\begin{array}{c} \beta \ (\mathbf{b}-\mu) \\ \hline \mathbf{k} \ (\gamma+\mu+\mathbf{k} \ \mathbb{N}) \end{array}\right)$$

Find the dominant eigen value of $\mathcal{F} \mathcal{V}^{-1}$ to find \mathcal{R}_0

FullSimplify[Eigenvalues[FVinverse]] In[23]:=

Out[23]=

$$\left\{ \frac{\beta (\mathbf{b} - \mu)}{\mathbf{k} (\gamma + \mu + \mathbf{k} N)} \right\}$$

In[24]:=
$$\mathbf{R0} = \frac{\beta (\mathbf{b} - \mu)}{\mathbf{k} (\mathbf{b} + \gamma)}$$
Out[24]=
$$\frac{\beta (\mathbf{b} - \mu)}{\mathbf{k} (\mathbf{b} + \gamma)}$$

Solution for I as a Function of R_A

Solution for I for the Mechanistic Model in Counts

```
\hat{i}(t) = \frac{R_A (\mu + k N + \omega_A) + \dot{R_A}}{\gamma}
           bfunc = g Exp[-s Cos[\pift-\psi]^2]
 In[25]:=
Out[25]=
            e^{-s \cos[f \pi t - \psi]^2} \varrho
           bPars = \{g \rightarrow 0.004441452, s \rightarrow 4, f \rightarrow 2 / 365, \psi \rightarrow 1\}
Out[26]=
            \left\{ g \to 0.00444145, \ s \to 4, \ f \to \frac{2}{365}, \ \psi \to 1 \right\}
           bave = N[Integrate[bfunc /. bPars, {t, 0, 365}]] / 365
 In[27]:=
Out[27]=
           0.00137022
           plottime = 365 * 3
 In[28]:=
Out[28]=
           1095
           Pars = {b \rightarrow bfunc /. bPars, \beta \rightarrow .0006, \gamma \rightarrow 1 / 10,
 In[29]:=
                 \mu \rightarrow 1 / 1095, k \rightarrow (1 / 730 – 1 / 1095) / 1000, \omega_{A} \rightarrow 1 / 90, \omega_{T} \rightarrow 1 / 365};
```

```
ROPlot = Plot[{R0 /. Pars}, {t, 0, plottime}]
 In[30]:=
Out[30]=
           40
           30
           20
           10
                          200
                                       400
                                                    600
                                                                  800
                                                                               1000
 ln[31]:= Sol1 = NDSolve[{S'[t] == b (S[t] + I[t] + RA[t] + RT[t]) -
                    \beta S [t] \times I[t] - S[t] (\mu + k (S[t] + I[t] + RA[t] + RT[t])) + \omega<sub>T</sub> RT[t],
                 \text{I'[t]} = \beta \, \text{S[t]} \times \text{I[t]} - \gamma \, \text{I[t]} - \text{I[t]} \, (\mu + k \, (\text{S[t]} + \text{I[t]} + \text{RA[t]} + \text{RT[t]})),
                 RA'[t] = \gamma I[t] - RA[t] (\mu + k (S[t] + I[t] + RA[t] + RT[t])) - \omega_A RA[t],
                 RT'[t] == \omega_A RA[t] - RT[t] (\mu + k (S[t] + I[t] + RA[t] + RT[t])) - \omega_T RT[t],
                 S[0] = 999, I[0] = 1, RA[0] = 0, RT[0] = 0 /. Pars,
              {S[t], I[t], RA[t], RT[t]}, {t, 0, plottime}]
Out[31]=
                                                                      Domain: {{0., 1100.}}
          \left\{\left\{S[t] \rightarrow InterpolatingFunction\right\}\right\}
                                                                      Output: scalar
                                                                       Domain: {{0., 1100.}}
                                                           Output: scalar
             I[t] \rightarrow InterpolatingFunction
                                                                        Domain: {{0., 1100.}}
             RA[t] → InterpolatingFunction
                                                                                                [t],
                                                                        Output: scalar
             \mathsf{RT}\,[\,\mathtt{t}\,] \,\,\to\, \mathsf{InterpolatingFunction}\, \boxed{\;\;\; \blacksquare \,\, \bigwedge^{\mathsf{MM}} \,\,\, \mathsf{Domain:}\, \{\!\{0,\,1100.\}\!\}}
                                                                                               |[t]}}
                                                                        Output: scalar
```

Plot[{S[t] /. Sol1, I[t] /. Sol1, RA[t] /. Sol1, RT[t] /. Sol1}, $\{t, 0, plottime\}, PlotLegends \rightarrow \{"S", "I", "R_A", "R_T"\},$ PlotStyle → {Black, Orange, Blue, Gray}, AxesLabel → {Days, N}] Out[32]= Ν 1000 800 600 400 200 Days 800 1000 In[33]:= IPred = $\frac{1}{\gamma}$ (D[RA[t] /. Sol1, t] + $(\omega_A + \mu + k ((S[t] /. Sol1) + (I[t] /. Sol1) + (RA[t] /. Sol1) + (RT[t] /. Sol1)))$ **RA**[t] /. **Sol1**) /. Pars Out[33]= ${ \left\{ \left\{ { 10} \right. \left. \left| { { InterpolatingFunction} } \right. \right. \right\} }$ InterpolatingFunction 📳 Domain: {{0., 1100.}} Output: scalar InterpolatingFunction Domain: {{0., 1100.}} Output: scalar InterpolatingFunction InterpolatingFunction Domain: {{0., 1100.}} Output: scalar InterpolatingFunction Domain: {{0., 1100.}} Output: scalar

Pred = Plot [{IPred /. Sol1}, {t, 0, plottime}, PlotStyle \rightarrow {Blue, Dashed}, ${\tt PlotRange} \rightarrow {\tt All, AxesLabel} \rightarrow \{{\tt Days, I}\}, \ {\tt PlotLegends} \rightarrow \left\{ "\hat{\tt I}" \right\} \ \right]$

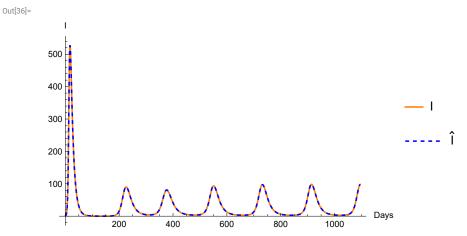
500 400 300 200 100

TRUE = Plot[$\{I[t] /. Soll\}$, $\{t, 0, plottime\}$, PlotRange \rightarrow All, $PlotStyle \rightarrow \{Orange\}, AxesLabel \rightarrow \{Days, I\}, PlotLegends \rightarrow \{"I"\}]$

Out[35]= 500 400 300 200 100

Show[TRUE, Pred] In[36]:=

Out[34]=



Solution for I for the Mechanistic Model in Proportions

N is the total population size, s is the number of susceptible individuals, / is the number of infected individuals, r_A is the number of seropositive and recovered individuals, and r_T is the number of seronegative and recovered individuals.

Change of Variables (COV) from Counts to Proportions using the quotient rule

$$\begin{split} &\inf_{[37]^{\pm}} \quad \dot{\mathbf{s}} = \text{FullSimplify} \Big[\text{FullSimplify} \Big[\frac{\dot{\mathbf{s}} \, \mathbf{N} - \dot{\mathbf{N}} \, \mathbf{S}}{\mathbf{N}^2} \Big] \; /. \; \left\{ \mathbf{S} \rightarrow \mathbf{s} \, \mathbf{N}, \, \mathbf{I} \rightarrow \iota \, \mathbf{N}, \, \mathbf{RA} \rightarrow \mathbf{rA} \, \mathbf{N}, \, \mathbf{RT} \rightarrow \mathbf{rT} \, \mathbf{N} \right\} \Big] \\ & \text{Dut}_{[37]^{\pm}} \\ & \text{Dut}_{[38]^{\pm}} \quad \dot{\iota} = \text{FullSimplify} \Big[\text{FullSimplify} \Big[\frac{\dot{\mathbf{i}} \, \mathbf{N} - \dot{\mathbf{N}} \, \mathbf{I}}{\mathbf{N}^2} \Big] \; /. \; \left\{ \mathbf{S} \rightarrow \mathbf{s} \, \mathbf{N}, \, \mathbf{I} \rightarrow \iota \, \mathbf{N}, \, \mathbf{RA} \rightarrow \mathbf{rA} \, \mathbf{N}, \, \mathbf{RT} \rightarrow \mathbf{rT} \, \mathbf{N} \right\} \Big] \\ & \text{Out}_{[38]^{\pm}} \\ & - \iota \quad (\mathbf{b} + \gamma - \mathbf{s} \, \beta \, \mathbf{N}) \\ & \text{In}_{[39]^{\pm}} \quad \dot{\mathbf{rA}} = \text{FullSimplify} \Big[\text{FullSimplify} \Big[\frac{\dot{\mathbf{RA}} \, \mathbf{N} - \dot{\mathbf{N}} \, \mathbf{RA}}{\mathbf{N}^2} \Big] \; /. \; \left\{ \mathbf{S} \rightarrow \mathbf{s} \, \mathbf{N}, \, \mathbf{I} \rightarrow \iota \, \mathbf{N}, \, \mathbf{RA} \rightarrow \mathbf{rA} \, \mathbf{N}, \, \mathbf{RT} \rightarrow \mathbf{rT} \, \mathbf{N} \right\} \Big] \\ & \text{Out}_{[39]^{\pm}} \quad \dot{\mathbf{rT}} = \text{FullSimplify} \Big[\text{FullSimplify} \Big[\frac{\dot{\mathbf{RT}} \, \mathbf{N} - \dot{\mathbf{N}} \, \mathbf{RT}}{\mathbf{N}^2} \Big] \; /. \; \left\{ \mathbf{S} \rightarrow \mathbf{s} \, \mathbf{N}, \, \mathbf{I} \rightarrow \iota \, \mathbf{N}, \, \mathbf{RA} \rightarrow \mathbf{rA} \, \mathbf{N}, \, \mathbf{RT} \rightarrow \mathbf{rT} \, \mathbf{N} \right\} \Big] \\ & \text{Out}_{[40]^{\pm}} \quad \dot{\mathbf{rA}} = \mathbf{rT} \; (\mathbf{b} + \omega_{\mathsf{T}}) \\ & \text{In}_{[41]^{\pm}} = \mathbf{FullSimplify} \Big[\dot{\mathbf{S}} + \dot{\iota} + \dot{\mathbf{rA}} + \dot{\mathbf{rT}} \Big] \; /. \; \left\{ \mathbf{rA} + \mathbf{rT} + \mathbf{s} + \iota \rightarrow \mathbf{1} \right\} \\ & \text{Out}_{[41]^{\pm}} = \mathbf{RA} = \mathbf{rT} \; (\mathbf{b} + \mathbf{c}) \\ & \text{Out}_{[41]^{\pm}} = \mathbf{RA} = \mathbf{rT} \; (\mathbf{c}) + \mathbf{c} + \mathbf{$$

Check Proportion (COV) Solution Equals Count Solution

```
In[42]:= Sol2 =
          NDSolve[{s'[t] == b - bs[t] - s[t] \beta \iota[t] \times N[t] + rT[t] \omega_T, \iota'[t] == -\iota[t] (b+\gamma-s[t] \beta N[t]),
              rA'[t] = \gamma L[t] - rA[t] (b + \omega_A), rT'[t] = rA[t] \omega_A - rT[t] (b + \omega_T),
              N'[t] = bN[t] - N[t] (\mu + kN[t]), N[0] = 1000, S[0] = 999/N[0],
              L[0] = 1/N[0], rA[0] = 0/N[0], rT[0] = 0/N[0] /. Pars,
           {s[t], ι[t], rA[t], rT[t], N[t]}, {t, 0, plottime}]
Out[42]=
                                                           Domain: {{0., 1100.}}
        \{\{s[t] \rightarrow InterpolatingFunction | \}\}
                                                            Domain: {{0., 1100.}}
                                                   Output: scalar
           \iota [t] \rightarrow InterpolatingFunction
                                                             Domain: {{0., 1100.}}
                                                    Output: scalar
           rA[t] → InterpolatingFunction
                                                    Domain: {{0., 1100.}}
           \texttt{rT[t]} \to \texttt{InterpolatingFunction}
                                                             Output: scalar
                                                           Domain: {{0., 1100.}}
           N[t] \rightarrow InterpolatingFunction
                                                           Output: scalar
        COVPlot = Plot[\{s[t] /. Sol2, \iota[t] /. Sol2, rA[t] /. Sol2, rT[t] /. Sol2\}, {t, 0, plottime},
           PlotLegends \rightarrow {"s", "\iota", "r_A", "r_T"}, AxesLabel \rightarrow {Days, Proportion}]
Out[43]=
        Proportion
         1.0
         8.0
         0.6
                                                                                 r_A
         0.4
         0.2
                                                                       Days
                     200
                               400
                                          600
                                                    800
                                                              1000
```

0.2

200

400

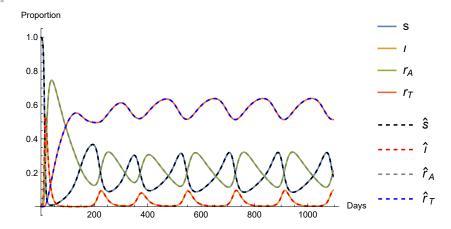
600

800

```
CountSol2 = NDSolve [\{S'[t] == b N[t] - \beta S[t] \times I[t] - S[t] (\mu + k N[t]) + \omega_T RT[t], I'[t] ==
              \beta S[t] \times I[t] - \gamma I[t] - I[t] (\mu + k N[t]), RA'[t] = \gamma I[t] - RA[t] (\mu + k N[t]) - \omega_A RA[t],
             RT'[t] == \omega_A RA[t] - RT[t] (\mu + kN[t]) - \omega_T RT[t], N'[t] == bN[t] - N[t] (\mu + kN[t]),
             N[0] = 1000, S[0] = 999, I[0] = 1, RA[0] = 0, RT[0] = 0} /. Pars,
          {S[t], I[t], RA[t], RT[t], N[t]}, {t, 0, plottime}]
Out[44]=
                                                       Domain: {{0., 1100.}}
        \{\{S[t] \rightarrow InterpolatingFunction \mid \blacksquare\}\}
                                                       Domain: {{0., 1100.}}
          I[t] \rightarrow InterpolatingFunction
                                                        Domain: {{0., 1100.}}
          RA[t] → InterpolatingFunction
                                                        Output: scalar
                                                    ______ Domain: {{0., 1100.}}
          RT[t] \rightarrow InterpolatingFunction
                                                        Output: scalar
                                                       Domain: {{0., 1100.}}
          N[t] \rightarrow InterpolatingFunction
                                                       Output: scalar
 In[45]:= CountPlot =
        \{t, 0, plottime\}, PlotLegends \rightarrow \{"\hat{s}", "\hat{\iota}", "\hat{r}_A", "\hat{r}_T"\}, AxesLabel \rightarrow \{Days, Count / N\},
          PlotStyle → {{Black, Dashed}, {Red, Dashed}, {Gray, Dashed}, {Blue, Dashed}}
Out[45]=
        1.0
       0.8
       0.6
       0.4
```

Show[{COVPlot, CountPlot}] In[46]:=

Out[46]=



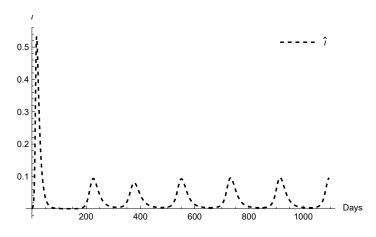
$$\hat{i}(t) = \frac{r_A(b+\omega_A)+\dot{r_A}}{\gamma}$$

$$\label{eq:incomp} \begin{split} & \text{IPredProp = } \frac{\text{D[rA[t] /. Sol2, t] + (rA[t] /. Sol2) (b + \omega_{A})}}{\gamma} \text{ /. Pars} \end{split}$$

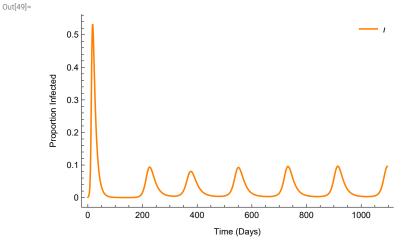
Out[47]=

PredProp = Plot[{IPredProp}, {t, 0, plottime}, PlotStyle → {Black, Dashed}, $PlotRange \rightarrow All, AxesLabel \rightarrow \{Days, \ \iota\}, \ PlotLegends \rightarrow Placed[\{"\hat{\iota}"\}, \ \{Right, Top\}]]$

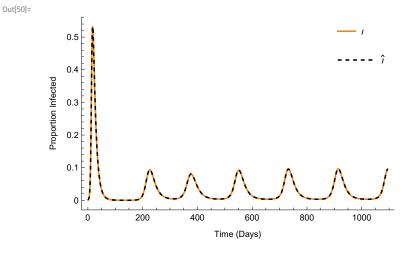
Out[48]=



```
TRUEProp = Plot[\{\iota[t] /. Sol2\}, \{t, 0, plottime\}, PlotRange \rightarrow All,
  PlotStyle → {Orange}, Axes → False, Frame → {{True, False}}, {True, False}},
  FrameLabel → {{"Proportion Infected", None}, {"Time (Days)", None}},
  FrameTicks \rightarrow All, PlotLegends \rightarrow Placed[{"\iota"}, {Right, Top}]]
```



TrueBirth = Show[TRUEProp, PredProp]

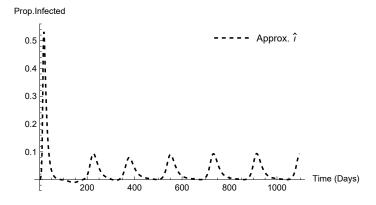


The Solution for $\hat{i}(t)$ can be approximated without the need for b(t) as long as the birth rate at any time point (t) is $<< \omega_a$.

IPredPropapprox =
$$\frac{D[rA[t] /. Sol2, t] + (rA[t] /. Sol2) \omega_A}{\gamma} /. Pars$$
Out[51]=
$$\left\{10 \left(\frac{1}{90} \text{ InterpolatingFunction} \left[\text{Domain: } \{\{0,, 1100.\}\} \right] [t] + \text{InterpolatingFunction} \left[\text{Domain: } \{\{0,, 1100.\}\} \right] [t] \right\}$$

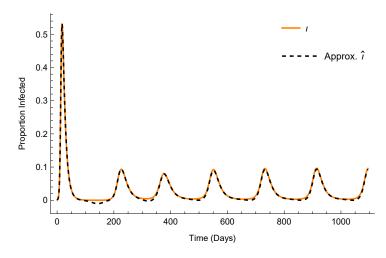
PredPropapprox = Plot[{IPredPropapprox}, {t, 0, plottime}, PlotStyle → {Black, Dashed}, PlotRange → All, AxesLabel → {"Time (Days)", Prop. Infected}, PlotLegends \rightarrow Placed[{"Approx. $\hat{\iota}$ "}, {Right, Top}]]

Out[52]=



NoBirth = Show[TRUEProp, PredPropapprox]



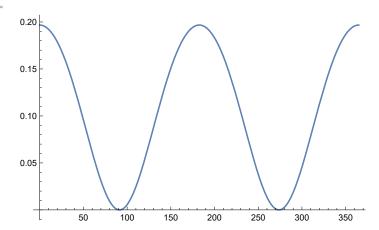


Sensitivity Analysis for $\hat{\imath}(t)$ and $\hat{\imath}_{peak}$

The sensitivity index of $\hat{i}(t)$ with respect to parameter ξ is given by $\hat{i}(t)_{\xi} = \frac{\partial \hat{i}(t)}{\partial \xi}$. To find the sensitivity of the predicted peak timing with to parameter ξ , we find where $\hat{i}(t)_{\xi}$ is equal to zero.

Plot[rAdata /. Parsnew, {t, 0, 365}]

Out[56]=



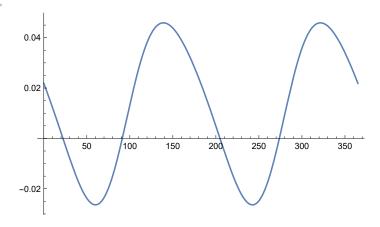
$$ln[57]:=$$
 $Lhat = \frac{rAdata (b + \omega_A) + D[rAdata, t]}{rAdata}$

Out[57]=

$$\frac{-2\,\text{C1}\,\text{e}^{-\text{s}\,\text{Cos}\,[\text{f}\,\pi\,\text{t}-\psi]^{\,2}}\,\text{f}\,\pi\,\text{s}\,\text{Cos}\,[\text{f}\,\pi\,\text{t}-\psi]\,\,\text{Sin}\,[\text{f}\,\pi\,\text{t}-\psi]\,\,+\,\,\left(\text{C2}-\text{C1}\,\text{e}^{-\text{s}\,\text{Cos}\,[\text{f}\,\pi\,\text{t}-\psi]^{\,2}}\right)\,\,\left(\text{b}+\omega_{\text{A}}\right)}{(\text{b}+\omega_{\text{A}})^{\,2}}$$

Plot[$\{\iota$ hat /. Parsnew /. b \rightarrow 0 $\}$, $\{t, 0, 365\}$] In[58]:=

Out[58]=



In[59]:=

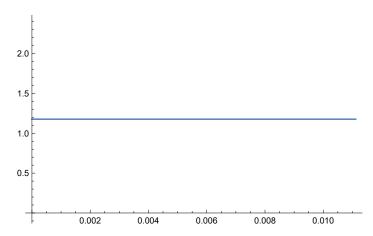
$$ι$$
hatD = D[$ι$ hat, $ω$ _A]

Out[59]=

$$\frac{\text{C2 - C1 } \, \mathbb{e}^{-\text{s } \text{Cos} \, [\, \text{f} \, \pi \, \text{t} - \psi \,]^{\, 2}}}{\checkmark}$$

Plot [{ ι hat D / . {C1 \to 0.5, C2 \to 0.5, $\gamma \to$ 1 / 10, $f \rightarrow 2/365, \psi \rightarrow 0, s \rightarrow 0.5, t \rightarrow 139.0031905514053^{}, \{\omega_A, 0, 1/90\}$

Out[60]=



 ι hat' = D[ι hat, t] /. {C1 → 0.5, C2 → 0.5, γ → 1 / 10, f → 2 / 365, ψ → 0, b → 0} In[61]:=

Out[61]=

$$\begin{split} & 10 \left(-0.000296329 \, \mathrm{e}^{-s \, \text{Cos} \left[\frac{2 \, \pi \, t}{365} \right]^2} \, s \, \text{Cos} \left[\frac{2 \, \pi \, t}{365} \right]^2 \, + \\ & 0.000296329 \, \mathrm{e}^{-s \, \text{Cos} \left[\frac{2 \, \pi \, t}{365} \right]^2} \, s \, \text{Sin} \left[\frac{2 \, \pi \, t}{365} \right]^2 - 0.000592658 \, \mathrm{e}^{-s \, \text{Cos} \left[\frac{2 \, \pi \, t}{365} \right]^2} \, s^2 \, \text{Cos} \left[\frac{2 \, \pi \, t}{365} \right]^2 \, \text{Sin} \left[\frac{2 \, \pi \, t}{365} \right]^2 - 0.00172142 \, \mathrm{e}^{-s \, \text{Cos} \left[\frac{2 \, \pi \, t}{365} \right]^2} \, s \, \text{Cos} \left[\frac{2 \, \pi \, t}{365} \right] \, \text{Sin} \left[\frac{2 \, \pi \, t}{365} \right] \, \omega_{\text{A}} \bigg) \end{split}$$

FullSimplify[Solve[Lhat' == 0, t]]

··· Solve: Solve was unable to solve the system with inexact coefficients. The answer was obtained by solving a corresponding exact system and numericizing the result.

Out[62]=

$$\begin{split} \Big\{ \Big\{ \textbf{t} \rightarrow \begin{bmatrix} \textbf{116.183} \, \text{ArcTan} \big[\, \text{Root} \, \big[\\ \textbf{5.70051} \times \textbf{10}^{23} + \big(-2.2802 \times \textbf{10}^{24} + 4.56041 \times \textbf{10}^{24} \, \textbf{s} \big) \, \, \sharp \textbf{1}^2 + \big(-5.70051 \times \textbf{10}^{24} - 9.12082 \times \textbf{10}^{24} \\ & \, \sharp \textbf{1}^4 + \big(-2.2802 \times \textbf{10}^{24} + 4.56041 \times \textbf{10}^{24} \, \textbf{s} \big) \, \, \sharp \textbf{1}^6 + 5.70051 \times \textbf{10}^{23} \, \, \sharp \textbf{1}^8 + 6.62303 \times \textbf{10}^{25} \, \, \sharp \textbf{1} \, \omega_{\textbf{A}} \\ & \, 6.62303 \times \textbf{10}^{25} \, \, \sharp \textbf{1}^3 \, \, \omega_{\textbf{A}} - 6.62303 \times \textbf{10}^{25} \, \, \sharp \textbf{1}^5 \, \, \omega_{\textbf{A}} - 6.62303 \times \textbf{10}^{25} \, \, \sharp \textbf{1}^7 \, \, \omega_{\textbf{A}} \, \, \textbf{8, 1} \, \big] \, \big] \, + \, 365. \, \, \mathbb{C}_1 \, \, \, \text{if} \, \, \mathbb{C}_1 \\ \end{split}$$

In[63]:= fourthsolfree = 116.1831084570836` ArcTan [

Out[63]=

$$\begin{aligned} \textbf{0.} + \textbf{116.183} \, & \text{ArcTan} \left[\text{Root} \left[\\ \textbf{5.70051} \times \textbf{10}^{23} + \textbf{2.68435} \times \textbf{10}^8 \, \sharp \textbf{1}^2 - \textbf{1.02609} \times \textbf{10}^{25} \, \sharp \textbf{1}^4 + \textbf{2.68435} \times \textbf{10}^8 \, \sharp \textbf{1}^6 + \textbf{5.70051} \times \textbf{10}^{23} \, \sharp \textbf{1}^8 + \\ \textbf{6.62303} \times \textbf{10}^{25} \, \sharp \textbf{1} \, \omega_{\text{A}} + \textbf{6.62303} \times \textbf{10}^{25} \, \sharp \textbf{1}^3 \, \omega_{\text{A}} - \textbf{6.62303} \times \textbf{10}^{25} \, \sharp \textbf{1}^5 \, \omega_{\text{A}} - \textbf{6.62303} \times \textbf{10}^{25} \, \sharp \textbf{1}^7 \, \omega_{\text{A}} \, \textbf{\&, 4} \right] \right] \end{aligned}$$

Plot[fourthsolfree, $\{\omega_A, 0, 1/30\}$]

Out[64]=

