

# Can the viral reservoir of latently infected CD4<sup>+</sup> T cells be eradicated with antiretroviral HIV drugs?

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# Outline

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- Mechanics of latently infected cells
- Mathematical model
- Impulsive differential equations
- Limiting results for infinite amount of drug
- More realistic dosing regimens
- Implications.

# Antiretroviral HIV drugs

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- If drugs are taken sufficiently often, the virus will be controlled
- However, it is not eradicated from the body
- Viral rebound occurs when drugs are stopped.



# Viral reservoirs

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This rebound occurs due to reservoirs, eg

- eyes
- brain
- testicles
- follicular dendritic cells
- latently infected cells



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- eyes
- brain
- testicles
- follicular dendritic cells
- **latently infected cells**

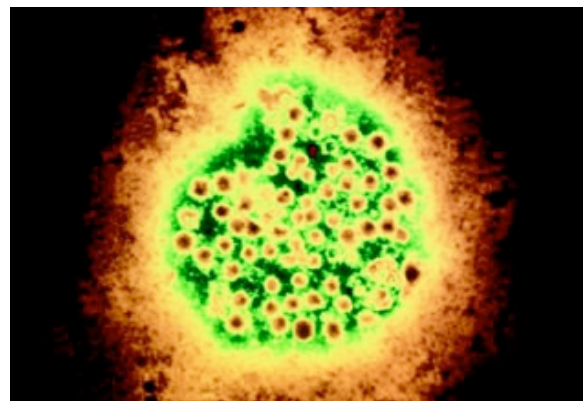


It's been suggested that these are the primary reservoir for viral rebound.

# Latently infected cells

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- Virologically quiescent (Chun *et al*, J Clin Invest 2005)
- <1 latently infected cell per million resting CD4<sup>+</sup> T cells (Chun *et al*, Nature 1997)
- 10<sup>3</sup>-10<sup>6</sup> cells per patient (Ramratran *et al*, Nat Med 2000)
- Halflife of 6-44 months (Finzi *et al*, Nat Med 1999)
- Do not produce virus until activated (Blankson *et al*, Annu Rev Med 2002).



# Current therapy

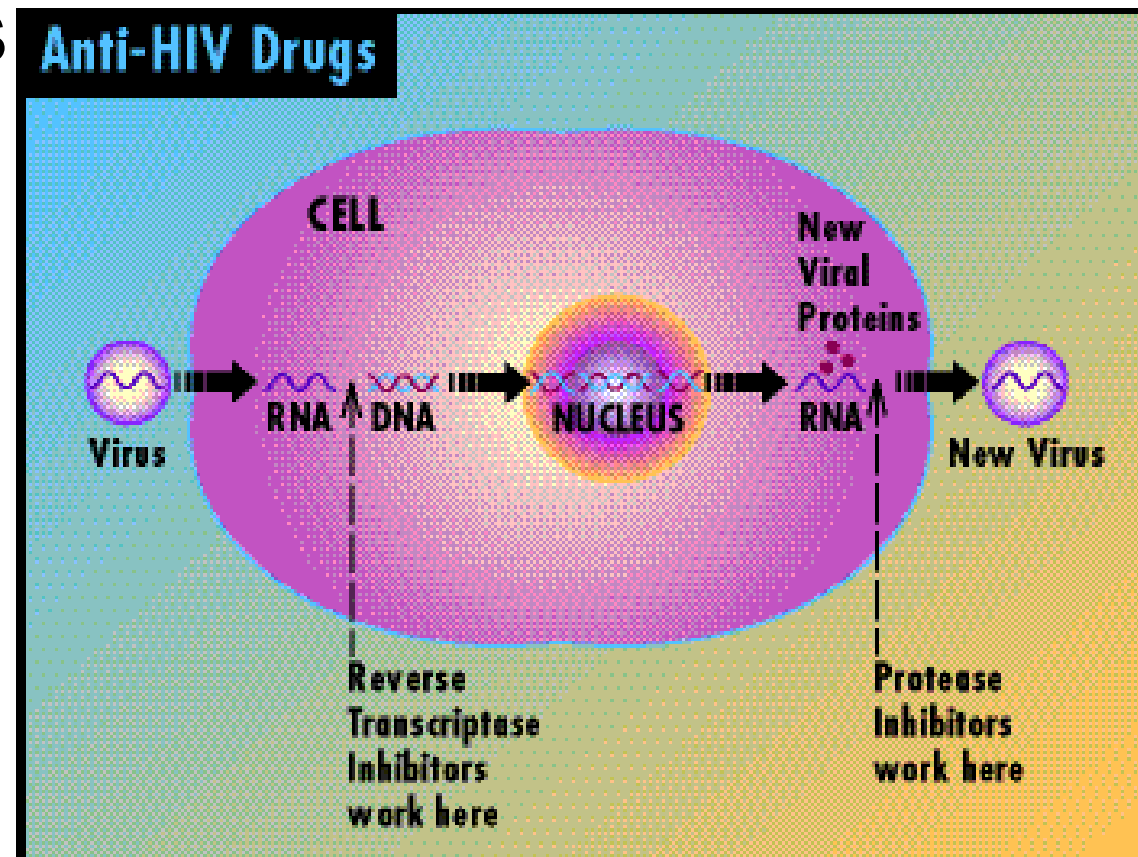
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- Current HIV therapy consists of a combination of antiretroviral drugs
- These are primarily drawn from two major classes:
  - Reverse Transcriptase Inhibitors (RTIs)
  - Protease Inhibitors (PIs).



# The two drug classes

- Reverse Transcriptase Inhibitors prevent viral infection of a T cell
- Protease Inhibitors result in the creation of noninfectious virus, thus preventing new cells from becoming infected.





# Assumptions

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We assume that

- drugs have no effect on latently infected cells  
(likely true for RTIs, not for PIs)
- latently infected cells live for maximal time:  
as long as susceptible cells  
(and hence much longer than productively  
infected cells)

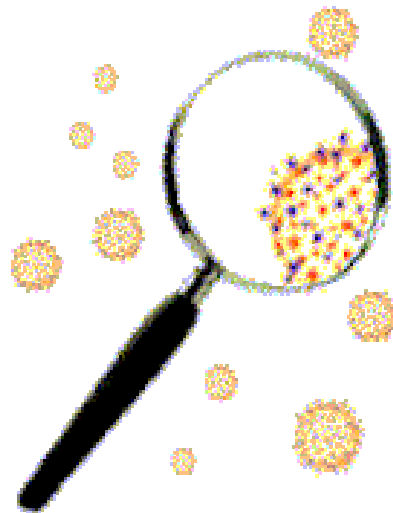
This is the most extreme scenario.

*RTI=reverse transcriptase inhibitor*  
*PI=protease inhibitor*

# Modelling latently infected cells

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- We model latently infected cells via a separate compartment
- They become infected at rate  $\alpha_L$
- They are not productively infected until leaving the latent state at rate  $p_L$ .



# Modelling CD4<sup>+</sup> T cells

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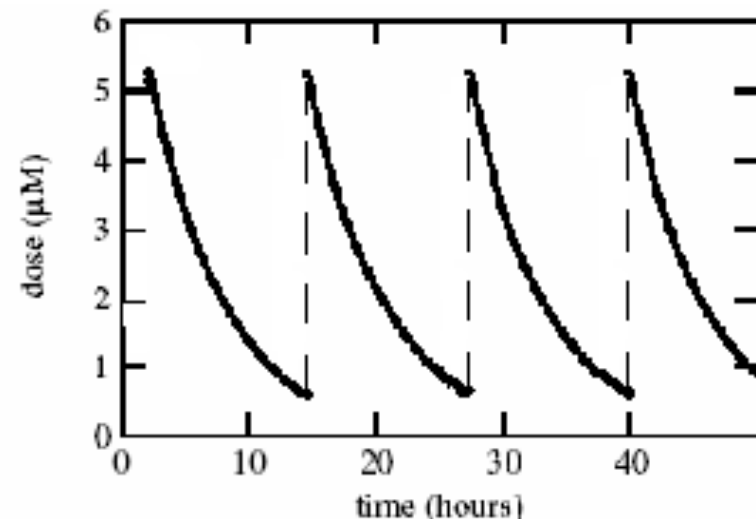
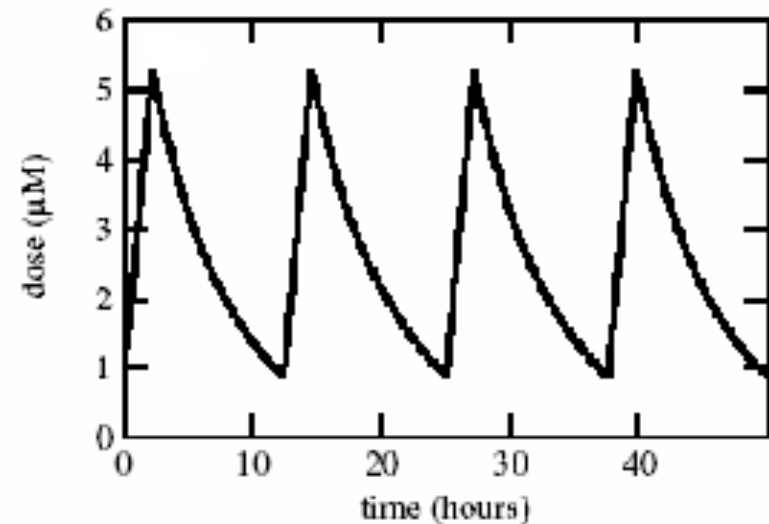
- Susceptible cells may be inhibited with RTIs, PIs or both
- Infected cells may be inhibited by PIs
- Cells inhibited with RTIs cannot be infected while they remain in this state
- Drug effects wear off at different rates for each drug.

*RTI=reverse transcriptase inhibitor*  
*PI=protease inhibitor*



# Impulsive Differential Equations

- Assume drug effects are instantaneous
- That is, the time-to-peak is assumed to be negligible
- This results in a system of *impulsive differential equations*.




# Impulsive effect


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

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



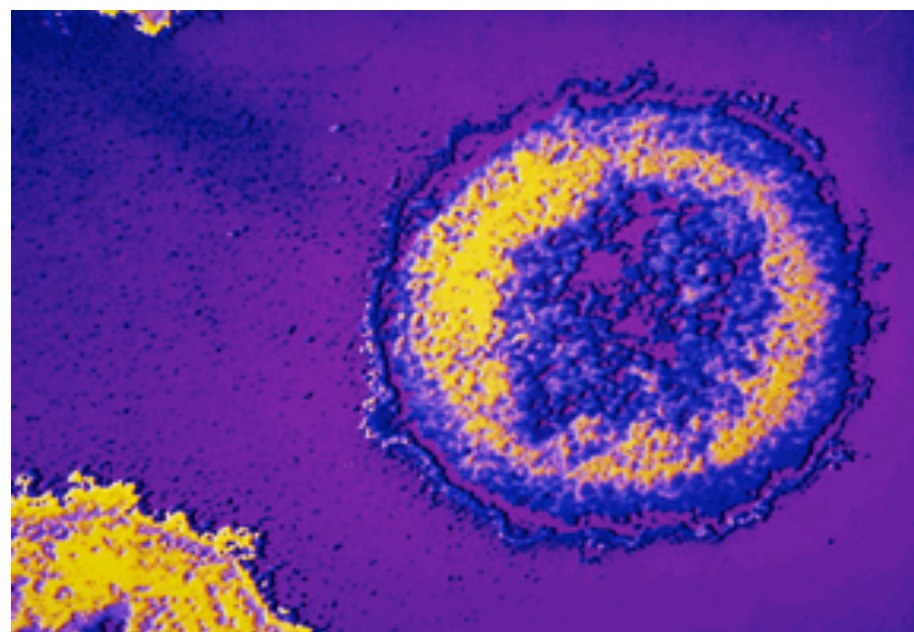
Difference  
equation



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

# Impulsive DEs

- 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-to-peak.



*Thousands of HIV particles emerging from an infected T-cell*

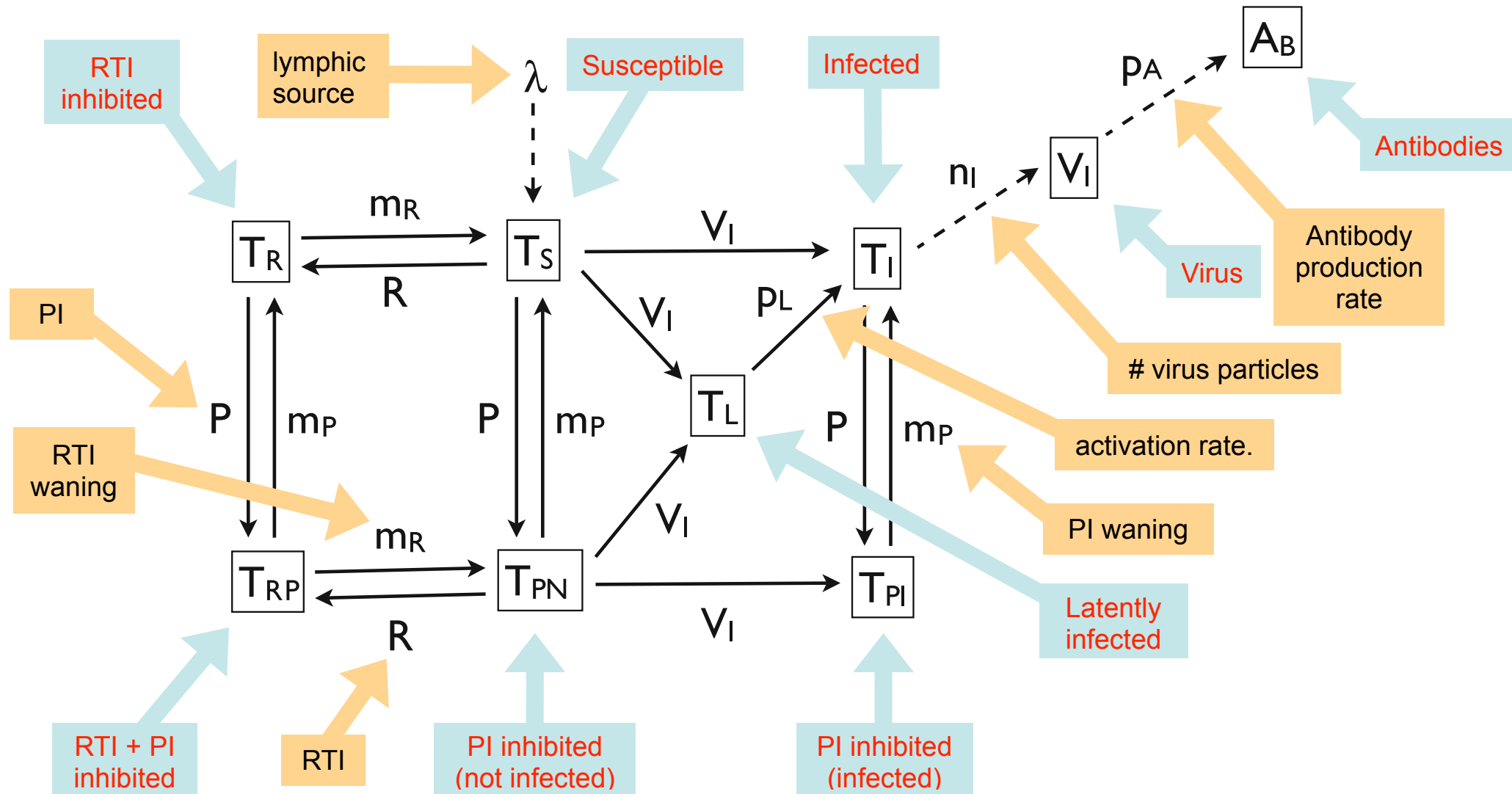
# Putting it together

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- The model thus consists of a system of ODEs (virus and T cells) together with an ODE and a difference equation (drugs).



# The model (figure)





# The model (equations)

$$\begin{aligned}\frac{dV_I}{dt} &= n_I T_I - d_V V_I \\ \frac{dA_B}{dt} &= p_A V_I - d_A A_B \\ \frac{dT_S}{dt} &= \lambda - r_I T_S V_I - d_S T_S - r_R T_S R - r_P T_S P + m_R T_R + m_P T_{PN} \\ \frac{dT_I}{dt} &= q_I T_S V_I - d_I T_I + p_L T_L - \delta_A A_B T_I - r_P T_I P + m_P T_{PI} \\ \frac{dT_L}{dt} &= \alpha_L T_S V_I + \alpha_L T_{PN} V_I - d_L T_L - p_L T_L \\ \frac{dT_R}{dt} &= r_R T_S R - d_S T_R + m_P T_{RP} - m_R T_R - r_P T_R P \\ \frac{dT_{RP}}{dt} &= r_R T_{PN} R - d_S T_{RP} - m_P T_{RP} - m_R T_{RP} + r_P T_R P \\ \frac{dT_{PN}}{dt} &= r_P T_S P - d_S T_{PN} - r_I T_{PN} V_I - r_R T_{PN} R - m_P T_{PN} + m_R T_{RP} \\ \frac{dT_{PI}}{dt} &= q_I T_{PN} V_I - d_I T_{PI} - \delta_A A_B T_{PI} + r_P T_I P - m_P T_{PI}\end{aligned}$$

$T_S$ =Susceptible T cells  $T_I$ =Infected  $T_R$ =RTI inhibited  $T_{RP}$ =RTI + PI inhibited  $\lambda$ =lymphic source  
 $T_{PN}$ =PI inhibited (not infected)  $T_{PI}$ =PI inhibited (infected)  $T_L$ =Latently infected  $A_B$ =antibodies  
 $R$ =Reverse Transcriptase Inhibitor  $P$ =Protease Inhibitor  $n_I$ =# particles  $m_R, m_P$ =RTI, PI waning rates  
 $p_L$ = activation rate  $p_A$ =antibody production rate  $d_S, d_I, d_L, d_V, d_A$ =death rates  $r_I, \alpha_V, q_I$ =infection rates  
 $r_R, r_P$ =drug inhibition rates  $\delta_A$ =antibody clearance rate

...with the (impulsive) dynamics of the drugs:

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$$\frac{dR}{dt} = -d_R R \quad t \neq t_k$$

$$\frac{dP}{dt} = -d_P P \quad t \neq s_k$$

$$\Delta R = R^i \quad t = t_k$$

$$\Delta P = P^i \quad t = s_k .$$

*R=Reverse Transcriptase Inhibitor P=Protease Inhibitor  
d<sub>R</sub>,d<sub>P</sub>=drug clearance rates R<sup>i</sup>=RTI dosage P<sup>i</sup>=PI dosage  
t<sub>k</sub>=RTI dosage times s<sub>k</sub>=PI dosage times*

# Absence of drugs

- There's a disease-free equilibrium

$$(V_I, A_B, T_S, T_I, T_L, T_R, T_{RP}, T_{PN}, T_{PI}) = \left(0, 0, \frac{\lambda}{d_S}, 0, 0, 0, 0, 0, 0\right)$$

and an endemic equilibrium of the form

$$(V_I, A_B, T_S, T_I, T_L, T_R, T_{RP}, T_{PN}, T_{PI}) = (\bar{V}_I, \bar{A}_B, \bar{T}_S, \bar{T}_I, \bar{T}_L, 0, 0, 0, 0)$$

- We can prove: the disease-free equilibrium is unstable in the absence of drugs

Proof: [Smith? & Aggarwala, 2009](#).

$T_S$ =Susceptible  $T$  cells  $T_I$ =Infected (wild type)  $\lambda$ =lymphic source  $T_R$ =RTI inhibited  
 $T_{RP}$ =RTI + PI inhibited  $T_{PN}$ =PI inhibited (not infected)  $T_{PI}$ =PI inhibited (infected)  
 $T_L$ =Latently infected  $A_B$ =antibodies  $d_S$ =susceptible cell death rate

# The presence of drugs

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- There are no equilibria, due to impulses
- Instead, there are impulsive orbits with variation in the state variables, due to the drug dynamics
- The disease-free impulsive orbit is in the form

$$(V_I, A_B, T_S, T_I, T_L, T_R, T_{RP}, T_{PN}, T_{PI}) = (0, 0, \hat{T}_S, 0, 0, \hat{T}_R, \hat{T}_{RP}, \hat{T}_{PN}, 0).$$

*$T_S$ =Susceptible  $T$  cells  $T_I$ =Infected (wild type)  $T_R$ =RTI inhibited  
 $T_{RP}$ =RTI + PI inhibited  $T_{PN}$ =PI inhibited (not infected)  
 $T_{PI}$ =PI inhibited (infected)  $T_L$ =Latently infected  $A_B$ =antibodies*

# The drugs satisfy a recursion relation

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$$\begin{aligned} R(t) &= R(t_k^+) e^{-d_R(t-t_k)} & t_k < t \leq t_{k+1} \\ R(t_k^+) &= R(t_k^-) + R^i \end{aligned}$$

$R$ =drug  
 $d_R$ =decay rate  
 $R^i$ =dosage  
 $t_k$ =impulse time

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Hence

$$R(t_k^+) \rightarrow \frac{R^i}{1 - e^{-d_R \tau}}.$$

$R$ =drug  
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Hence

$$R(t_k^+) \rightarrow \frac{R^i}{1 - e^{-d_R \tau}}.$$

as  $k \rightarrow \infty$ , where  $\tau = t_{k+1} - t_k$  is the dosing interval.

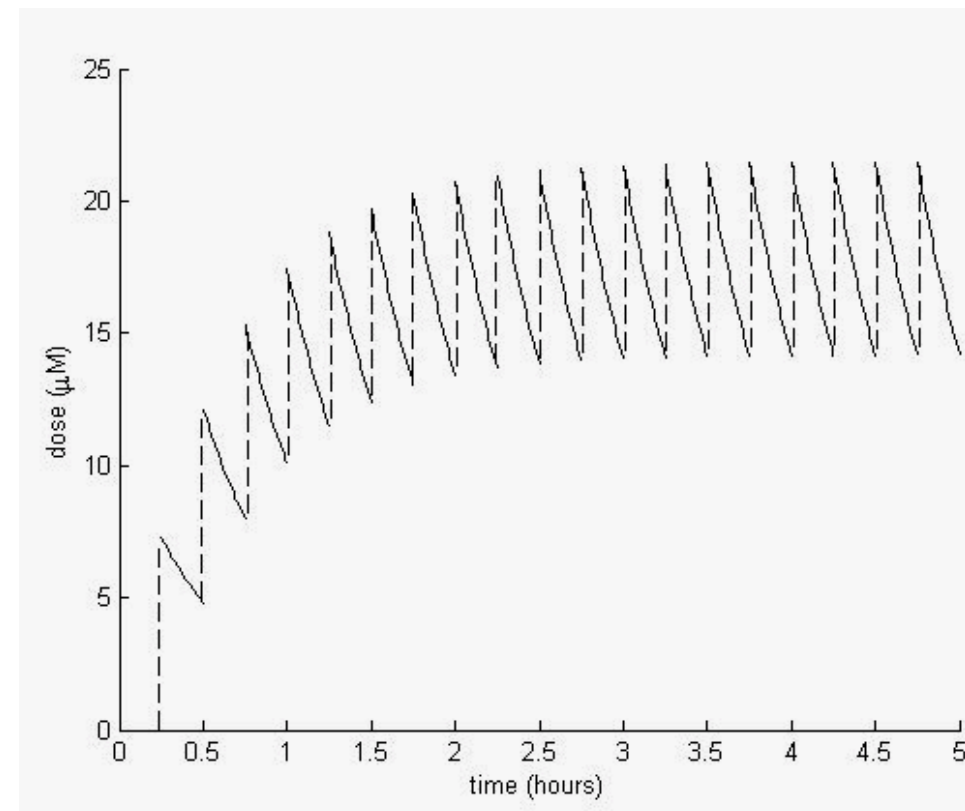
$R$ =drug  
 $d_R$ =decay rate  
 $R^i$ =dosage  
 $t_k$ =impulse time



# Impulsive periodic orbit

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- Thus, for the drugs, there is a unique, positive impulsive periodic orbit with one impulse per cycle
- It can also be shown that the endpoints of each cycle monotonically approach the endpoints of this periodic orbit.



# Disease-free orbit

- The disease-free orbit satisfies

$$\begin{aligned}\hat{T}_{PN} &= \frac{r_P P \hat{T}_S + m_R \hat{T}_{RP}}{d_S + r_R R + m_P} & \hat{T}_S &= \frac{f_1}{f_2} T_{RP} \\ \hat{T}_R &= \frac{r_R R \hat{T}_S + m_P \hat{T}_{RP}}{d_S + m_R + r_P P} & \hat{T}_{RP} &= \frac{\lambda}{f_3}\end{aligned}$$

where

$$f_1 = d_S(d_S + r_P P + m_R)(d_S + r_R R + m_P) + m_P(d_S + m_R)(d_S + r_R R + m_P) \\ + m_R(d_S + m_P)(d_S + r_P P + m_R)$$

$$f_2 = r_R R r_P P (2d_S + m_R + m_P + r_R R + r_P P)$$

$$f_3 = \left[ d_S + r_R R + r_P P - \frac{m_R r_R R}{d_S + r_P P + m_R} - \frac{m_P r_P P}{d_S + r_R R + m_P} \right] \frac{f_1}{f_2} \\ - \frac{m_R m_P}{d_S + r_P P + m_R} - \frac{m_R m_P}{d_S + r_R R + m_P}$$

# Intermediate calculations

- We have

$$\lim_{r_P P \rightarrow \infty} f_1 = \infty$$

$$\lim_{r_P P \rightarrow \infty} f_2 = \infty$$

$$\lim_{r_P P \rightarrow \infty} \frac{f_1}{f_2} = 0.$$

*R=reverse transcriptase inhibitor  
P=protease inhibitor  
d<sub>S</sub>=susceptible cell death rates  
m<sub>R</sub>, m<sub>P</sub>=RTI, PI waning rates  
r<sub>R</sub>, r<sub>P</sub>=drug inhibition rates*

$$\begin{aligned} f_1 &= d_S(d_S + r_P P + m_R)(d_S + r_R R + m_P) \\ &\quad + m_P(d_S + m_R)(d_S + r_R R + m_P) \\ &\quad + m_R(d_S + m_P)(d_S + r_P P + m_R) \\ f_2 &= r_R R r_P P (2d_S + m_R + m_P + r_R R + r_P P) \end{aligned}$$

# Further calculations

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$$r_P P \frac{f_1}{f_2} = \frac{d_S(d_S + r_R R + m_P)(d_S + r_P P + m_R)}{r_R R(2d_S + m_P + m_R + r_P P + r_R R)} + \frac{m_R(d_S + m_P)(d_S + r_P P + m_R) + m_P(d_S + m_R)(d_S + r_R R + m_P)}{r_R R(2d_S + m_P + m_R + r_P P + r_R R)}$$

# Limiting values

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$$\begin{aligned}\lim_{r_P P \rightarrow \infty} T_S &= \lim_{r_P P \rightarrow \infty} \frac{f_1}{f_2} \lim_{r_P P \rightarrow \infty} T_{RP} \\ &= 0\end{aligned}$$

$$\begin{aligned}\hat{T}_S &= \frac{f_1}{f_2} T_{RP} \\ \hat{T}_{RP} &= \frac{\lambda}{f_3} \\ \hat{T}_{PN} &= \frac{r_P P \hat{T}_S + m_R \hat{T}_{RP}}{d_S + r_R R + m_P} \\ \hat{T}_R &= \frac{r_R R \hat{T}_S + m_P \hat{T}_{RP}}{d_S + m_R + r_P P}\end{aligned}$$

# PIs can also control virus

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- We have thus proved the following:
- If PIs are taken with sufficient frequency, then

$$T_{RP} + T_{PN} \rightarrow \frac{\lambda}{d_S}$$

$\lambda/d_S$  = the level of  $CD4^+$  T cells in the uninfected body

as the dosing interval shrinks to zero

- It follows that, with sufficient application, PIs can theoretically control the virus.

*PI=protease inhibitor  $T_{PN}$ =PI inhibited (not infected)  $\lambda$ =lymphic source  $T_{RP}$ =RTI+PI inhibited  $d_S$ =susceptible cell death rate*

# RTIs theoretically control virus

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- Similarly:
- If RTIs are taken with sufficient frequency, then

$$T_R + T_{RP} \rightarrow \frac{\lambda}{d_S}$$

$\lambda/d_S$  = the level of  $CD4^+$  T cells in the uninfected body

as the dosing interval shrinks to zero

- It follows that, with sufficient application, RTIs can theoretically control the virus.

*RTI=reverse transcriptase inhibitor  $d_S$ =susceptible cell death rate  
 $T_R$ =RTI inhibited  $T_{RP}$ =RTI+PI inhibited  $\lambda$ =lymphic source*

# Both drugs together

- If RTIs and PIs are taken with sufficient frequency, then

$$T_{RP} \rightarrow \frac{\lambda}{d_S}$$

$\lambda/d_S$  = the level of  
CD4<sup>+</sup> T cells in the  
uninfected body

as the dosing interval shrinks to zero

- Thus, with sufficient application, combination therapy can theoretically control the virus
- In particular, the latently infected cells are driven to extinction.

RTI=reverse transcriptase inhibitor PI=protease inhibitor  $\lambda$ =lymphic source  $T_{RP}$ =RTI+PI inhibited  $d_S$ =susceptible cell death rate



# Why is this? (Mathematically)

- As  $P \rightarrow \infty$ ,  
 $T_I' \rightarrow -\infty$   
 unless  $T_I \rightarrow 0$

$$\begin{aligned}\frac{dV_I}{dt} &= n_I T_I - d_V V_I \\ \frac{dA_B}{dt} &= p_A V_I - d_A A_B \\ \frac{dT_S}{dt} &= \lambda - r_I T_S V_I - d_S T_S - r_R T_S R - r_P T_S P + m_R T_R + m_P T_{PN} \\ \frac{dT_I}{dt} &= q_I T_S V_I - d_I T_I + p_L T_L - \delta_A A_B T_I - r_P T_I P + m_P T_{PI} \\ \frac{dT_L}{dt} &= \alpha_L T_S V_I + \alpha_L T_{PN} V_I - d_L T_L - p_L T_L \\ \frac{dT_R}{dt} &= r_R T_S R - d_S T_R + m_P T_{RP} - m_R T_R - r_P T_R P \\ \frac{dT_{RP}}{dt} &= r_R T_{PN} R - d_S T_{RP} - m_P T_{RP} - m_R T_{RP} + r_P T_R P \\ \frac{dT_{PN}}{dt} &= r_P T_S P - d_S T_{PN} - r_I T_{PN} V_I - r_R T_{PN} R - m_P T_{PN} + m_R T_{RP} \\ \frac{dT_{PI}}{dt} &= q_I T_{PN} V_I - d_I T_{PI} - \delta_A A_B T_{PI} + r_P T_I P - m_P T_{PI}\end{aligned}$$

$P$ =protease inhibitor  $T_S$ =Susceptible T cells  
 $T_I$ =Infected  $T_R$ =RTI inhibited  $T_{PI}$ =PI inhibited  
 (infected)  $T_L$ =Latently infected  $A_B$ =antibodies

# Why is this? (Biologically)

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- As  $RTIs \rightarrow \infty$ ,  $T_S$  cells instantly become  $T_R$  cells and cannot be infected
- As  $PIs \rightarrow \infty$ , cells instantly become  $T_{PN}$  or  $T_{PI}$  cells and don't produce infectious virus
- Essentially, the drugs “overwhelm” the virus.



*RTI=reverse transcriptase inhibitor PI=protease inhibitor  $T_S$ =Susceptible cells  
 $T_{PNI}$ =Protease inhibited (not infected)  $T_{PN}$ =protease inhibited (not infected)  
 $T_{PI}$ =protease inhibited (infected)  $T_R$ =RTI inhibited*

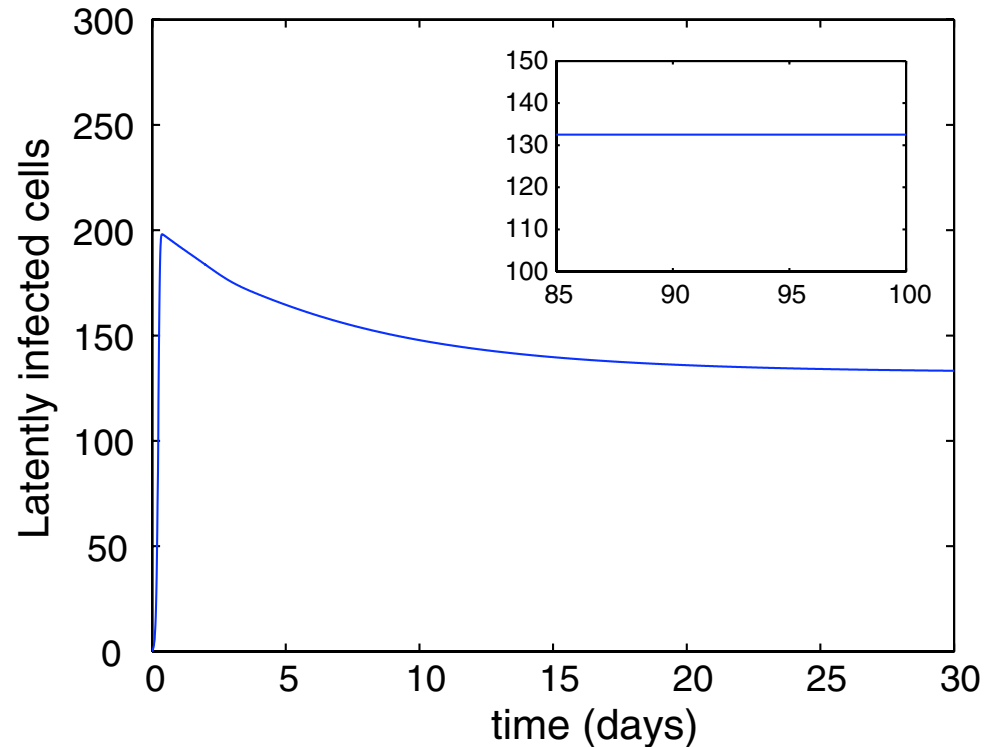
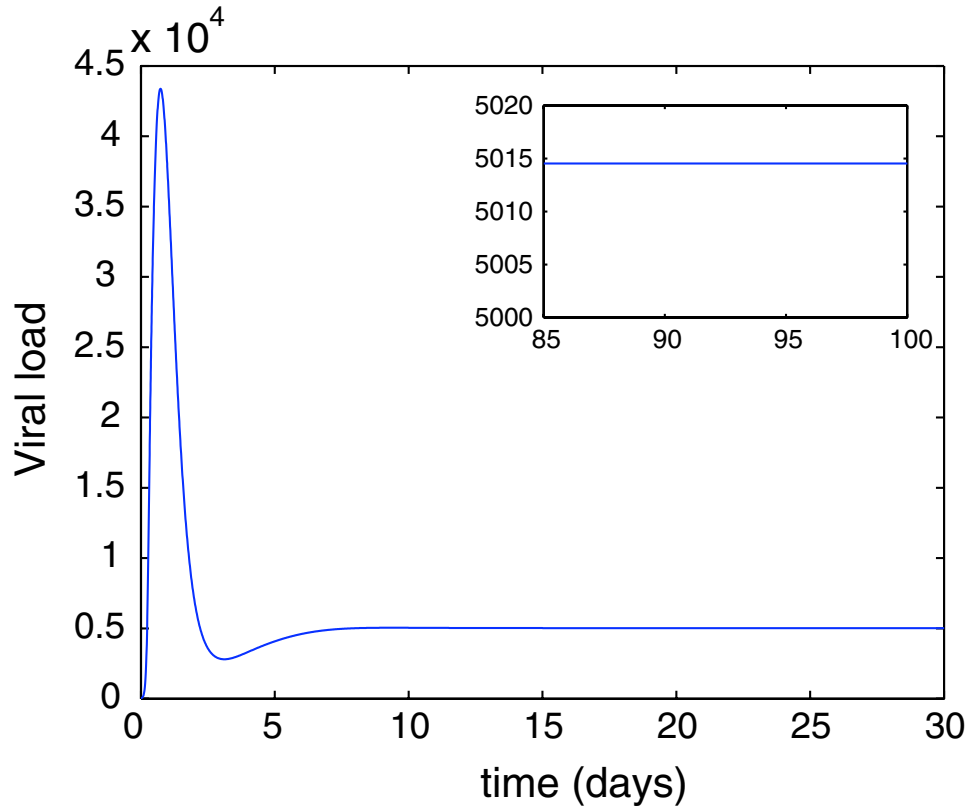
# Realistic regimens

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- Of course, we can't take drugs infinitely often
- Too much drug is toxic for the patient
- But these theoretical results match more realistic dosing regimens
- We simulated Didanosine, supplemented by a low-level PI.

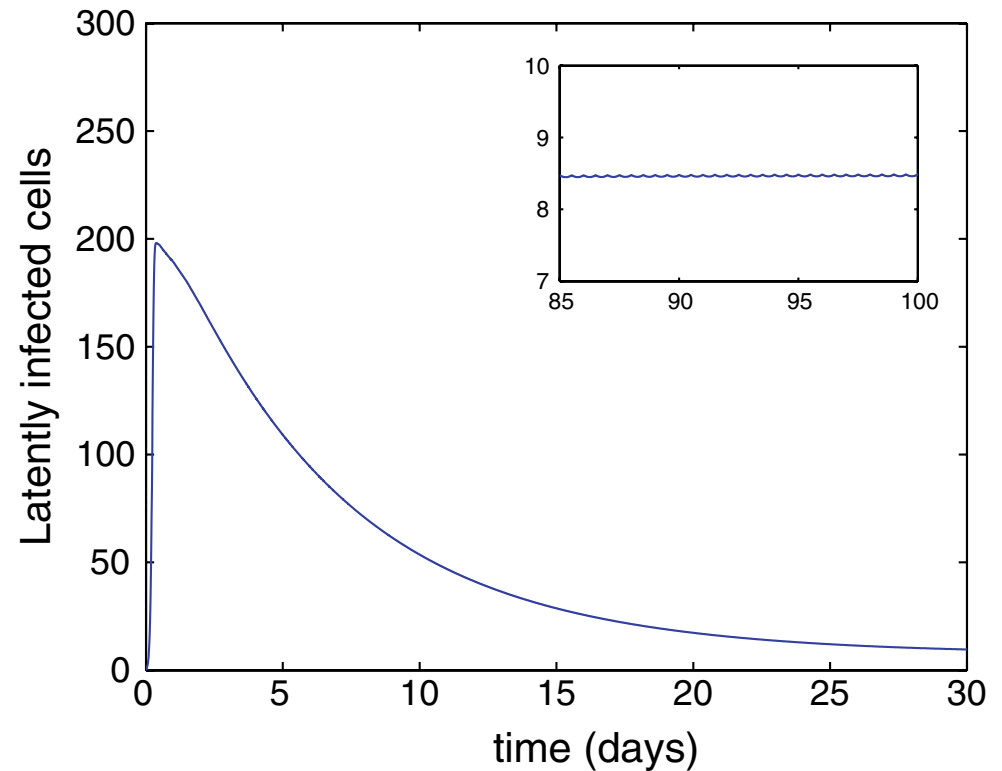
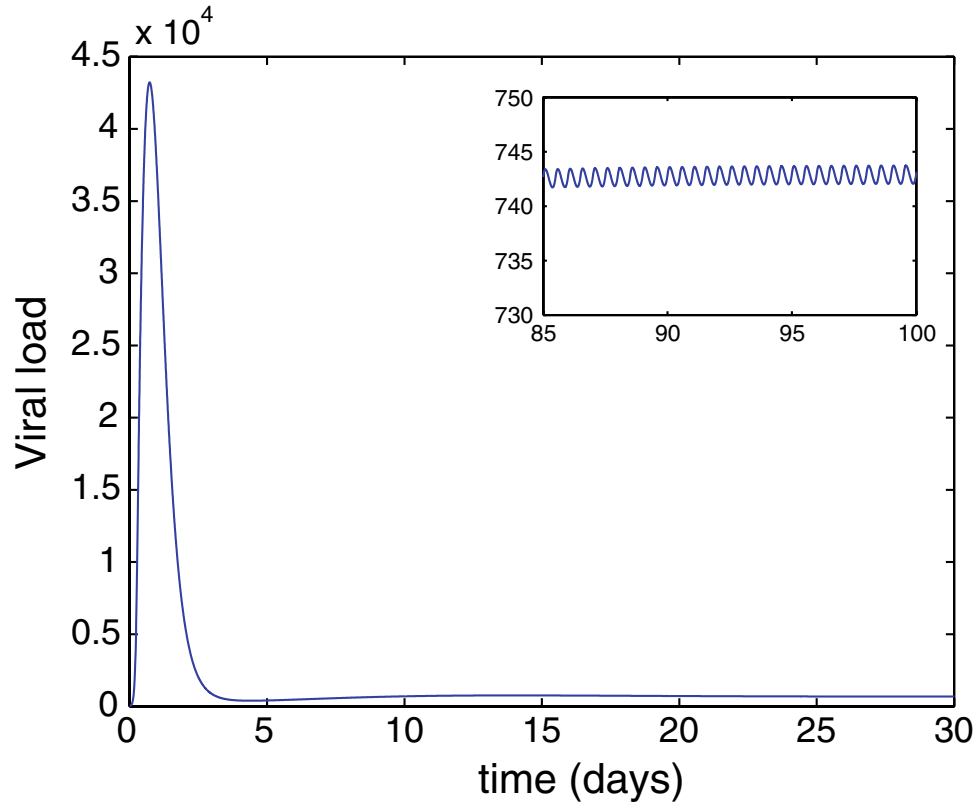
*RTI=reverse transcriptase inhibitor*  
*PI=protease inhibitor*

# The case of no drugs



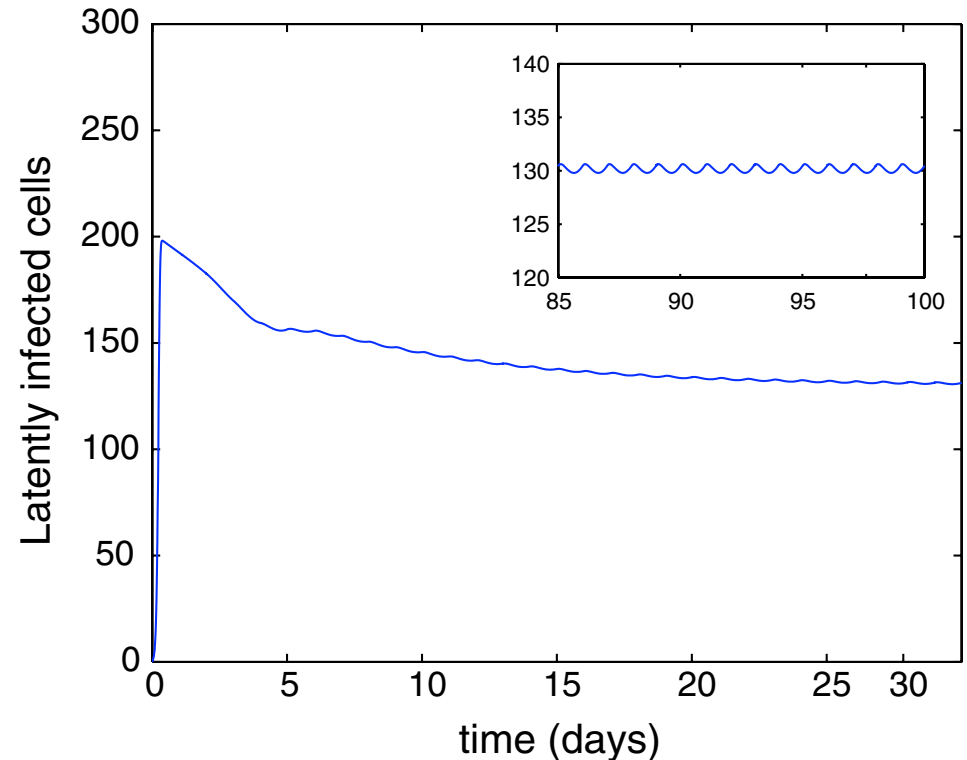
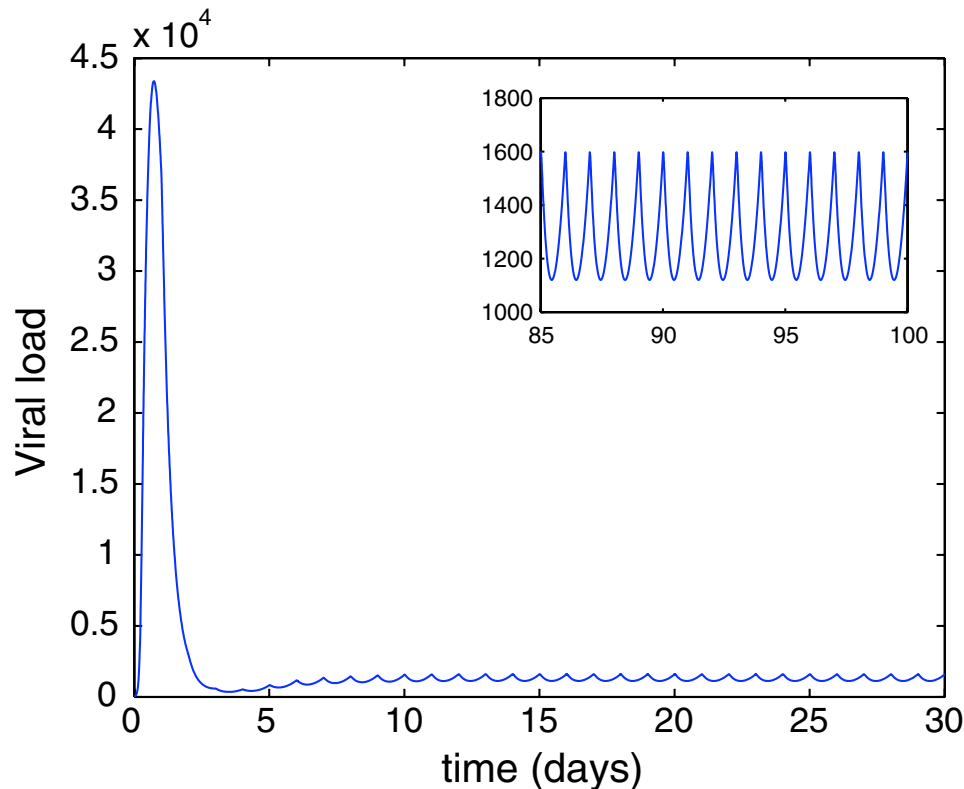
- High viral load, high reservoir of latently infected cells.

# RTIs taken twice daily, no PIs



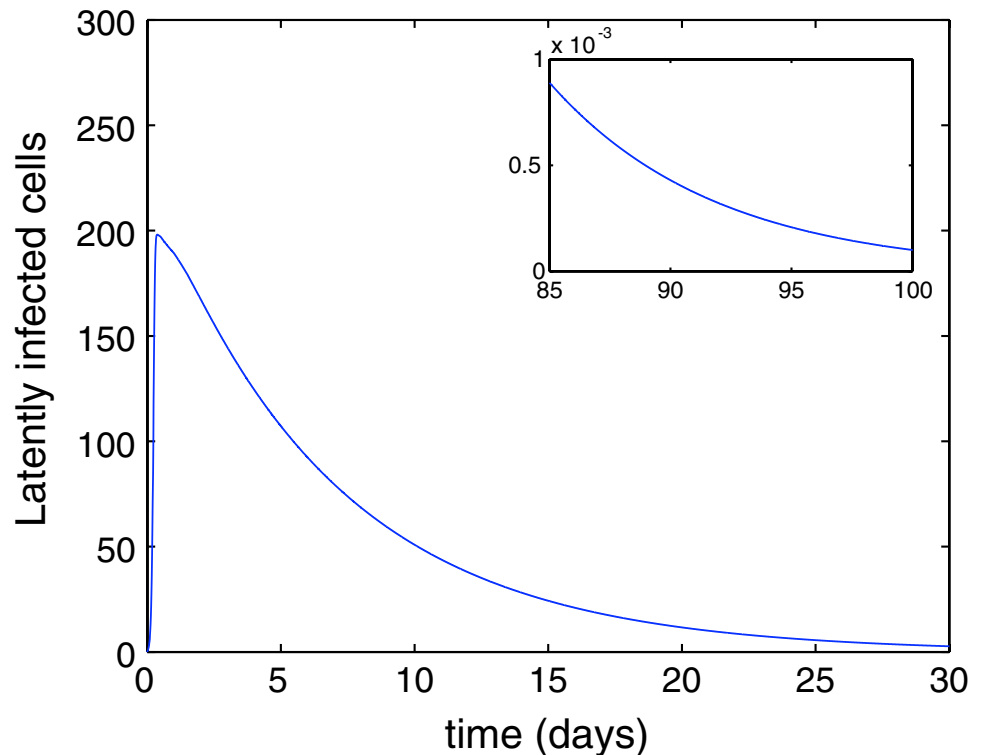
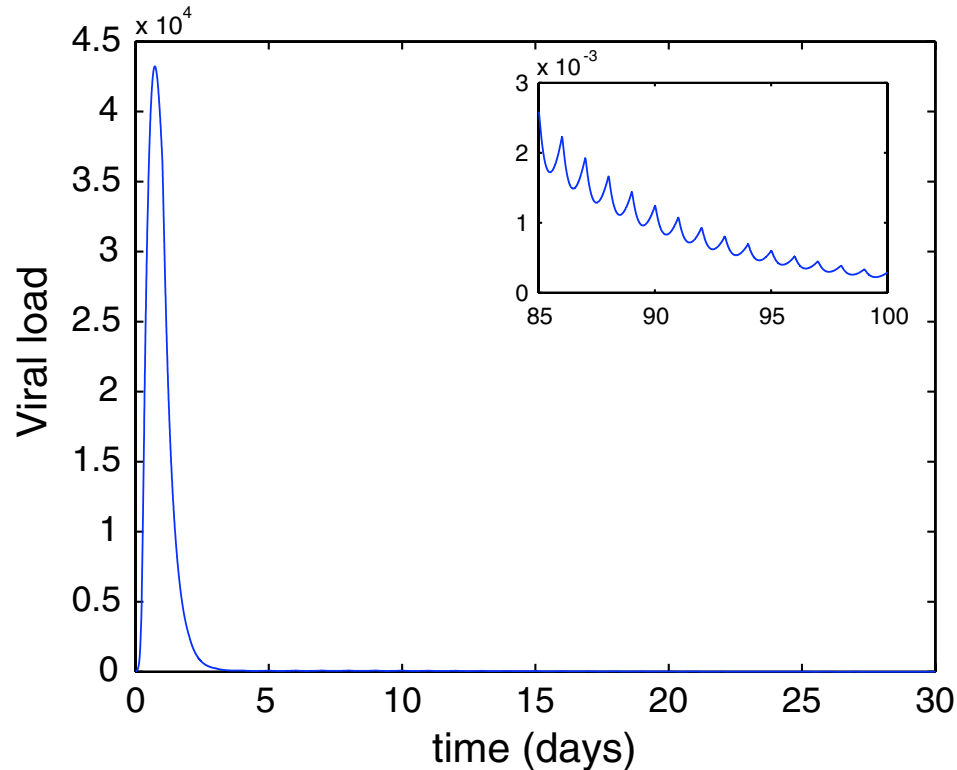
- Moderate viral load, low reservoir of latently infected cells.

# Low-level PI, no RTIs



- High viral load, high reservoir of latently infected cells.

# Both drugs



- Both viral load and reservoir of latently infected cells are eradicated.

# Summary

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- The model predicts that latently infected cells can be eradicated by sufficient drugs
- This happens even if they live for maximal time and are wholly unaffected by the drugs
- Except...
- ...we know this doesn't happen.





# The problem with viral elimination

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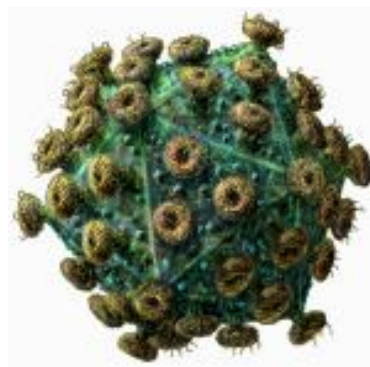
- Viral elimination doesn't occur
- If you stop taking drugs, the virus rebounds
- So what does this mean?



# Implications

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- We ignored other viral reservoirs
- eg eyes, brain, testicles, follicular dendritic cells, CTLs, etc
- These reservoirs must contribute to sustaining the low-level viral load
- Thus, latently infected cells cannot sustain a viral reservoir on their own.



# Conclusion

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- Mathematical models are useful for exploring hypothetical questions
- In this case, the hypothesis that latently infected cells are the sole viral reservoir
- If it were, the model predicts complete eradication, which we know doesn't happen
- This occurs even under the most extreme assumptions: that latently infected cells are immune to drugs and live for maximal time
- Thus, other viral reservoirs are critical.

# Key reference

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- R.J. Smith? and B.D. Aggarwala. Can the viral reservoir of latently infected CD4+ T cells be eradicated with antiretroviral HIV drugs?  
(Journal of Mathematical Biology 2009, 59: 697-715)

