

# Recovery of genetic variation in HIV

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Harvard University

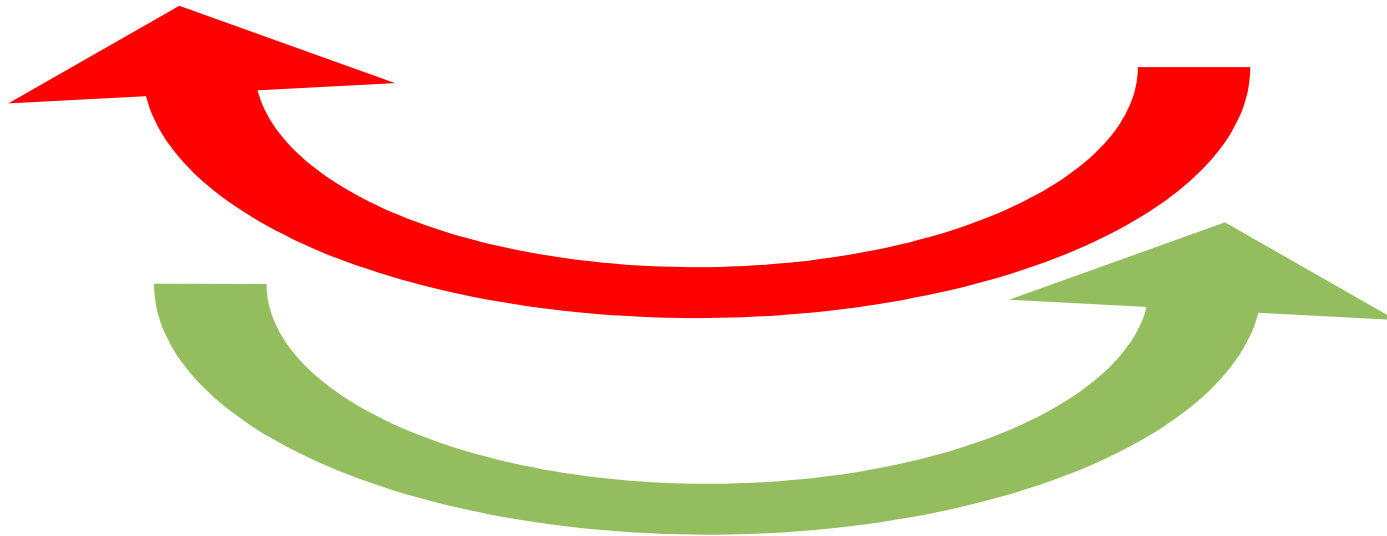
Marseille CIRM June 2012

# Goal of my work

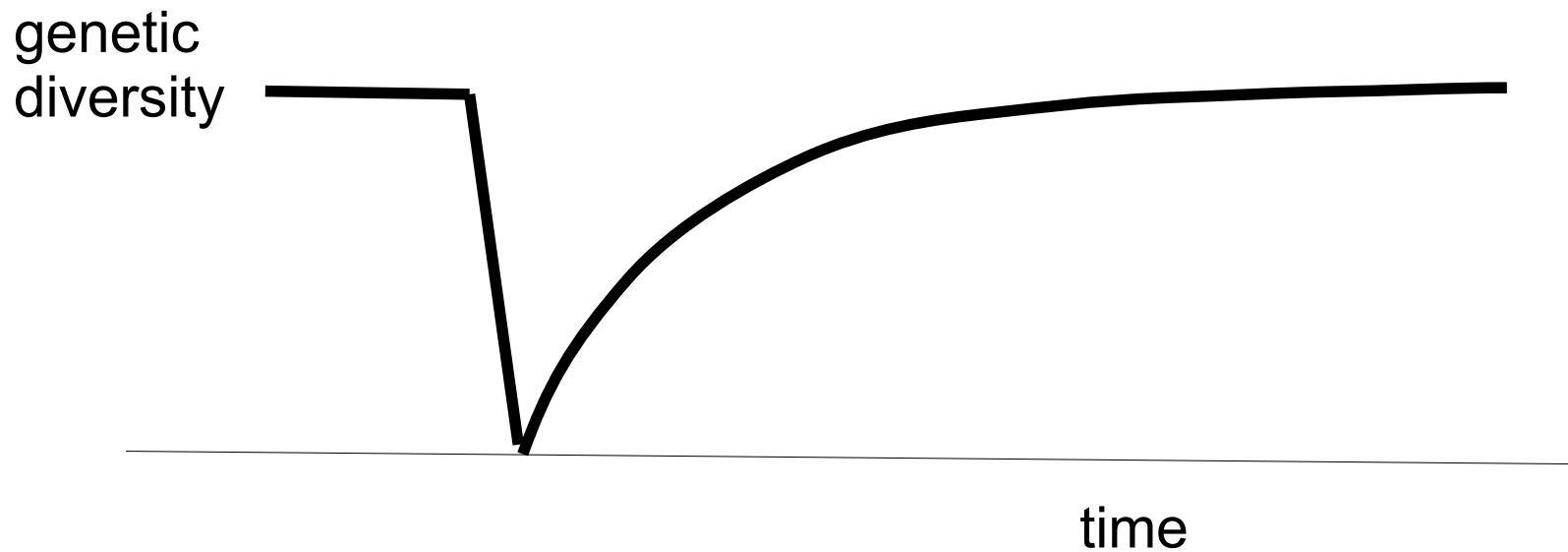
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Evolutionary biology  
Population genetics

HIV within host  
Drug resistance  
Data & Questions



# Why look at recovery of diversity?



# Why look at recovery of diversity?

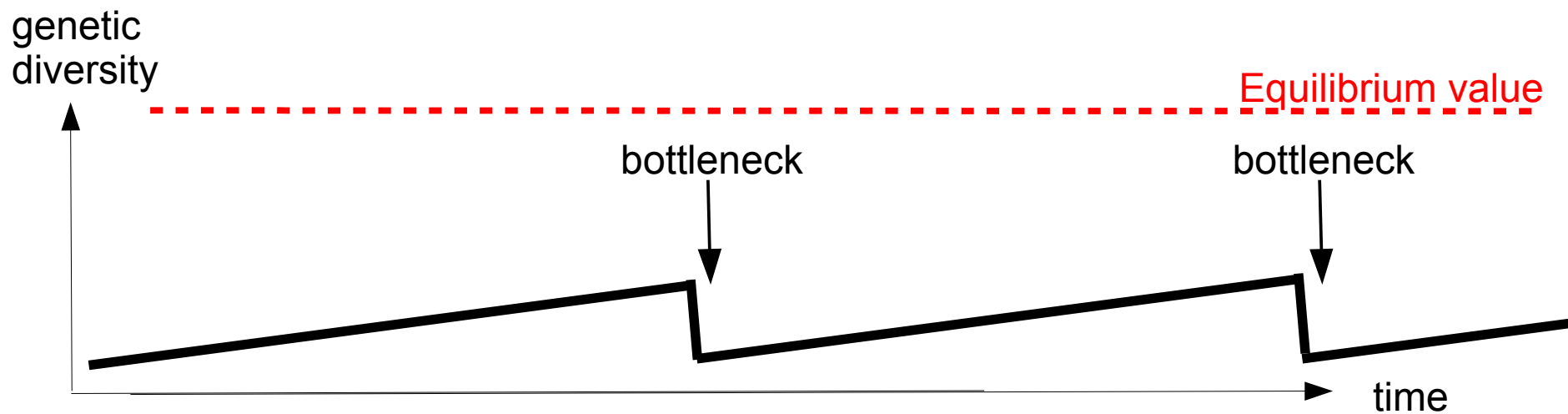
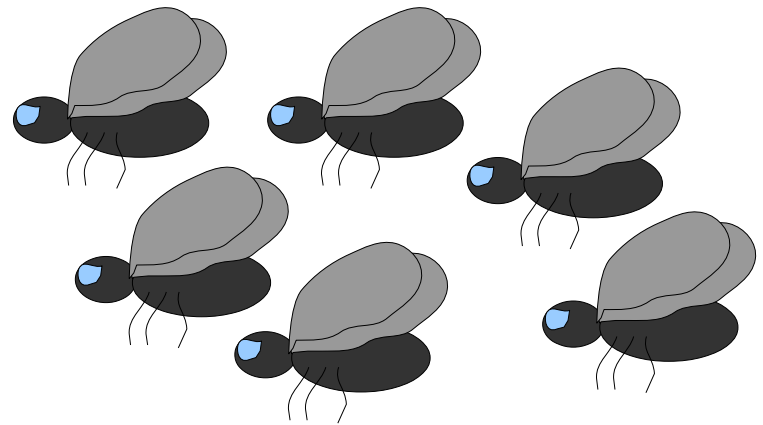
1. If recovery fast, then equilibrium assumptions justified



2. Recovery tells us about evolutionary parameters

# Examples

*Drosophila melanogaster*  
Karasov, Messer, Petrov 2010



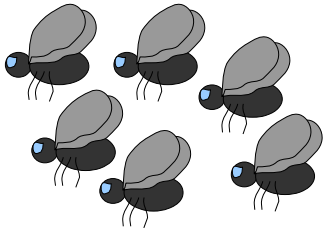
Genetic diversity never reaches expected equilibrium

# Examples

*Drosophila melanogaster*

**never recovers**

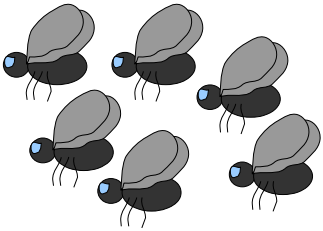
Karasov, Messer, Petrov 2010



# Examples

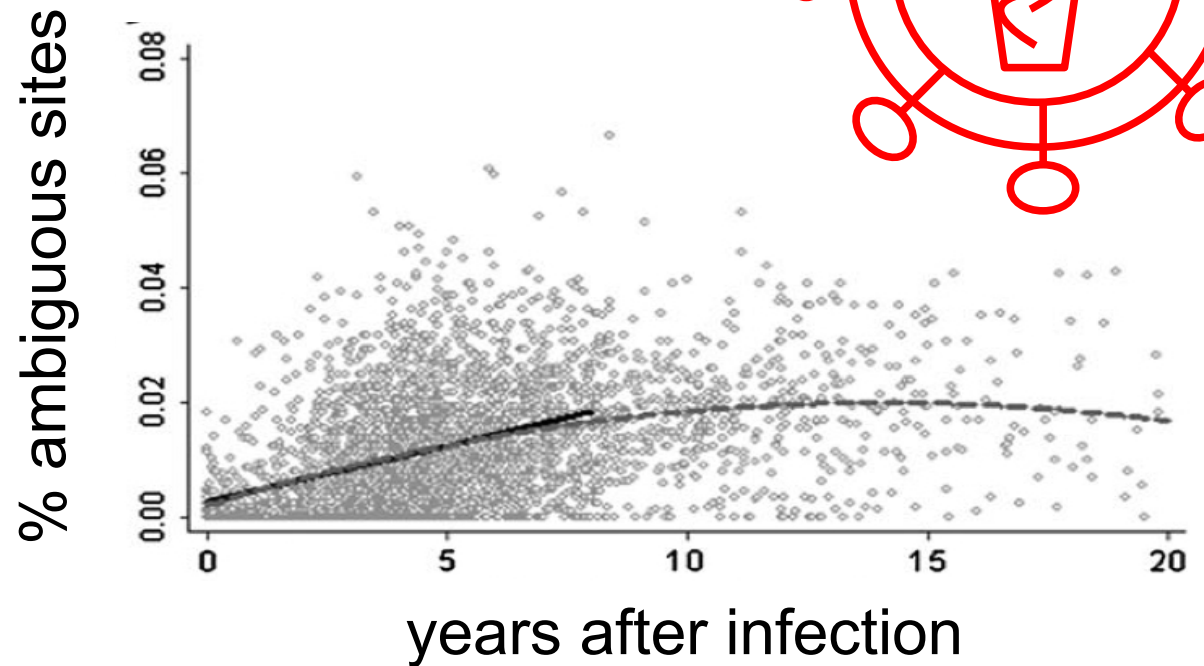
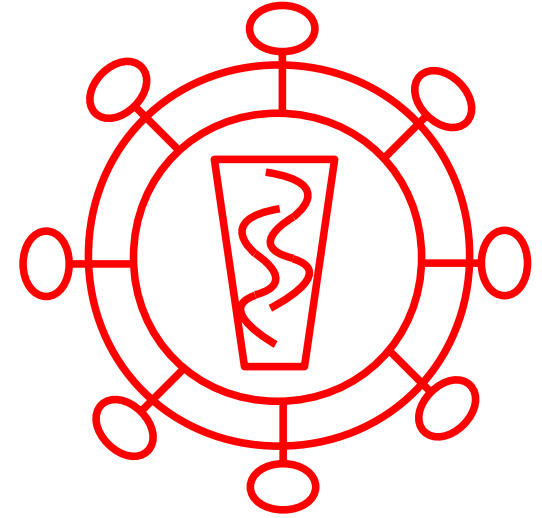
*Drosophila melanogaster*  
**never recovers**

Karasov, Messer, Petrov 2010



HIV

Kouyos et al 2011

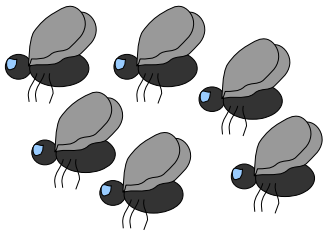


Takes few years to recover

# Examples

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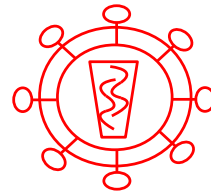
Karasov, Messer, Petrov 2010



HIV

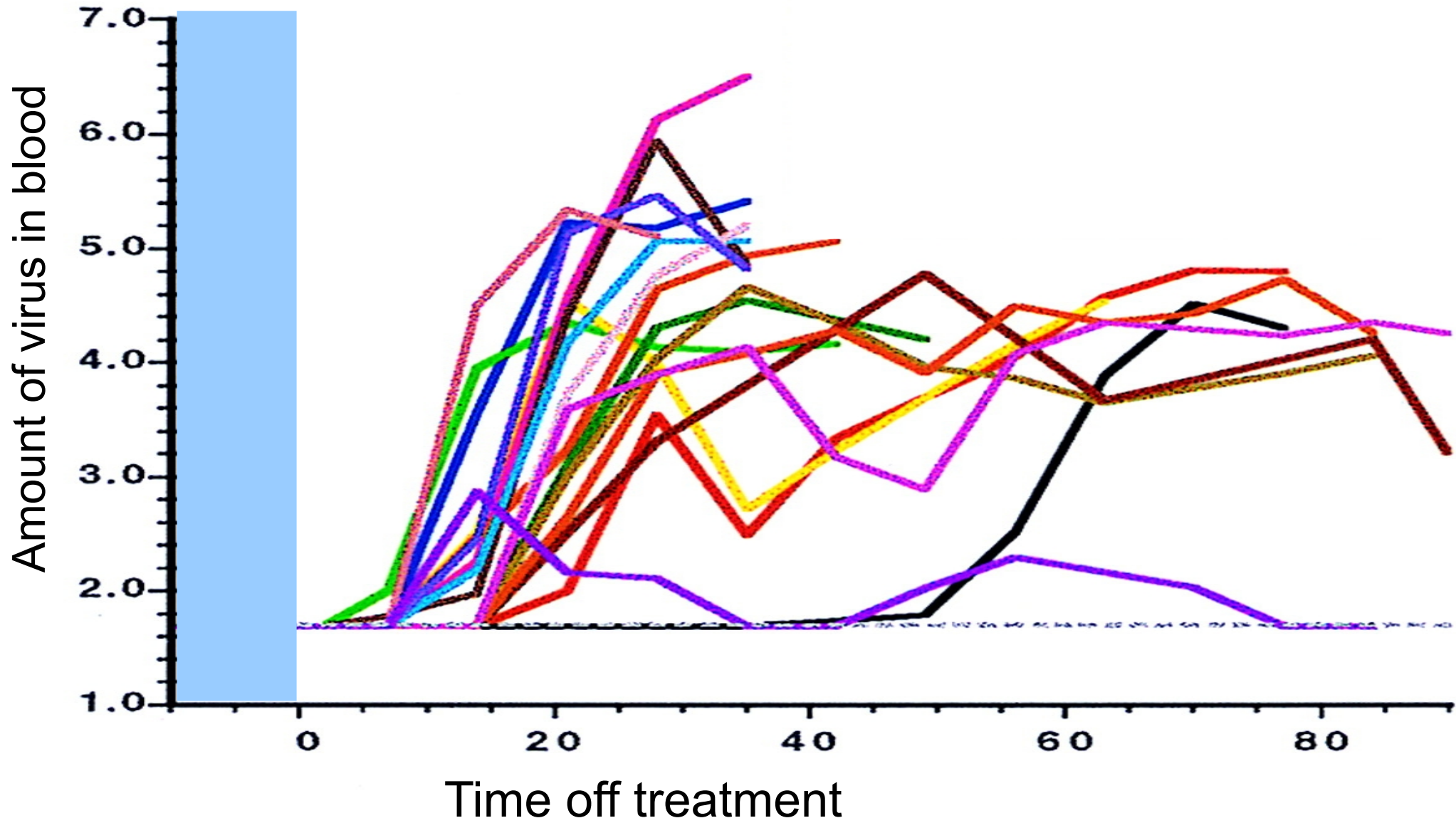
**few years to recover**

Kouyos et al 2011



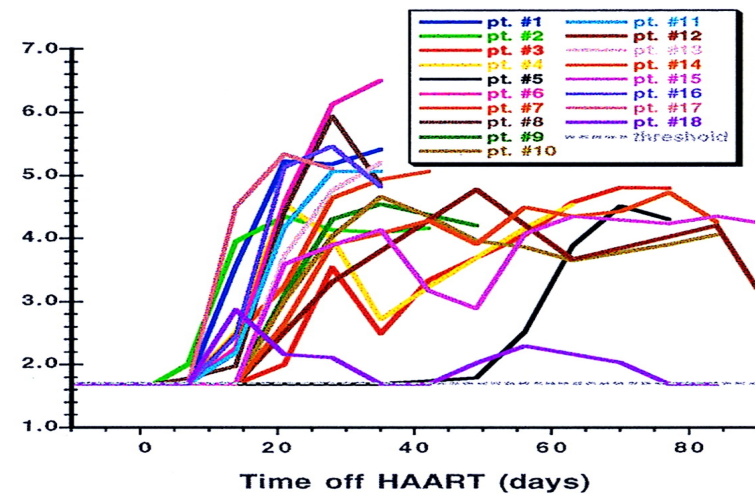
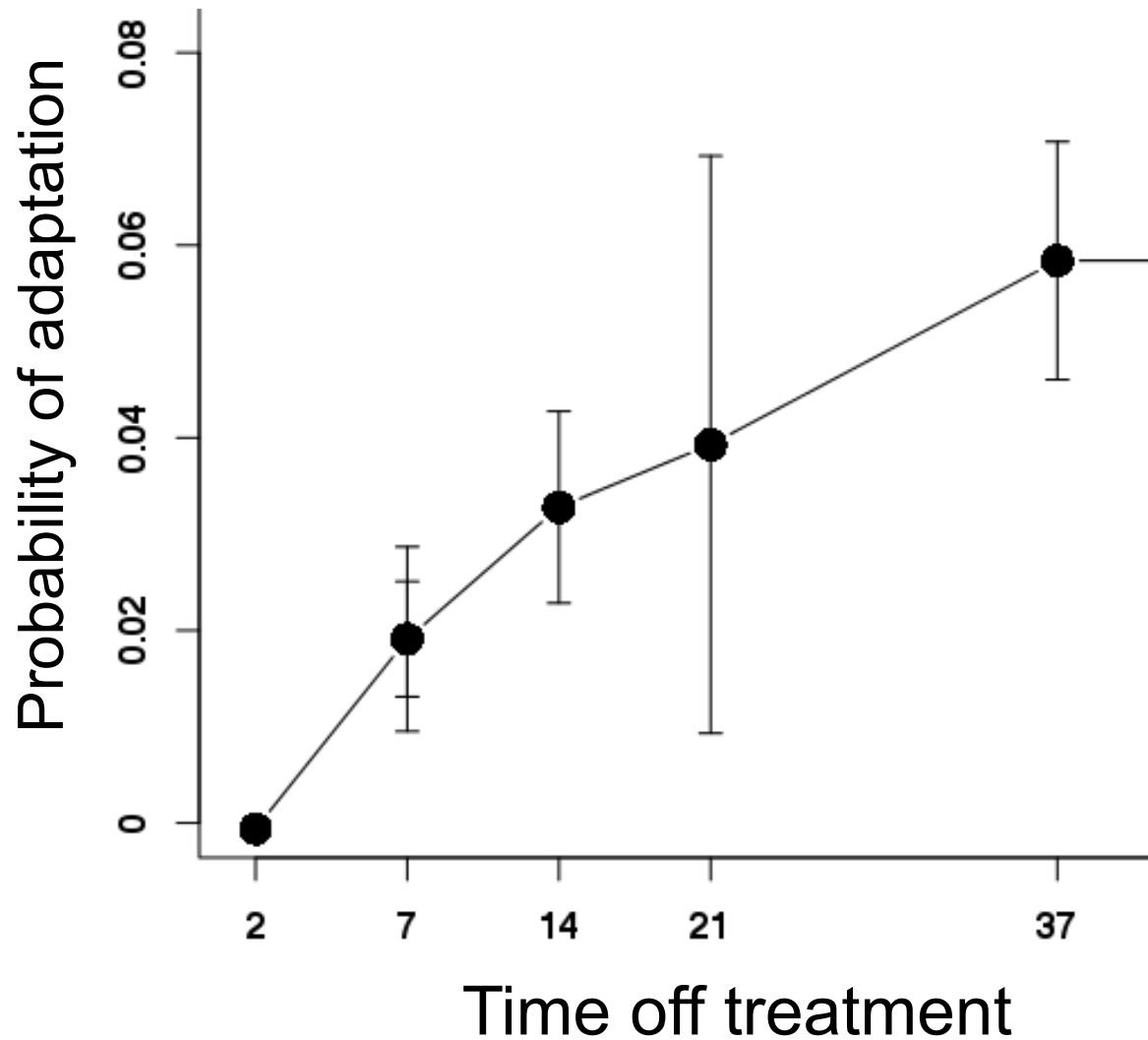


# Examples



# Examples

## Adaptive potential during treatment interruption

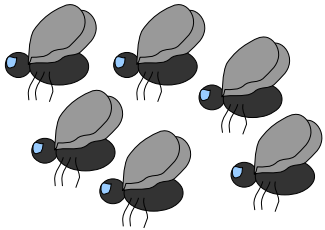


# Examples

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**never recovers**

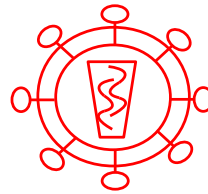
Karasov, Messer, Petrov 2010



HIV

**few years to recover**

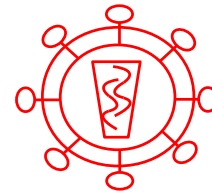
Kouyos et al 2011



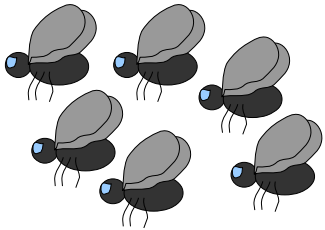
HIV

**days - weeks to recover**

Pennings 2012

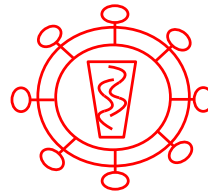


*Drosophila melanogaster*  
**never recovers**  
Karasov, Messer, Petrov 2010



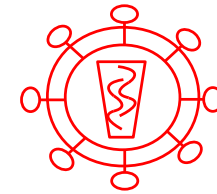
Bottleneck size 1  
Neutral diversity

HIV  
**few years to recover**  
Kouyos et al 2011



Larger bottleneck  
Resistance muts

HIV  
**days - weeks to recover**  
Pennings 2012



# Theoretical expectations

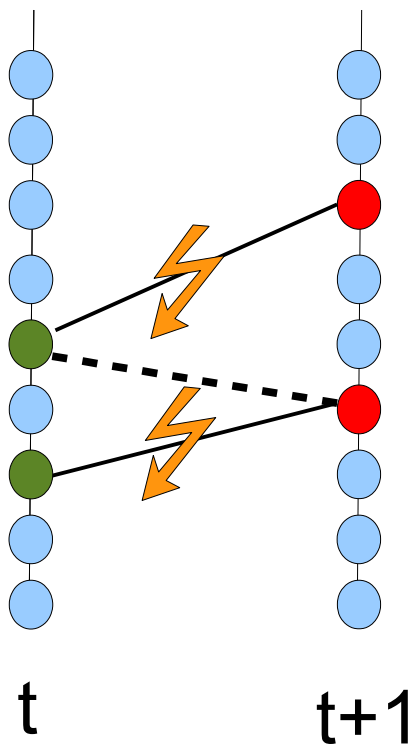
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Neutrality

# Theoretical expectations

## Neutrality

$$H_{t+1} = H_t \left(1 - \frac{1}{N}\right) + 2u$$



# Theoretical expectations

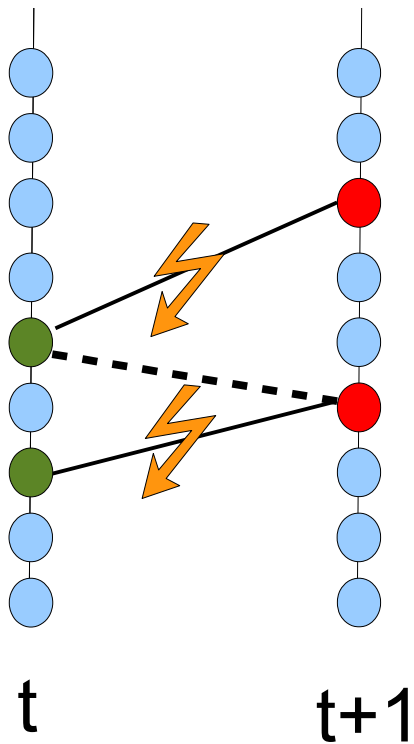
## Neutrality

$$H_{t+1} = H_t \left(1 - \frac{1}{N}\right) + 2u$$

$$\frac{dH}{dt} = -\left(\frac{1}{N}\right)H + 2u$$

$$H_0 = 0$$

$$H_t = 2Nu \left(1 - e^{-\left(\frac{1}{N}t\right)}\right)$$



# Theoretical expectations

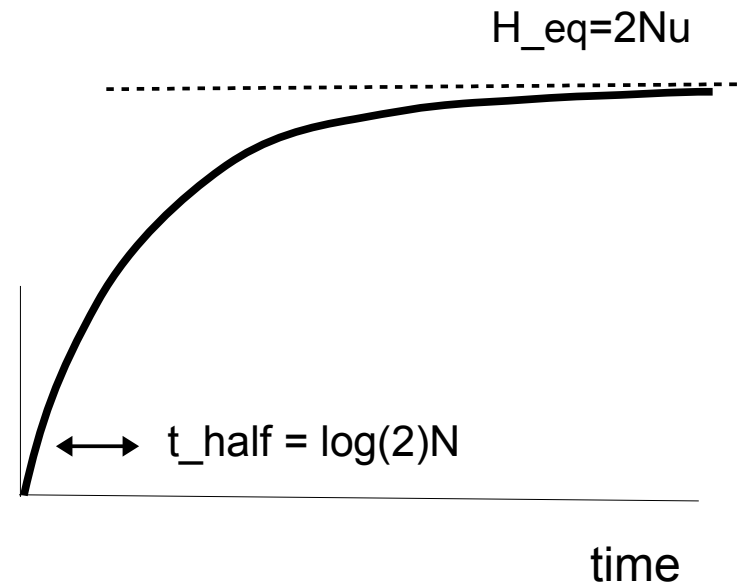
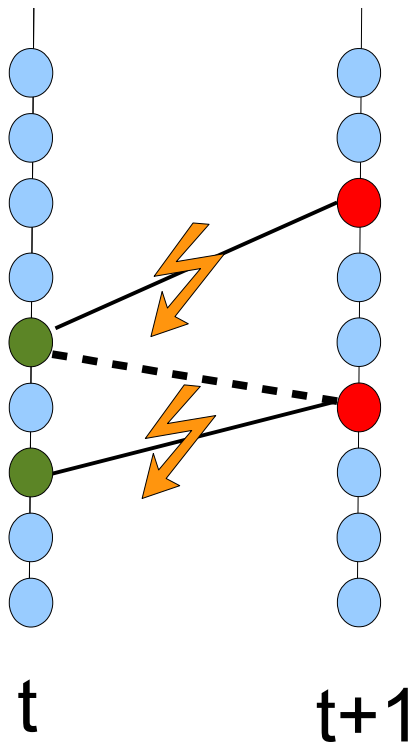
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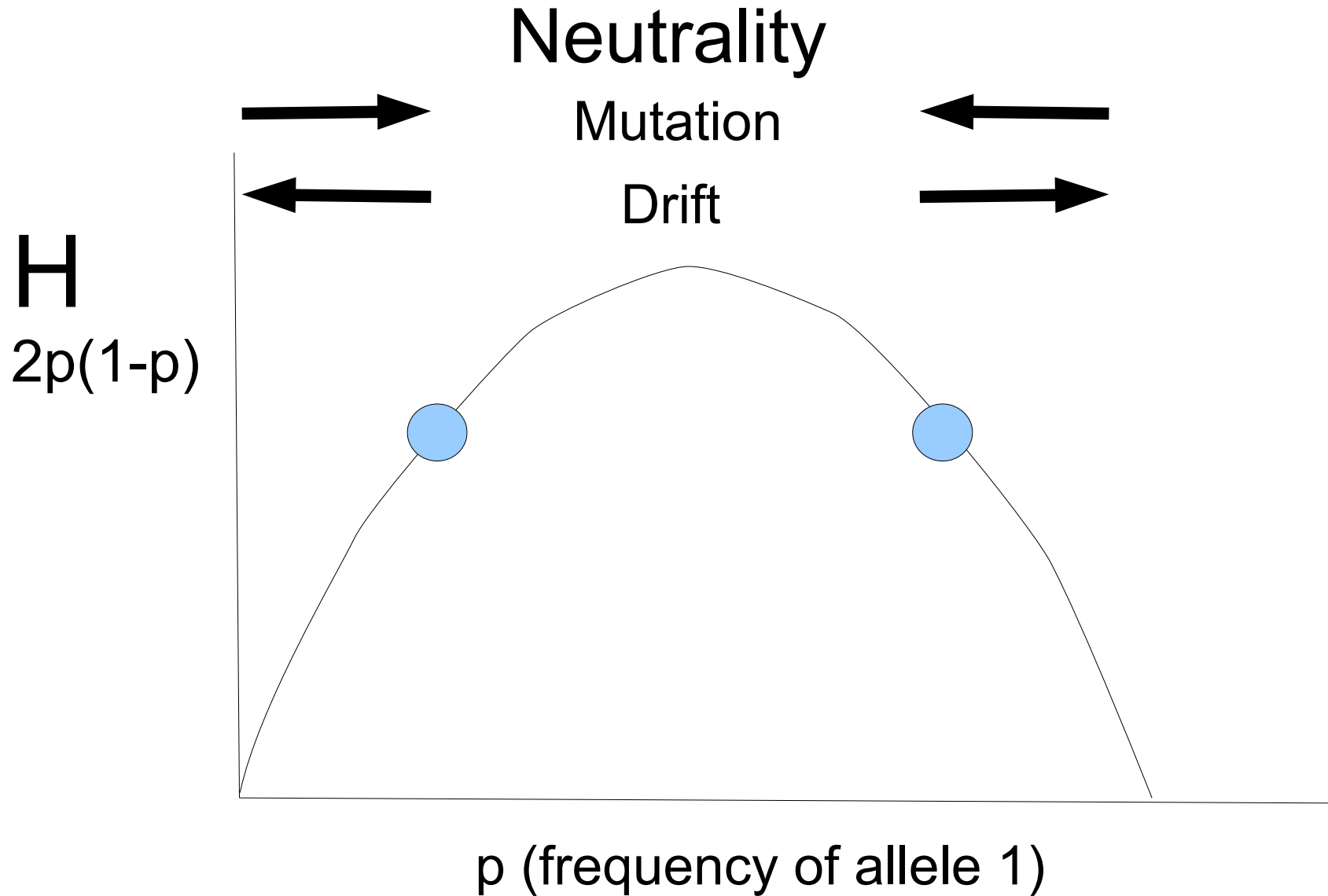
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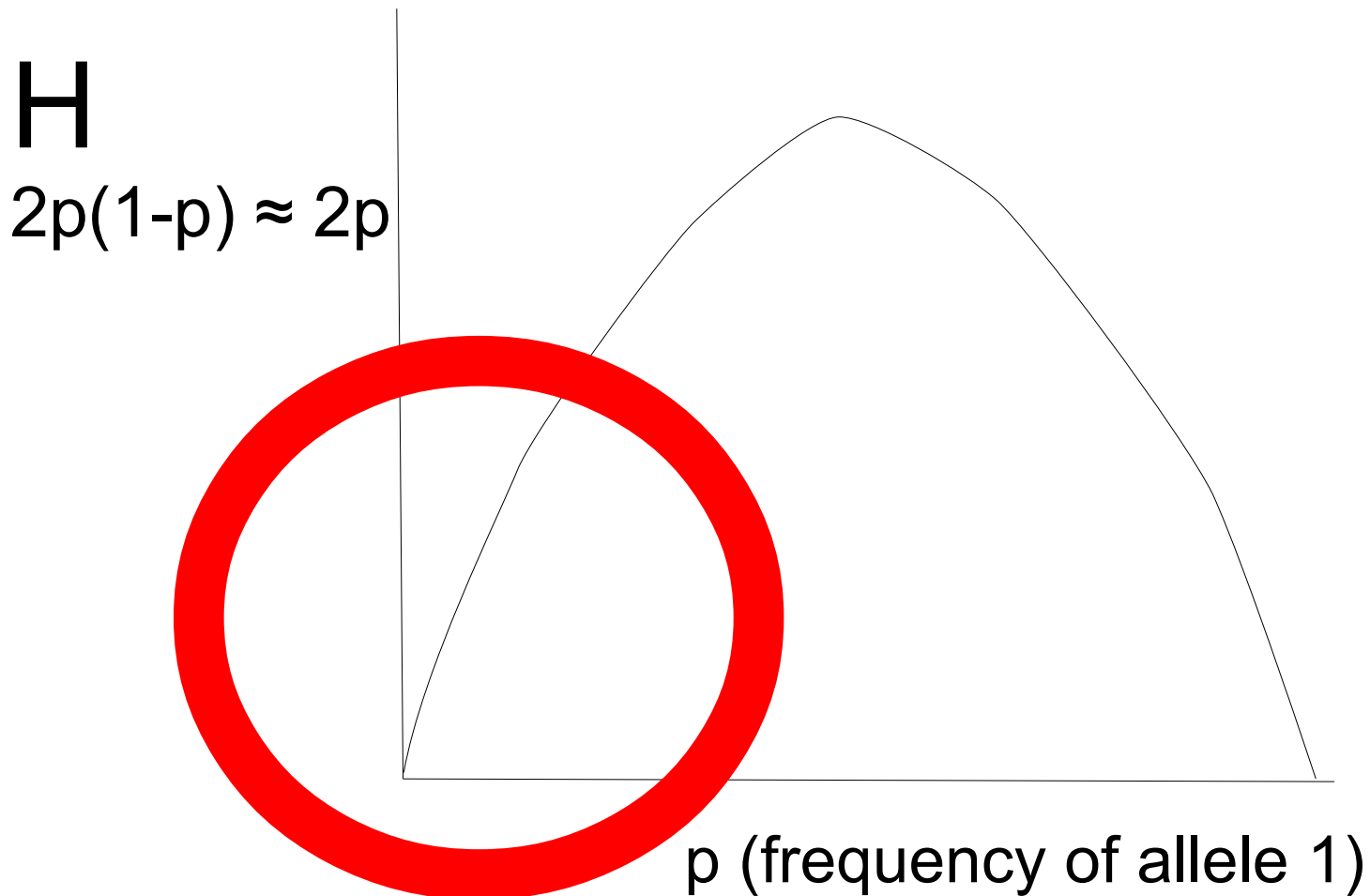


# Theoretical expectations



# Theoretical expectations

## Strong selection



# Theoretical expectations

Strong selection

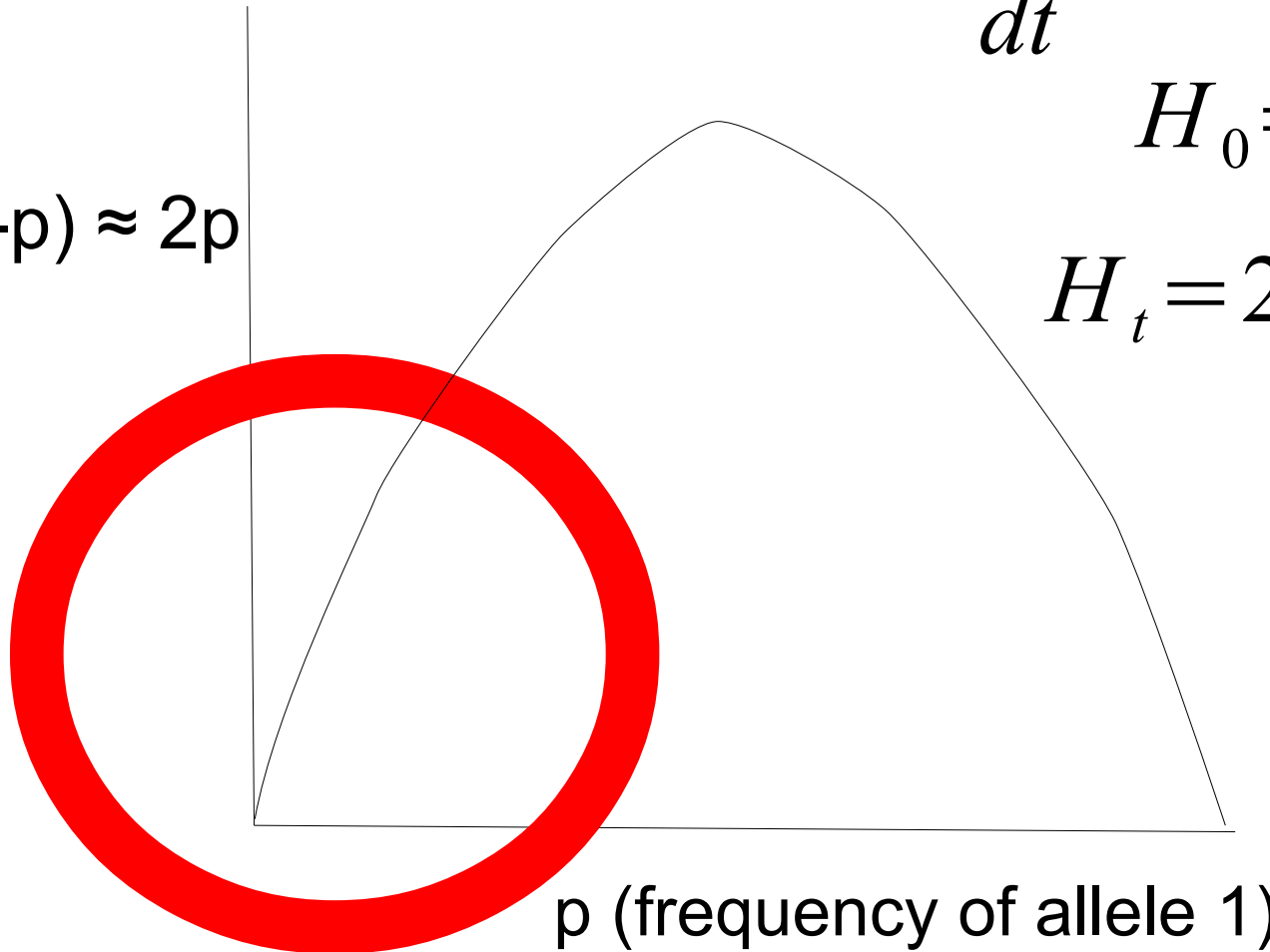
$$\frac{dH}{dt} = -sH + 2u$$

$$H_0 = 0$$

$$H_t = 2u/s (1 - e^{-(st)})$$

H

$$2p(1-p) \approx 2p$$

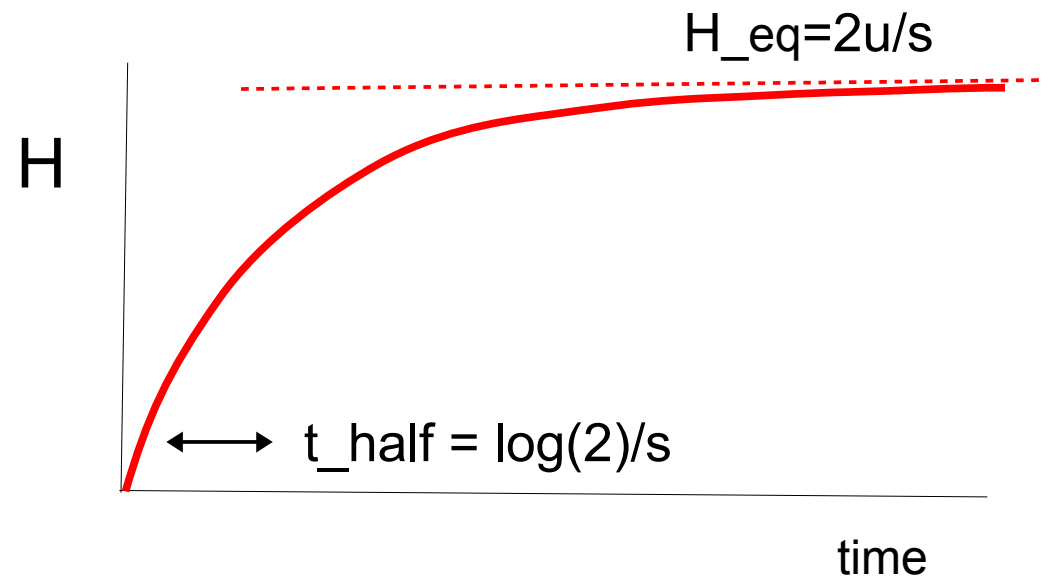


# Theoretical expectations

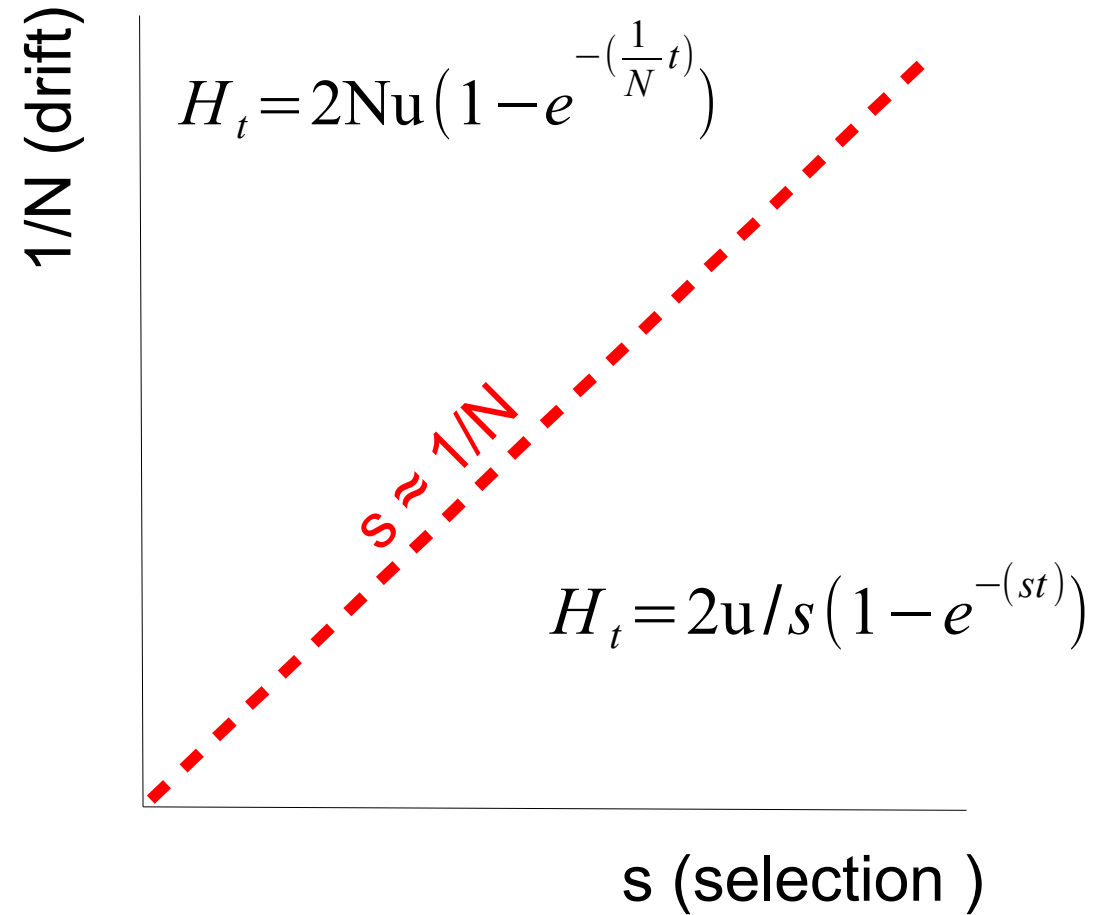
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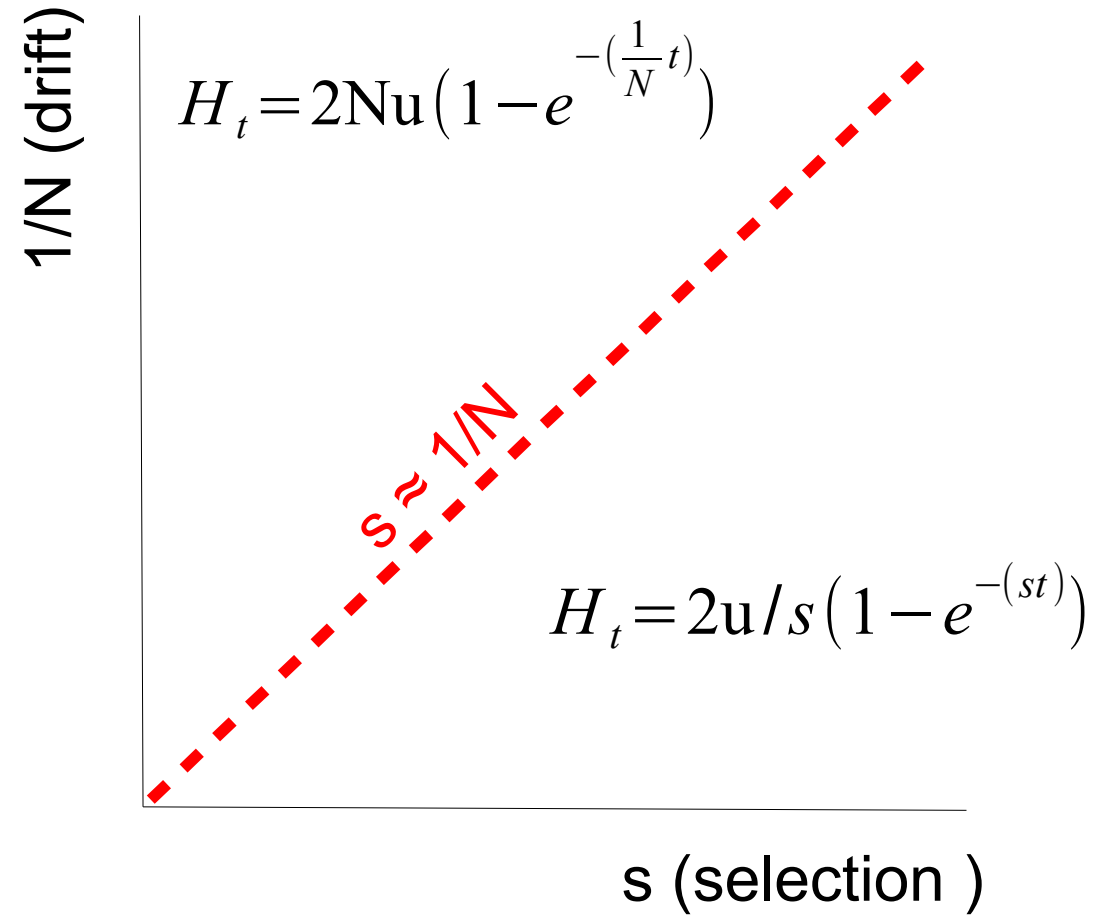
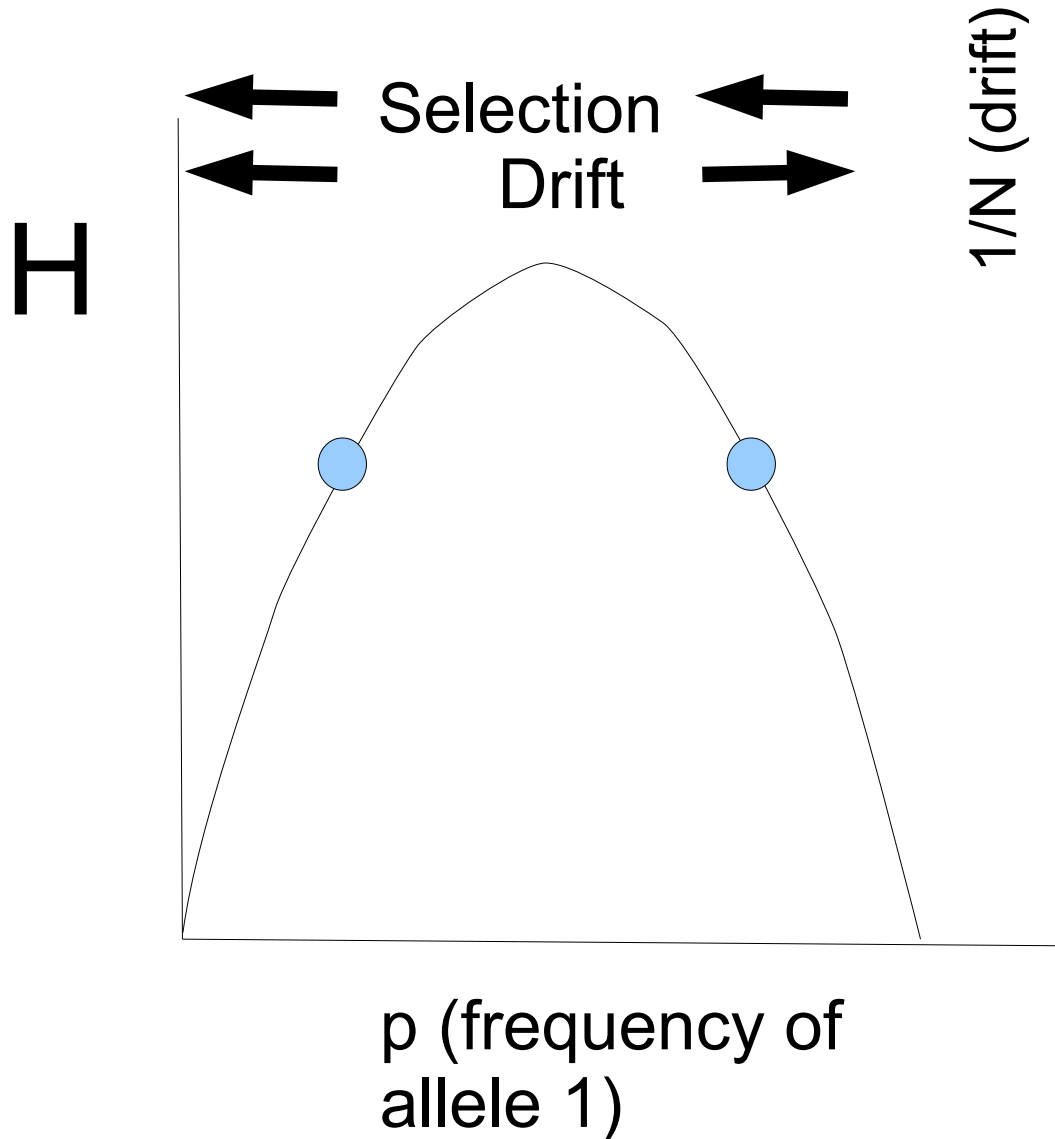
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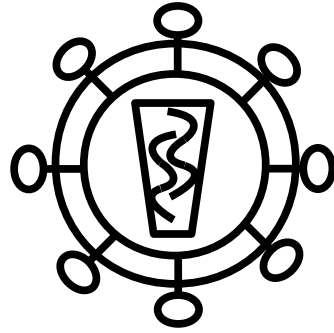
# Theoretical expectations



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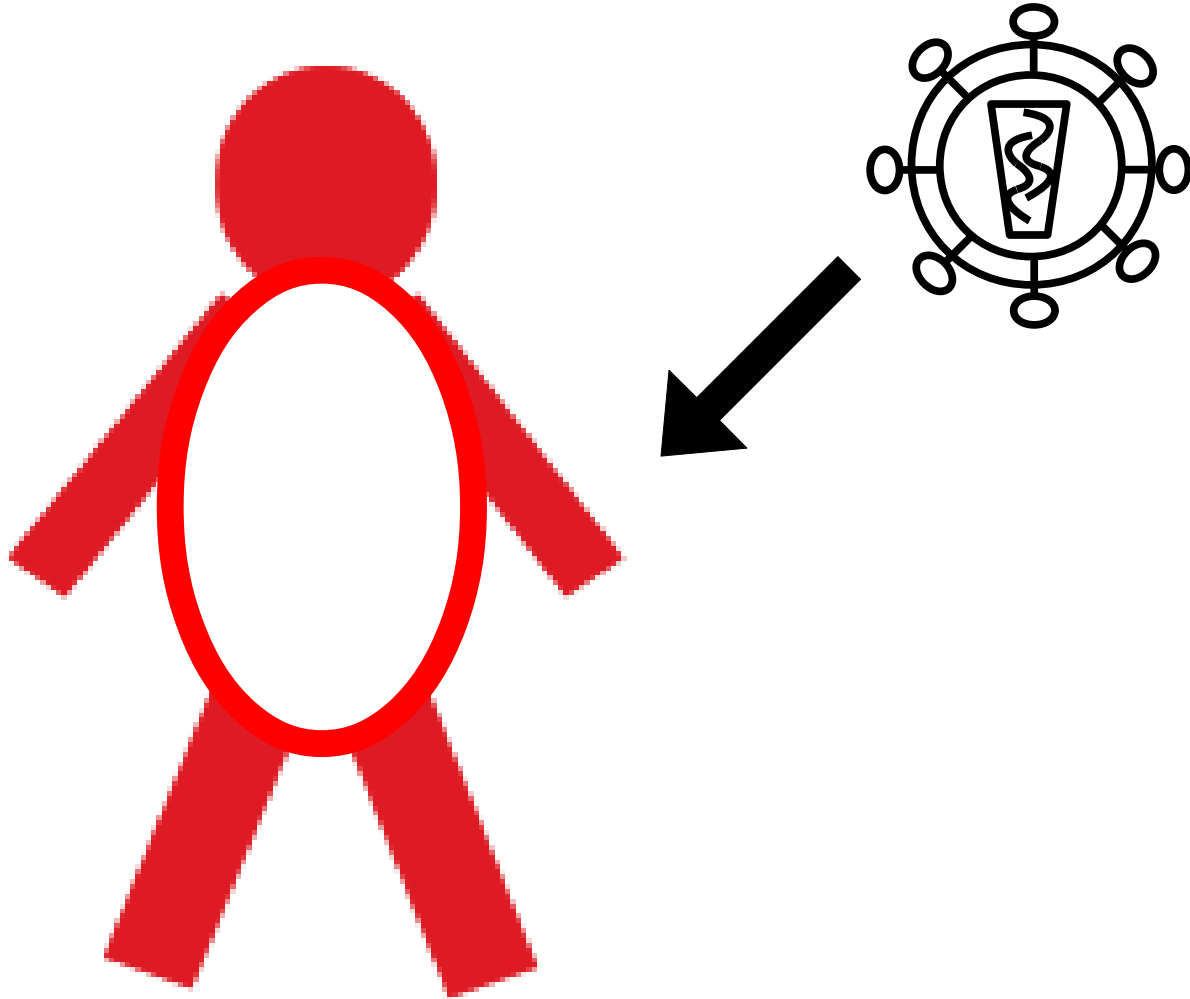


# DATA: HIV



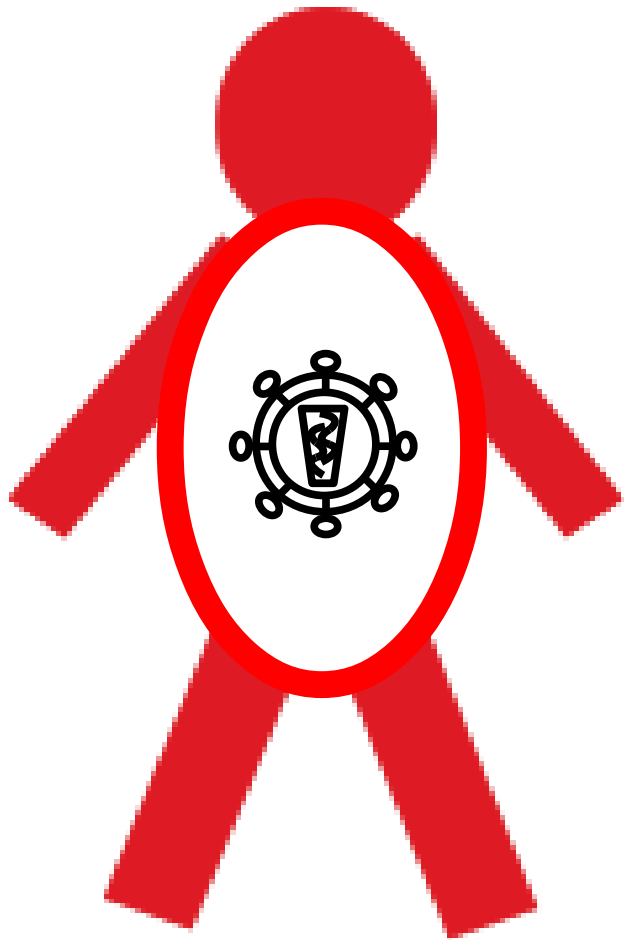
# DATA: HIV

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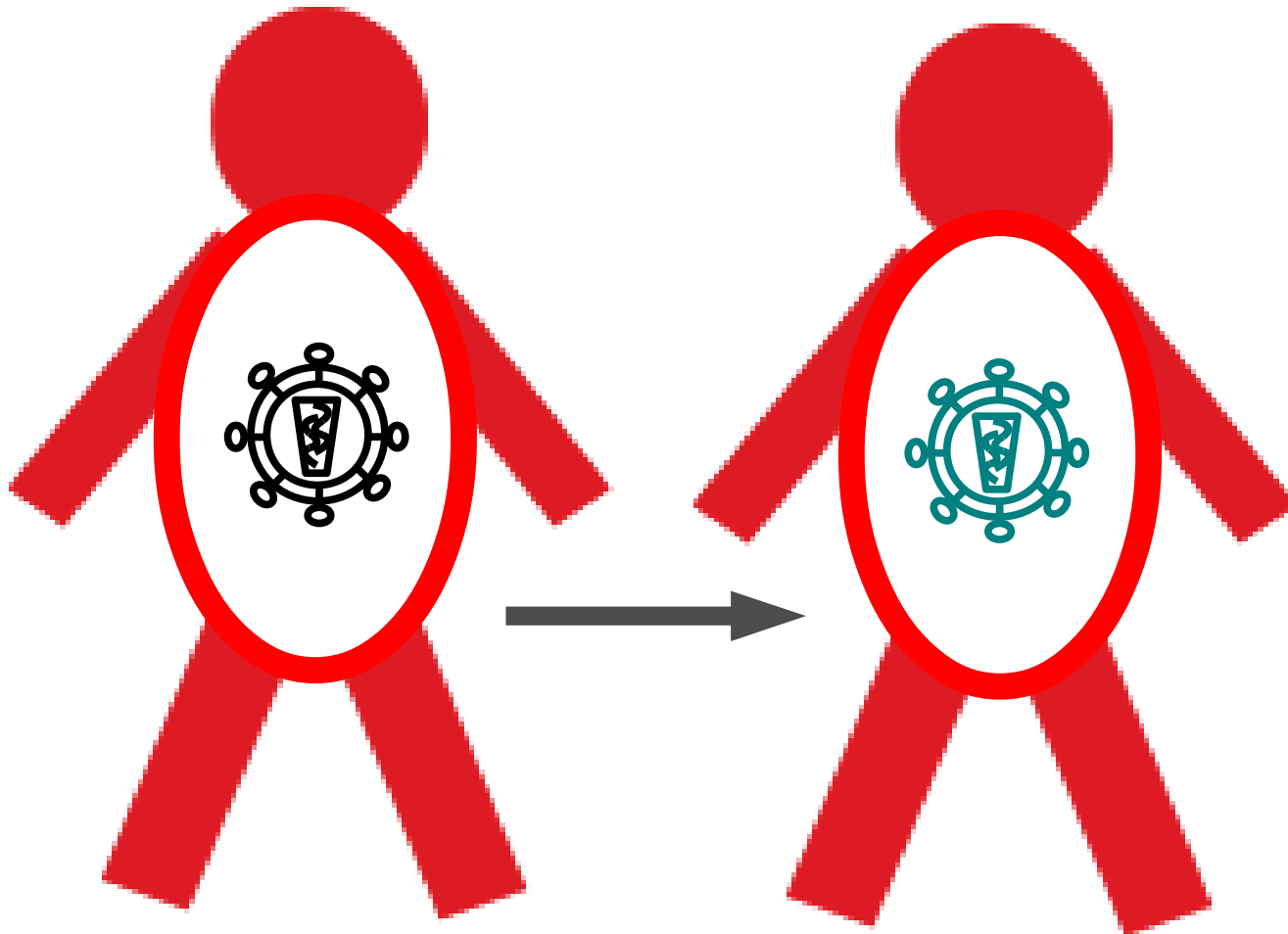




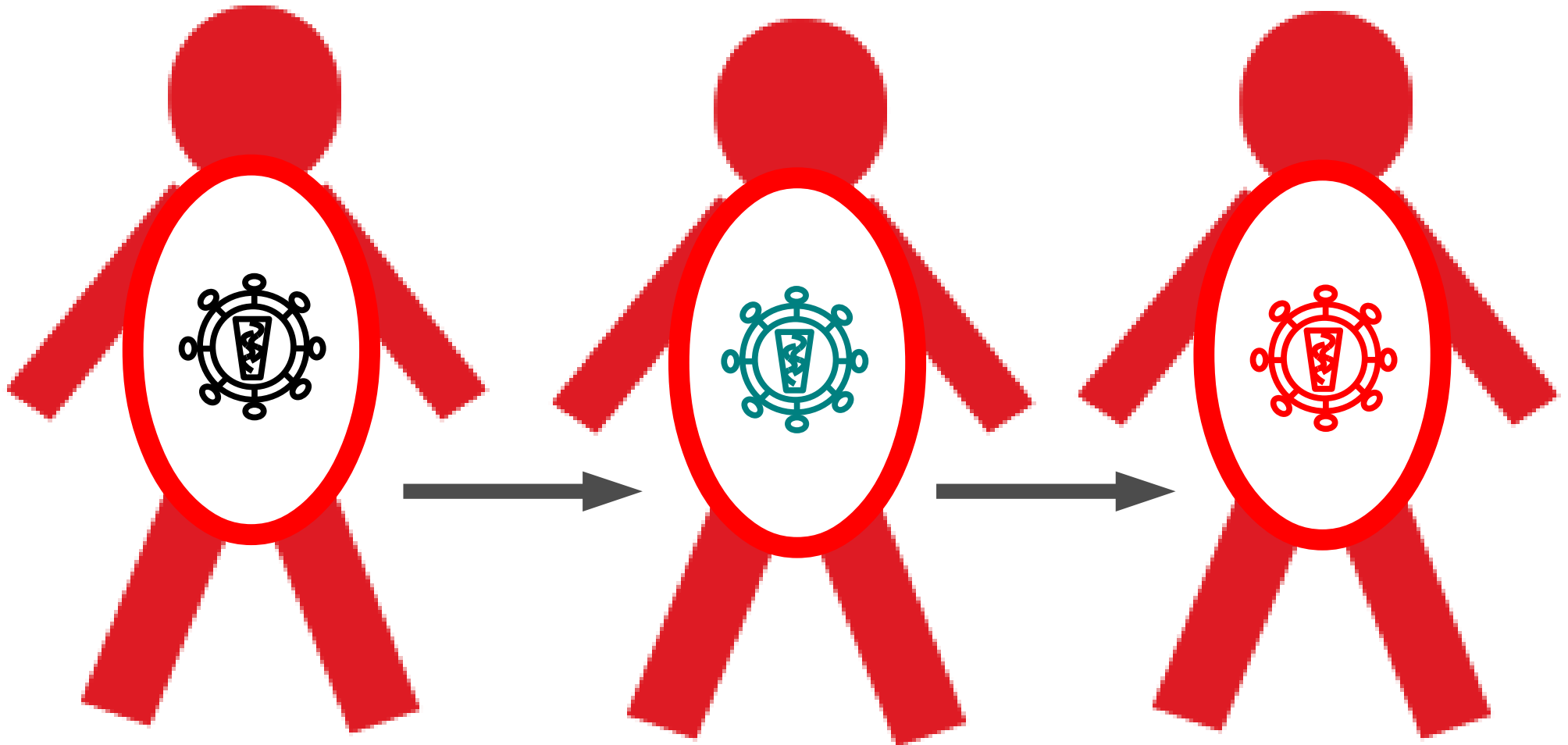
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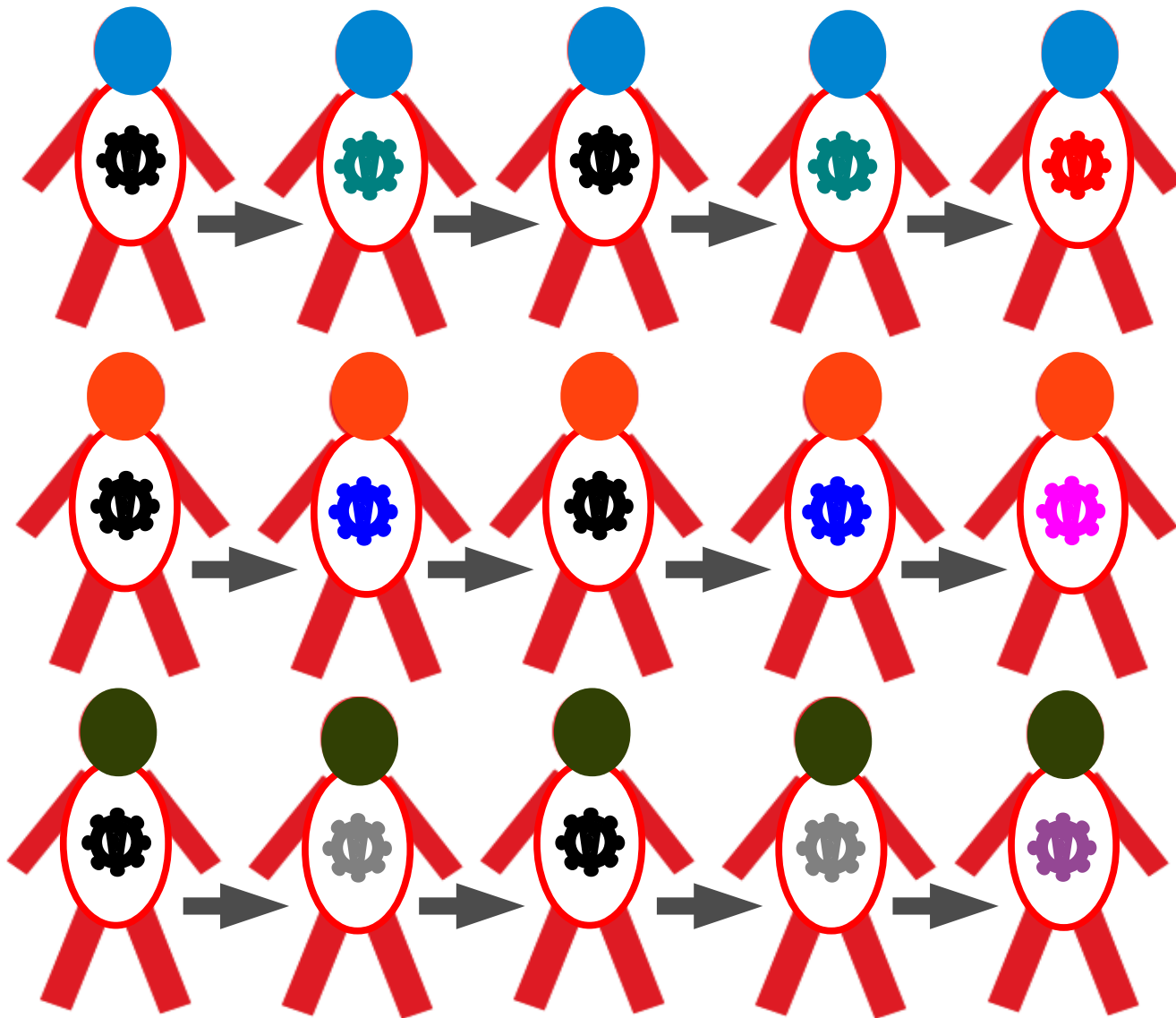
# DATA: HIV



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# DATA: HIV



# DATA: HIV

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TCCCTAGT**A**TAGTCTCT

susceptible virus



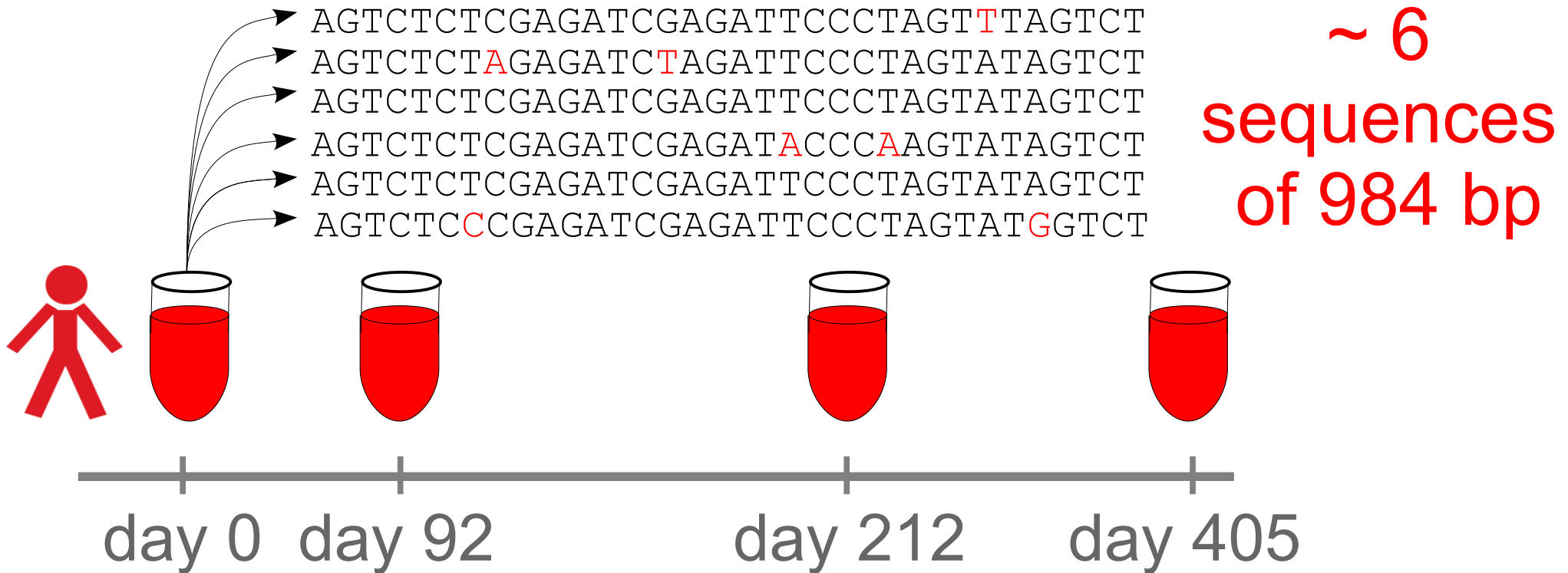
TCCCTAGT**T**TAGTCTCT

resistant against drug X



# Bachelor 2000 dataset

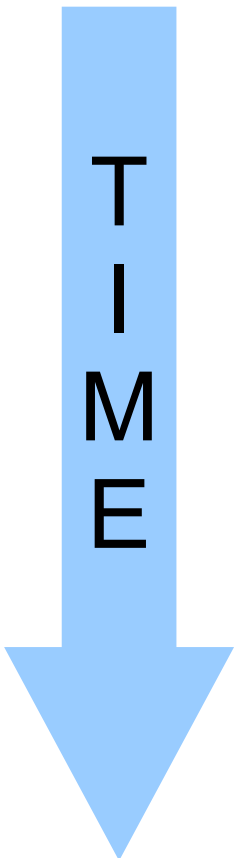
## 118 treated patients



~ 4 time points/patient

# Example: patient 89

P00089





# Example: patient 89

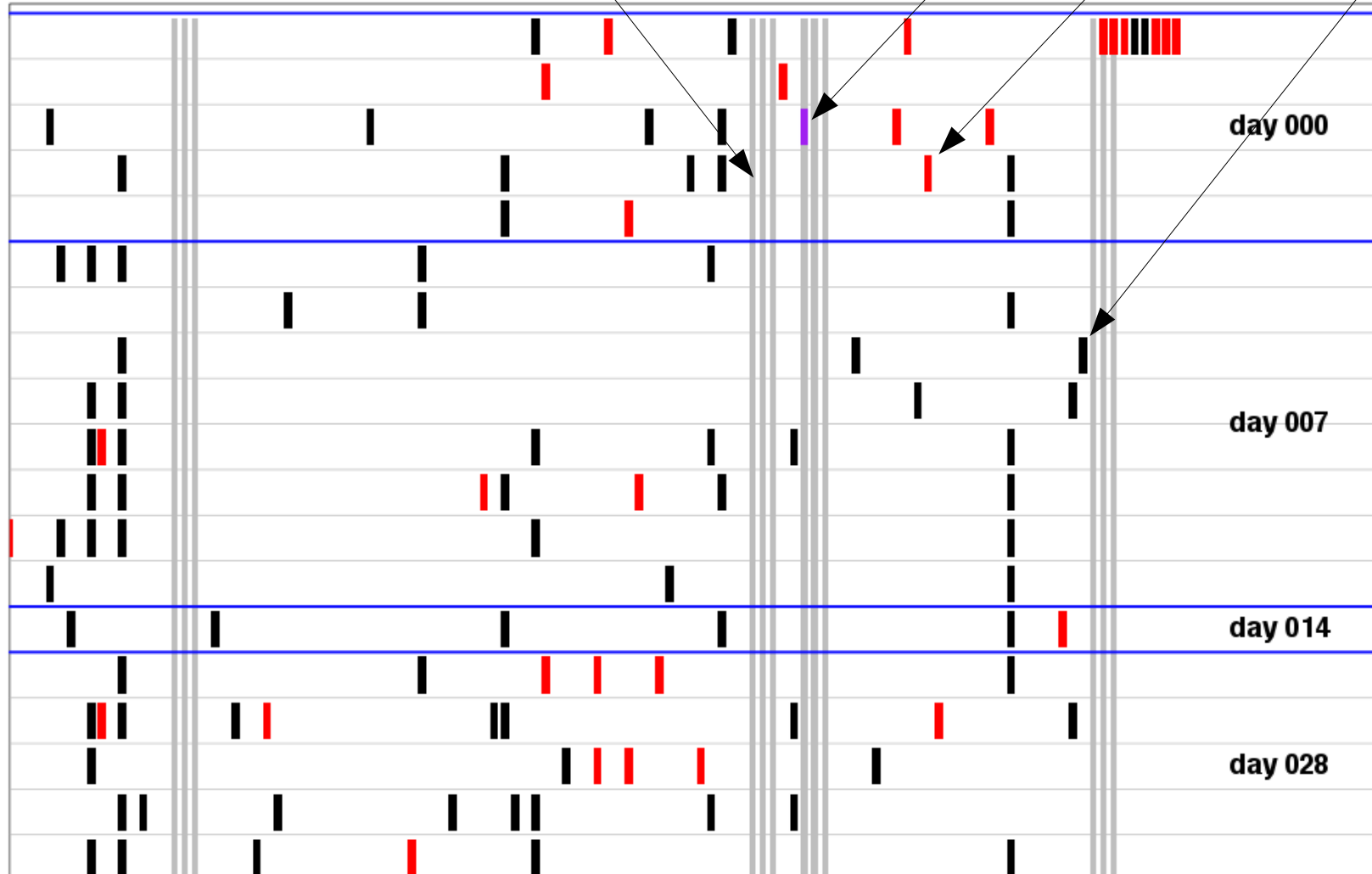
purple:  
resistance

red:  
non syn.  
probably  
deleterious

grey:  
potential for  
resistance

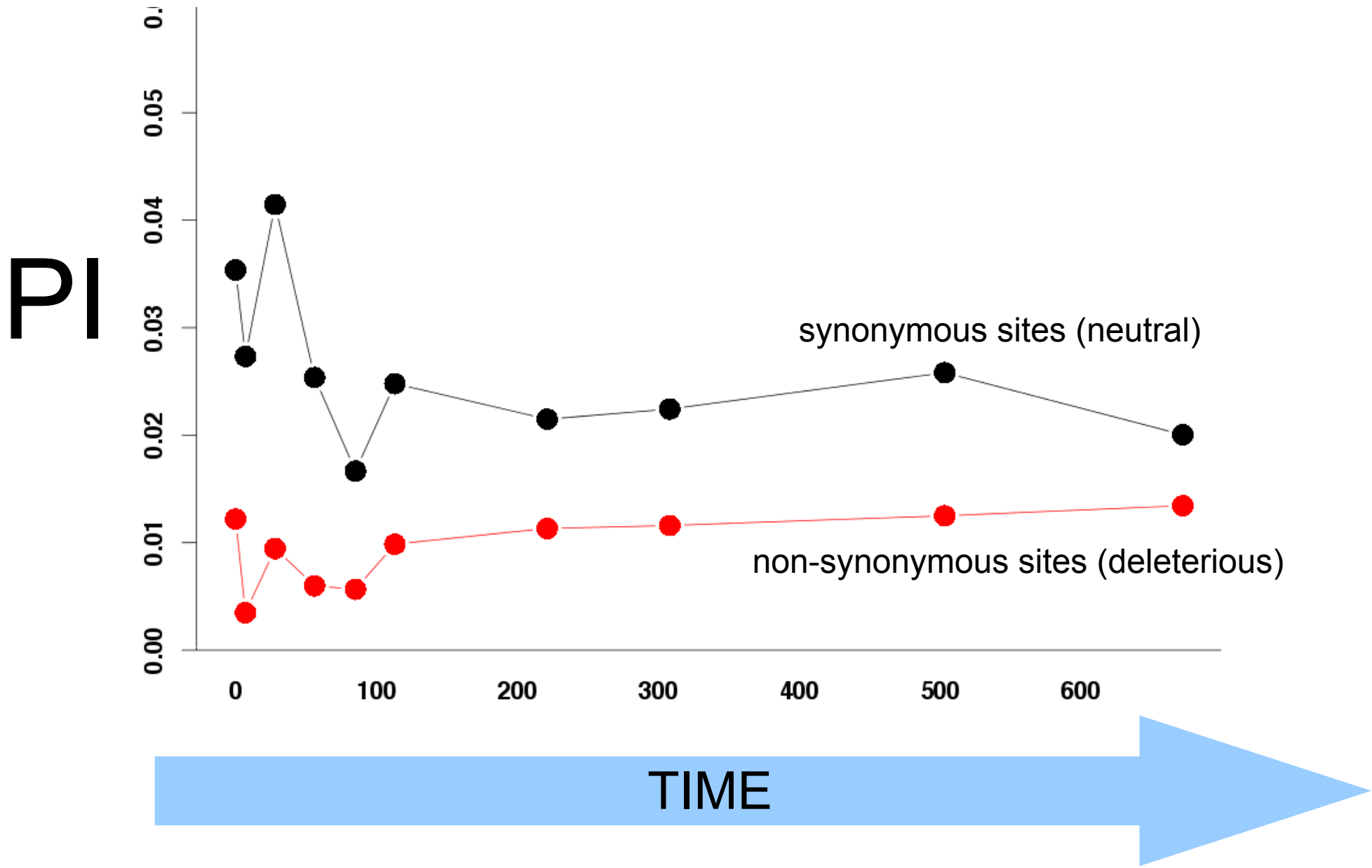
P00089

black:  
synonymous  
probably  
harmless

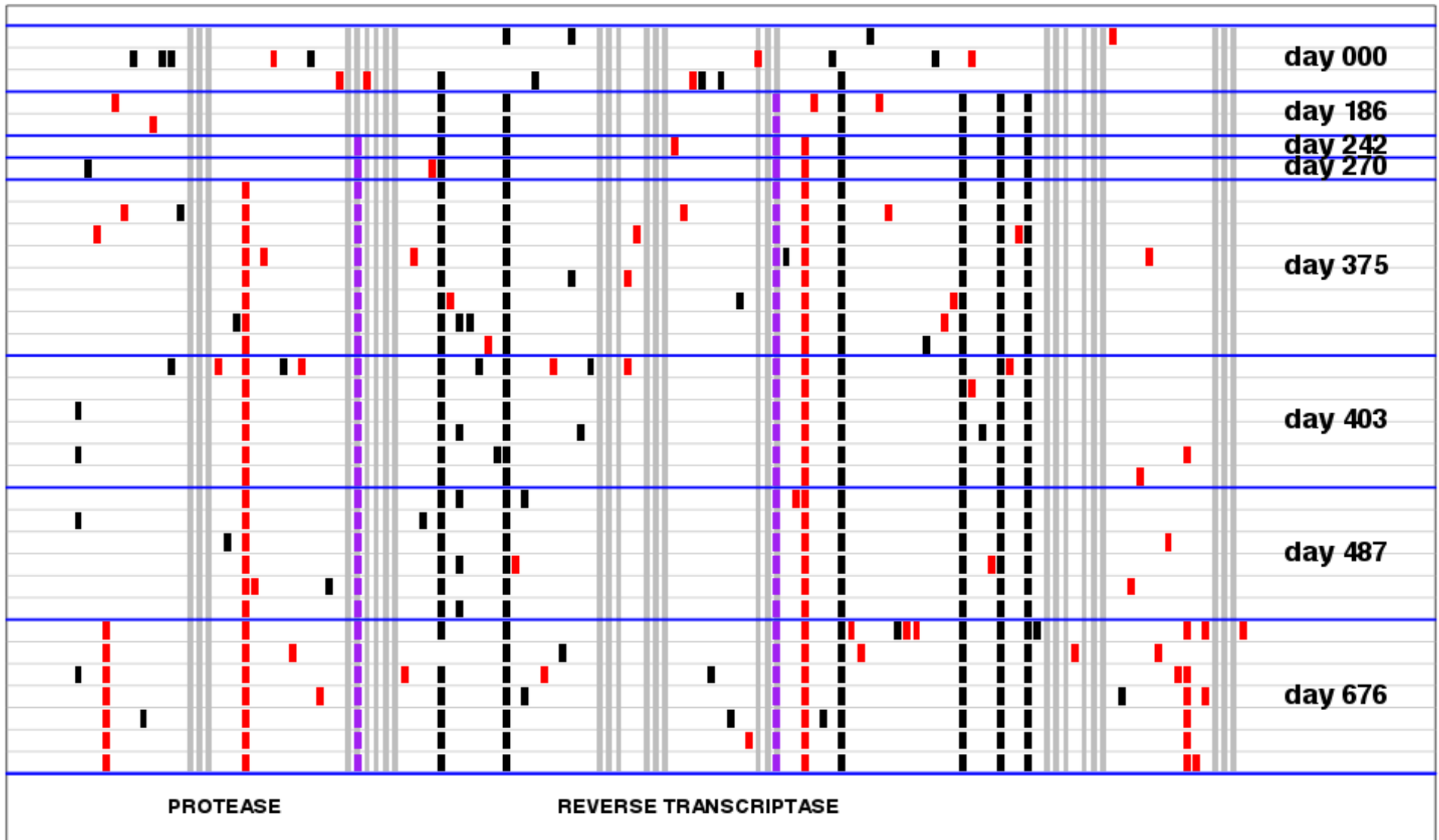


T  
I  
M  
E

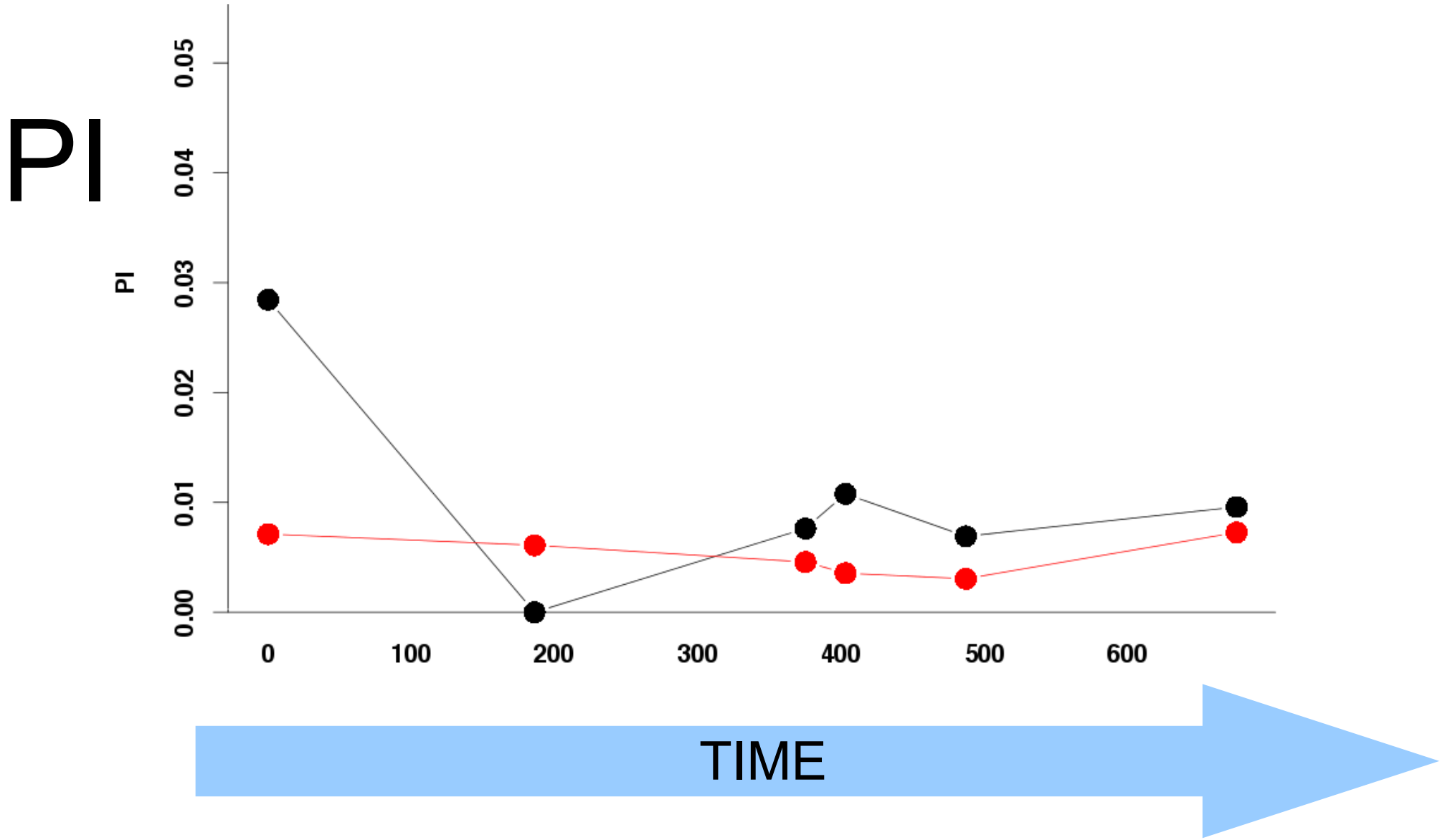
# Example: patient 89



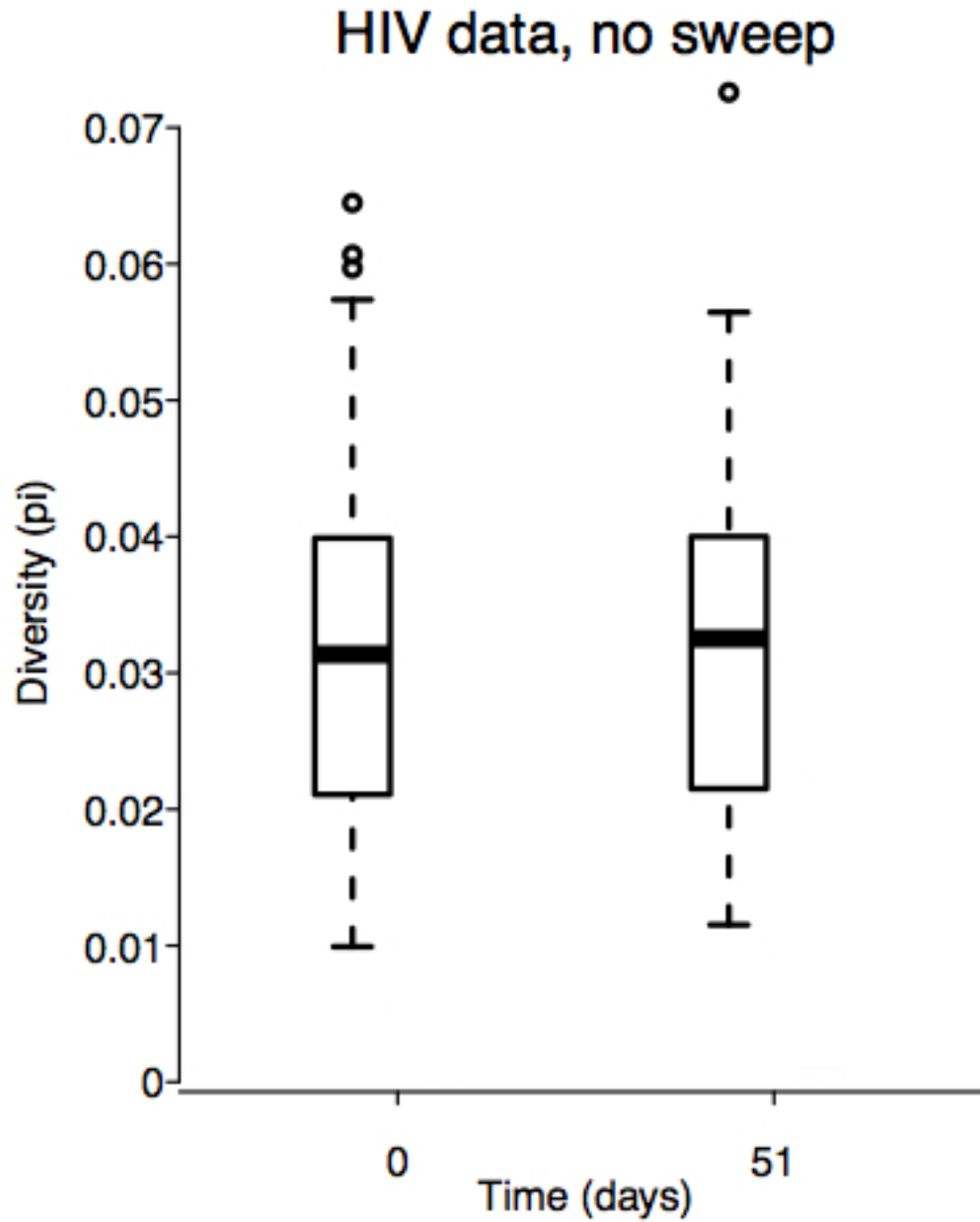
# Example: patient 94



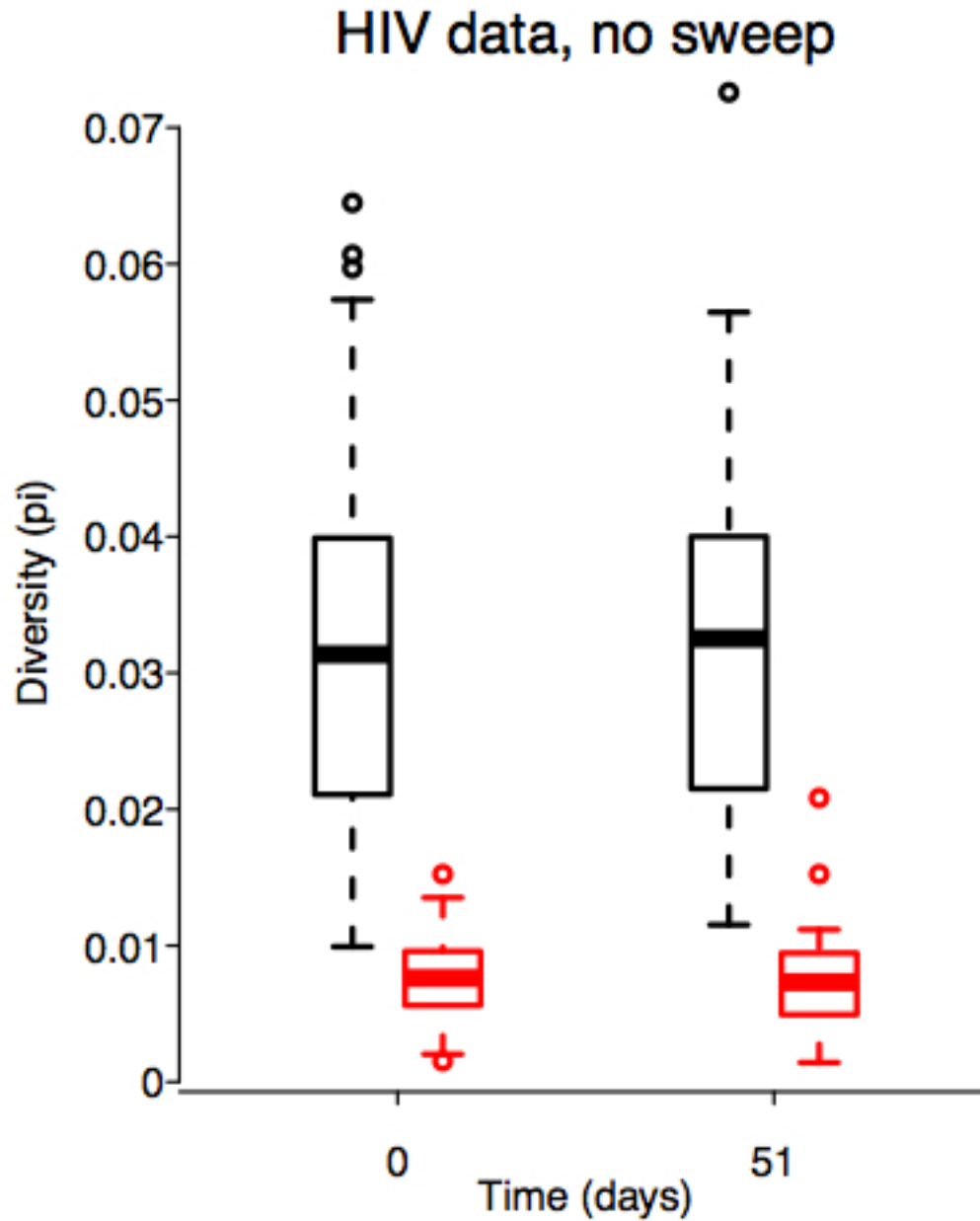
# Example: patient 94



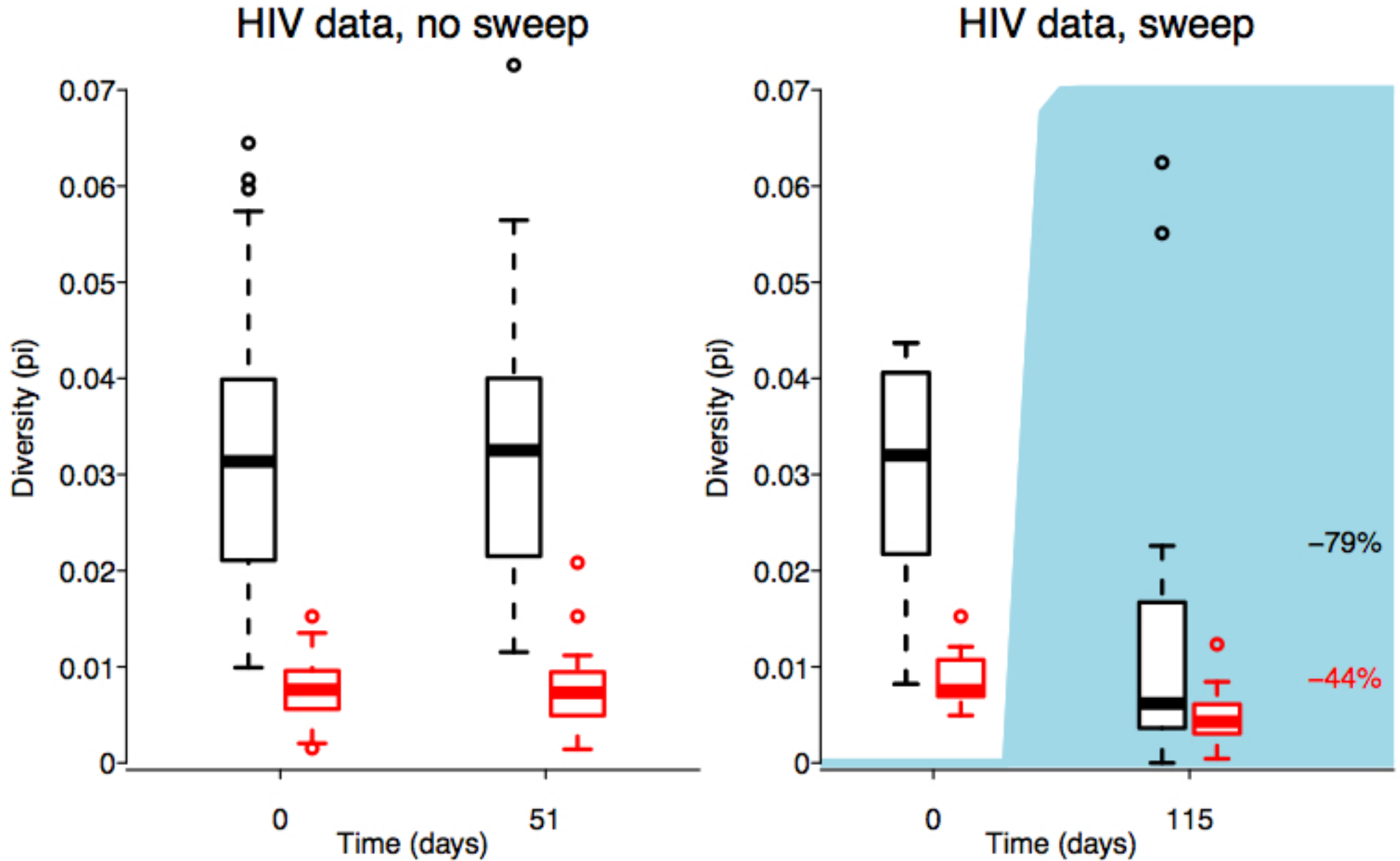
# Effect of fixation on pi



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# Effect of fixation on pi



Fixation of resistance mutation reduces surrounding genetic diversity.

How does it recover?

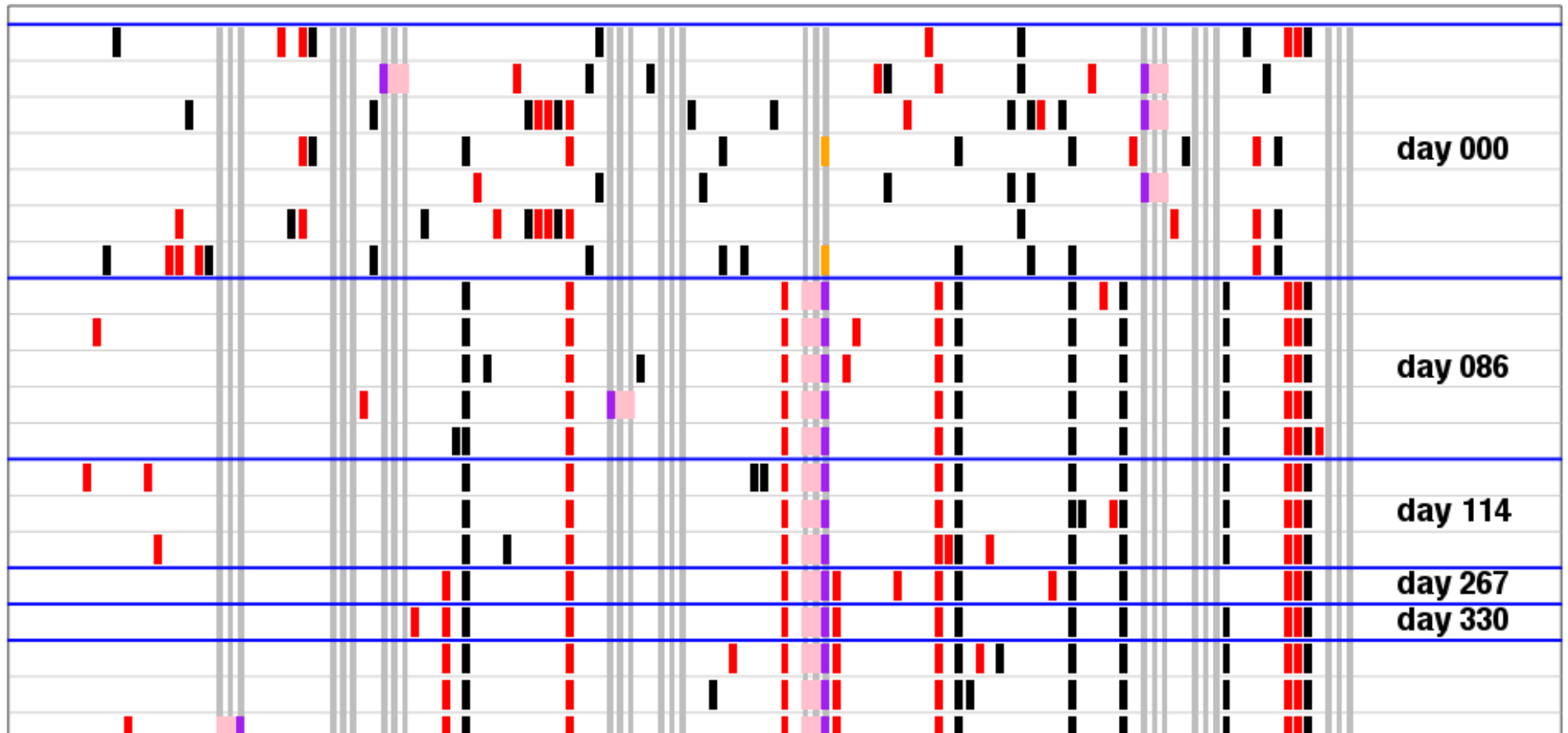
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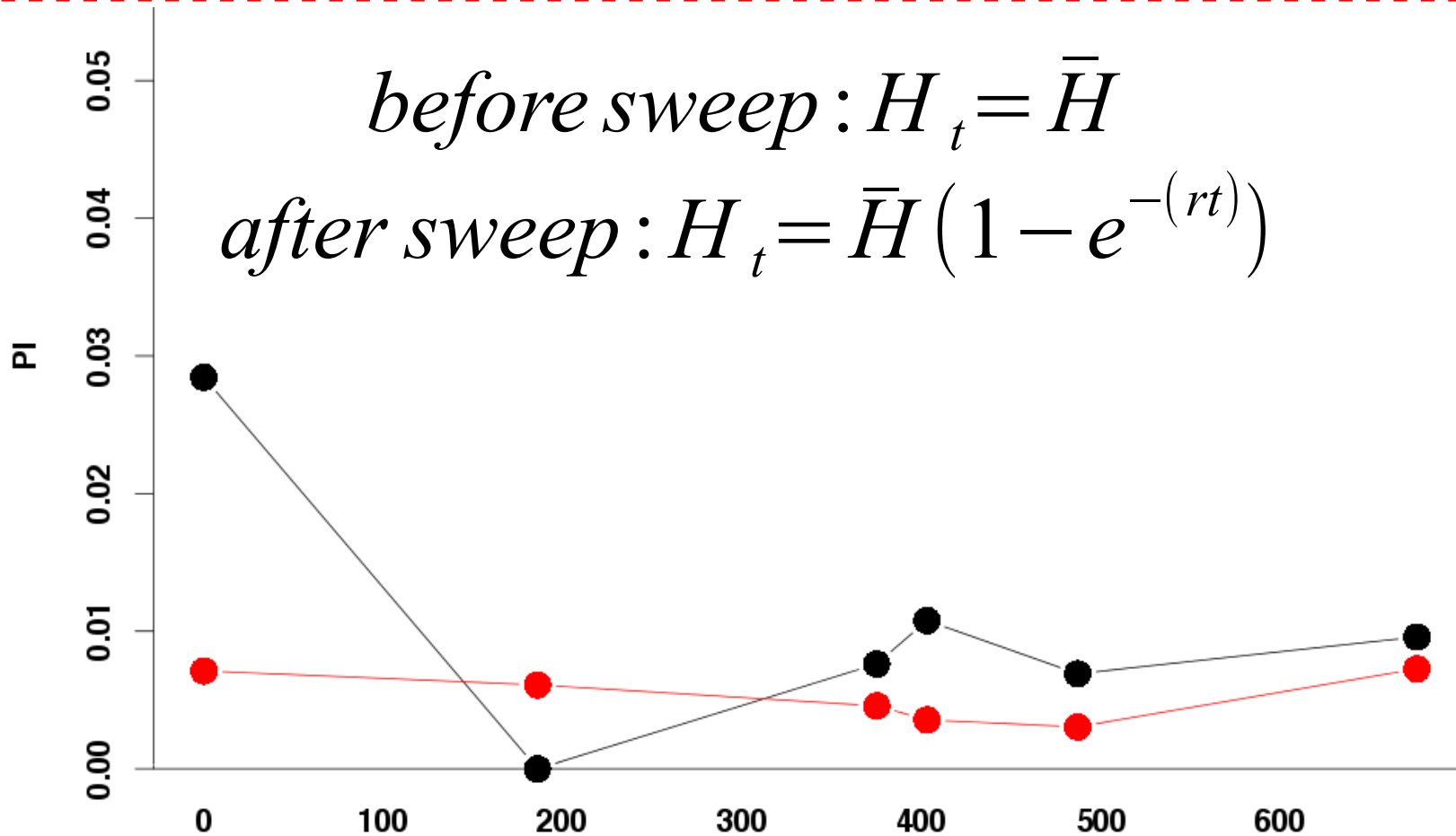
Only use patients with complete, hard sweep



Fixation of resistance mutation reduces surrounding genetic diversity.

How does it recover?

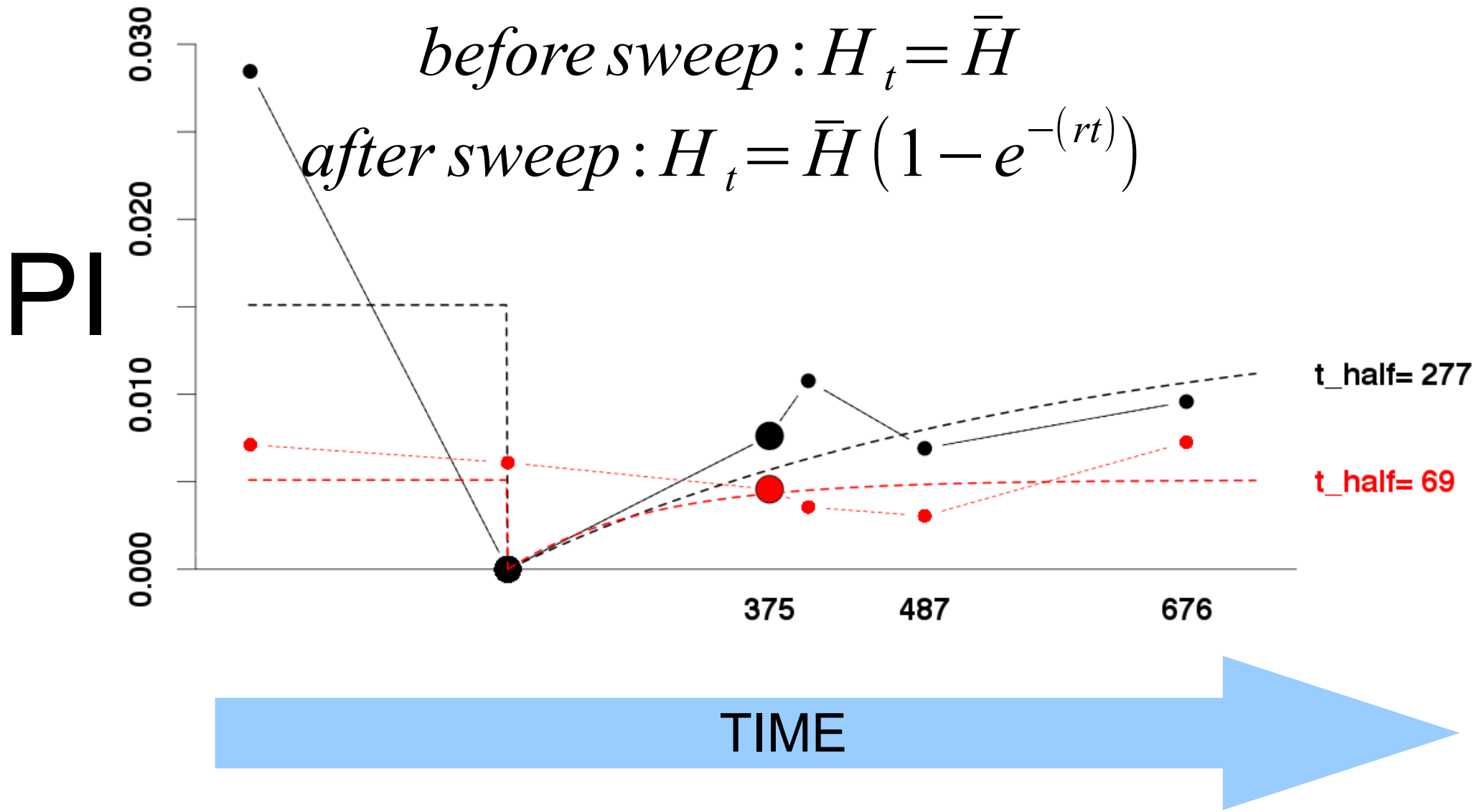
PI



TIME

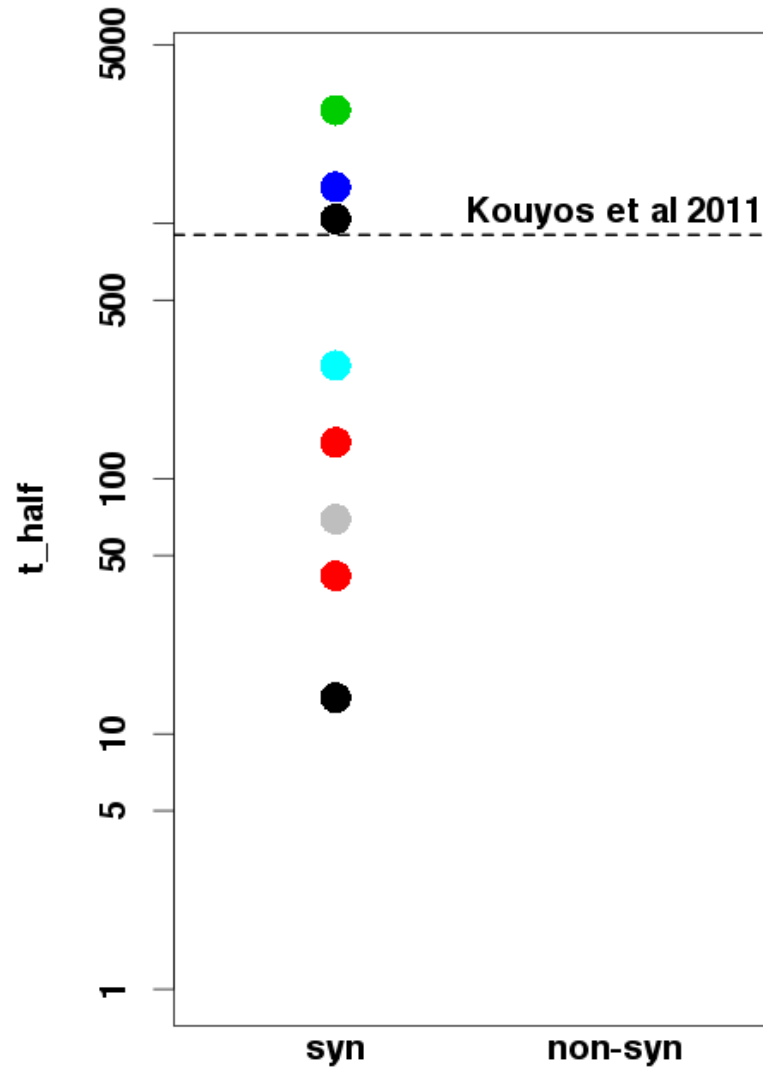
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## How does it recover?



# Estimated $t_{half}$ values

Recovery is relatively fast



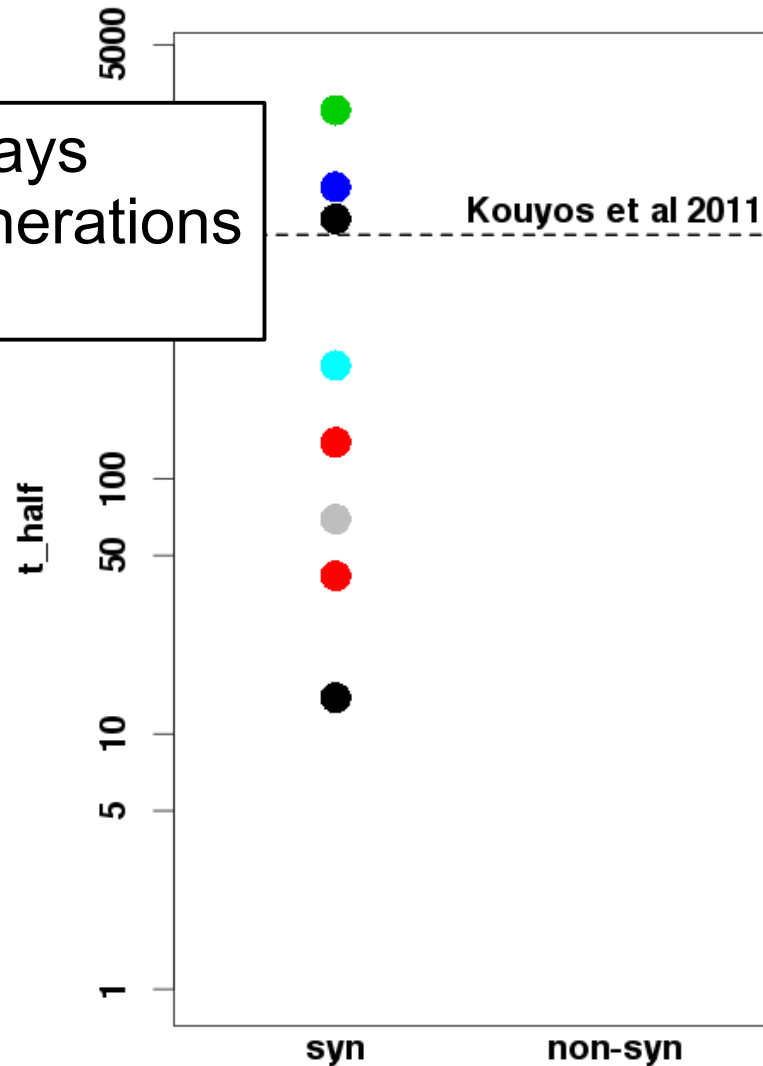
# Estimated $t_{half}$ values

Recovery is relatively fast

median  $t_{half}$  = 92 days  
 $\approx$  60 generations  
 $\rightarrow N_e \approx 90!!$

$H_{pred} \approx 0.005$

$H_{obs} \approx 0.025$



# Estimated $t_{half}$ values

Recovery is relatively fast

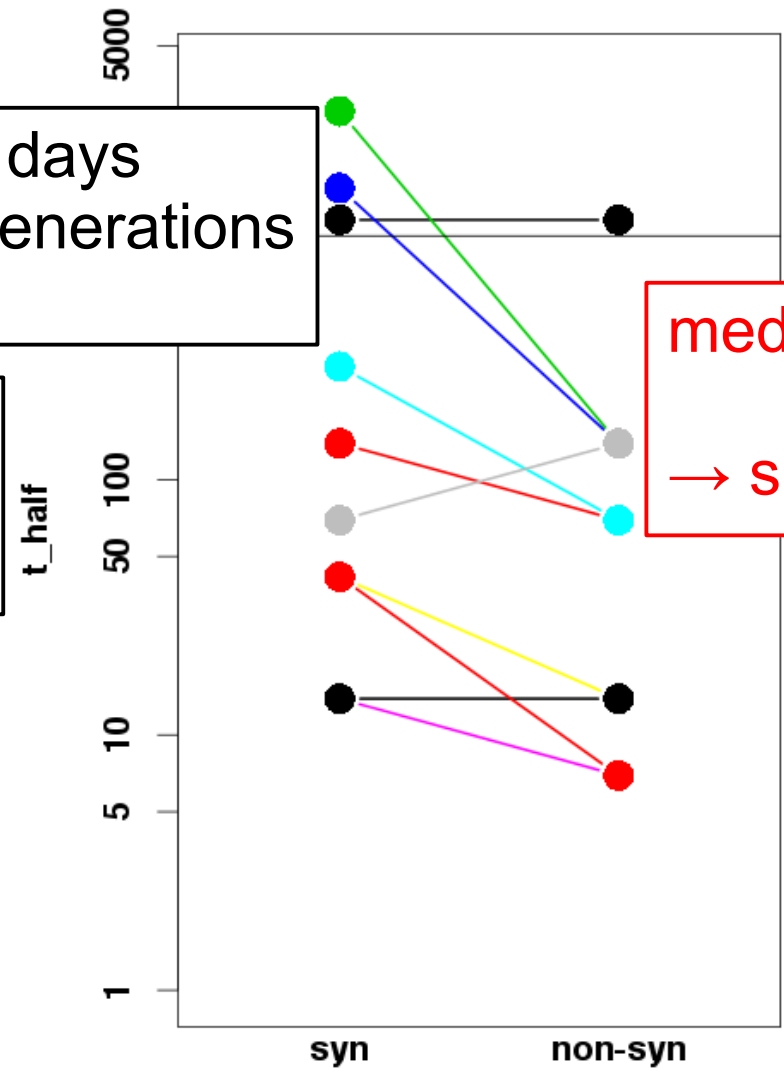
Recovery is faster for non-syn mutations

median  $t_{half}$  = 92 days  
 $\approx$  60 generations  
 $\rightarrow N_e \approx 90!!$

median  $t_{half}$  = 70 days  
 $\approx$  45 generations  
 $\rightarrow s \approx 1.5\%$

$H_{pred} \approx 0.005$   
 $H_{obs} \approx 0.025$

$H_{pred} \approx 0.003$   
 $H_{obs} \approx 0.01$



# Estimated $t_{half}$ values

Recovery is relatively fast

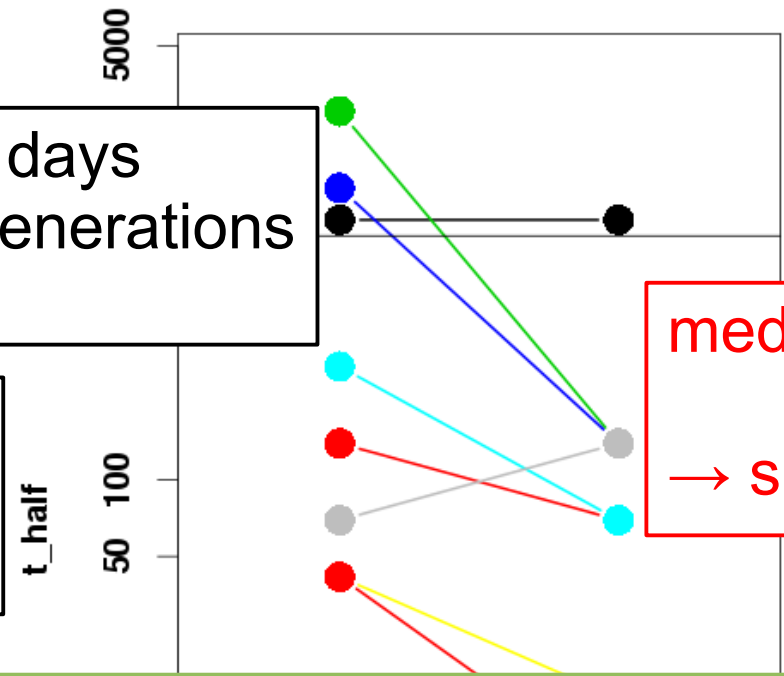
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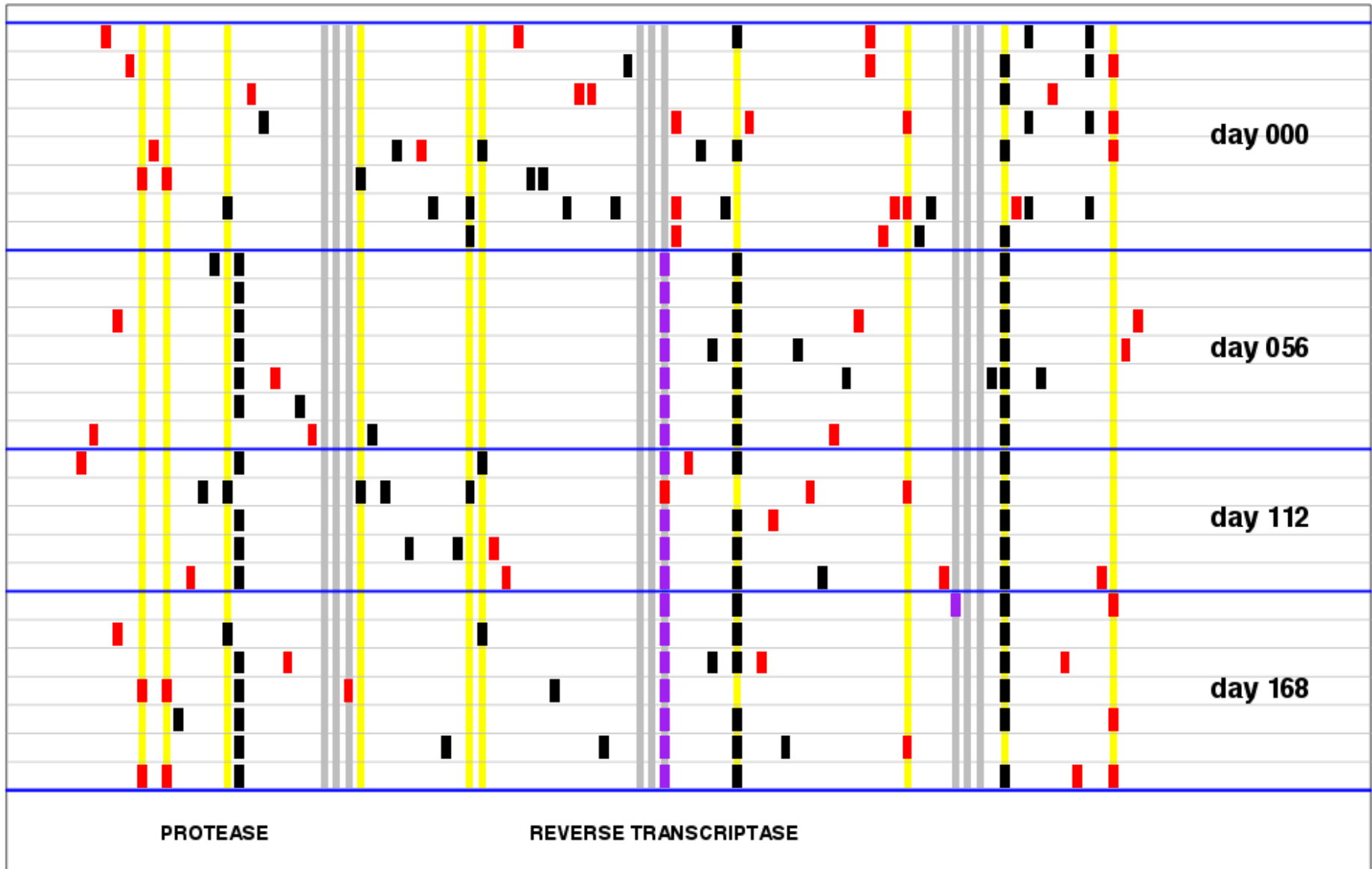
$H_{pred} \approx 0.005$   
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$H_{pred} \approx 0.003$   
 $H_{obs} \approx 0.01$



Times too fast &  $N$  estimates too low?  
Mutation rate higher?  
Generation time faster?  
Migration?

# Migration?





# Conclusions

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- Recovery can be predicted & observed

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- Predictions and observation: faster for non-syn sites
  - ratio nonsyn:syn polymorphism will be high at first and go down during recovery
  - this can explain why European humans have high ratio nonsyn:syn polymorphism (Lohmueller et al 2008)

# Conclusions

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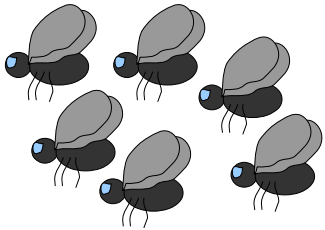
- Recovery can be predicted & observed
- Predictions and observation: faster for non-syn sites
  - ratio nonsyn:syn polymorphism will be high at first and go down during recovery
  - this can explain why European humans have high ratio nonsyn:syn polymorphism (Lohmueller et al 2008)
- Recovery in HIV data is variable, and mostly fast
- Parameter estimates inconsistent w. steady state values
- Due to wrong estimates/assumptions for mutation rate, generation time, migration?

# Examples

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**never recovers**

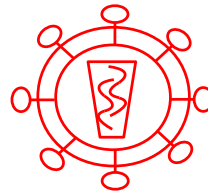
Karasov, Messer, Petrov 2010



HIV

**few years to recover**

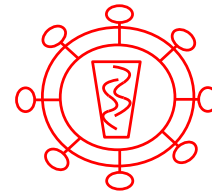
Kouyos et al 2011



HIV

**days - weeks to recover**

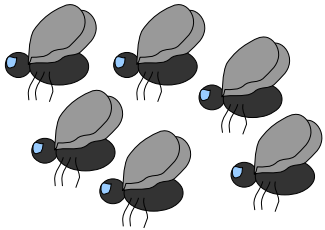
Pennings 2012



# Examples

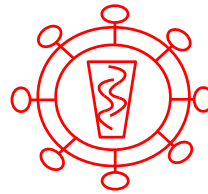
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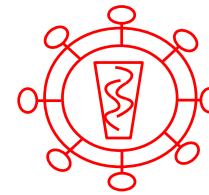


HIV  
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Pennings 2012



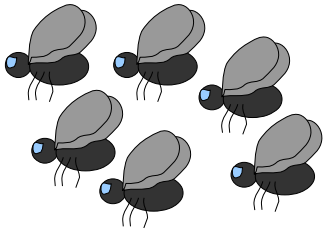
HIV  
in treated patients  
after sweep  
**few months to recover**  
This talk



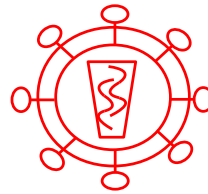
bottleneck of size 1,  
large N  
neutral sites

larger bottleneck,  
resistance mutations

*Drosophila melanogaster*  
**never recovers**  
Karasov, Messer, Petrov 2010



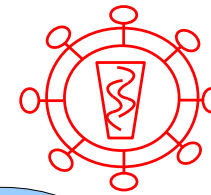
HIV  
**few years to recover**  
Kouyos et al 2011



HIV  
**days - weeks to recover**  
Pennings 2012



HIV  
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This talk

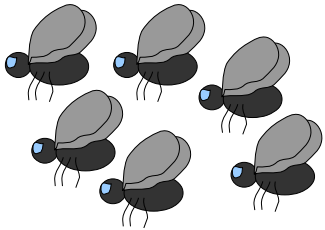


smaller N  
neutral and delet. muts  
better data

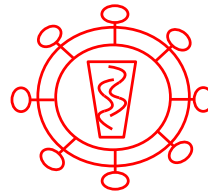
bottleneck of size 1,  
large N

larger bottleneck,  
deleterious mutations

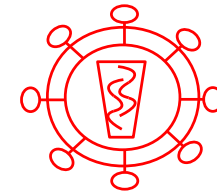
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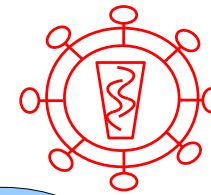


HIV  
**days - weeks to recover**  
Pennings 2012



Questions?  
Suggestions?  
Thank you!

HIV  
in treated patients  
after sweep  
**few months to recover**  
This talk



smaller N?  
better data

funded by HFSP