

leDEA

International epidemiologic
Databases to Evaluate AIDS



Southern Africa

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Monitoring and outcomes of ART– Mathematical model based on leDEA Southern Africa

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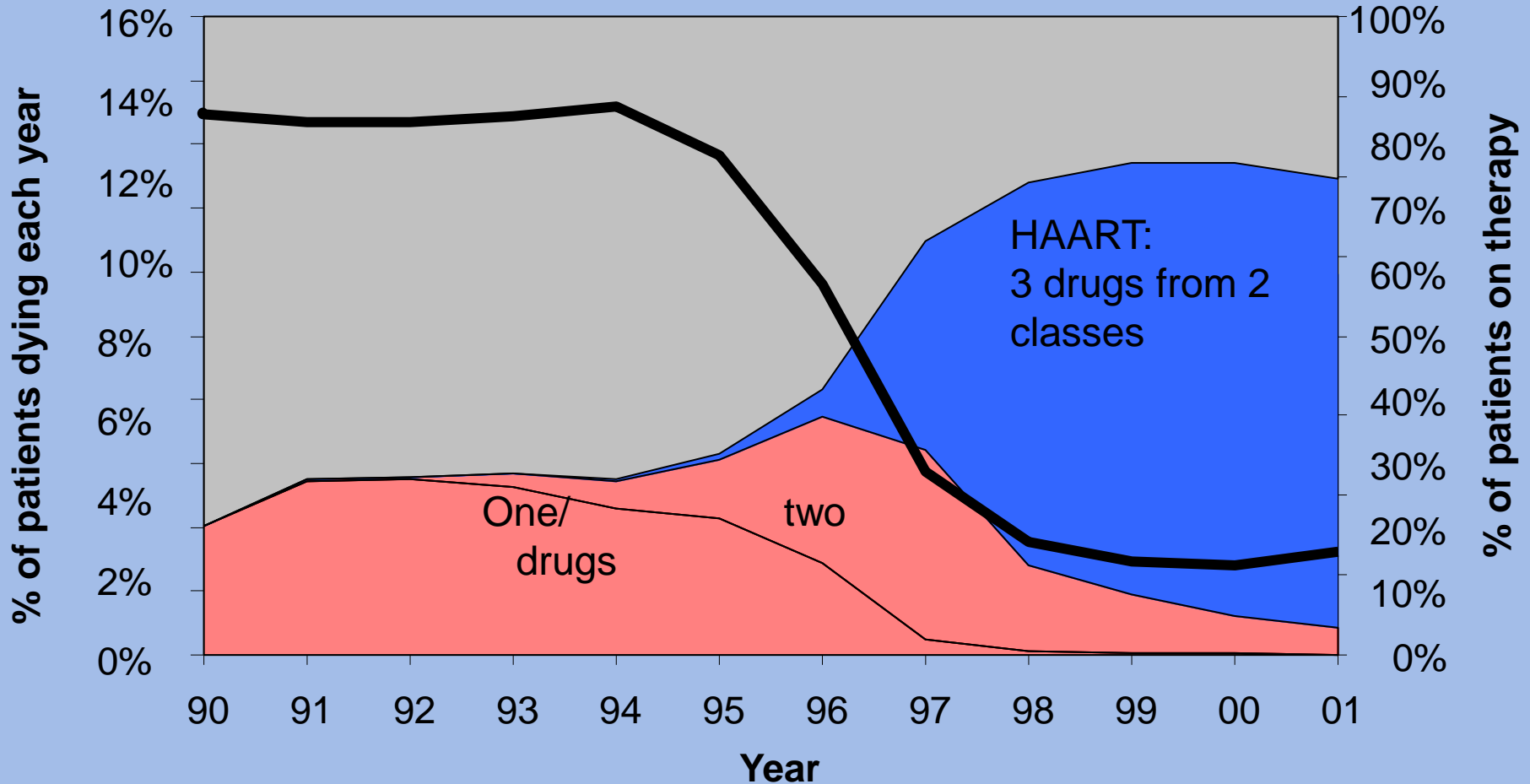
on behalf of leDEA Southern Africa

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Background: HIV and ART

- > HIV is a major global health burden – over 33 million people infected, 22 million of whom in sub-Saharan Africa (WHO, 2009)
- > Antiretroviral therapy (ART) has improved the survival of HIV infected patients tremendously

Background: HIV and ART

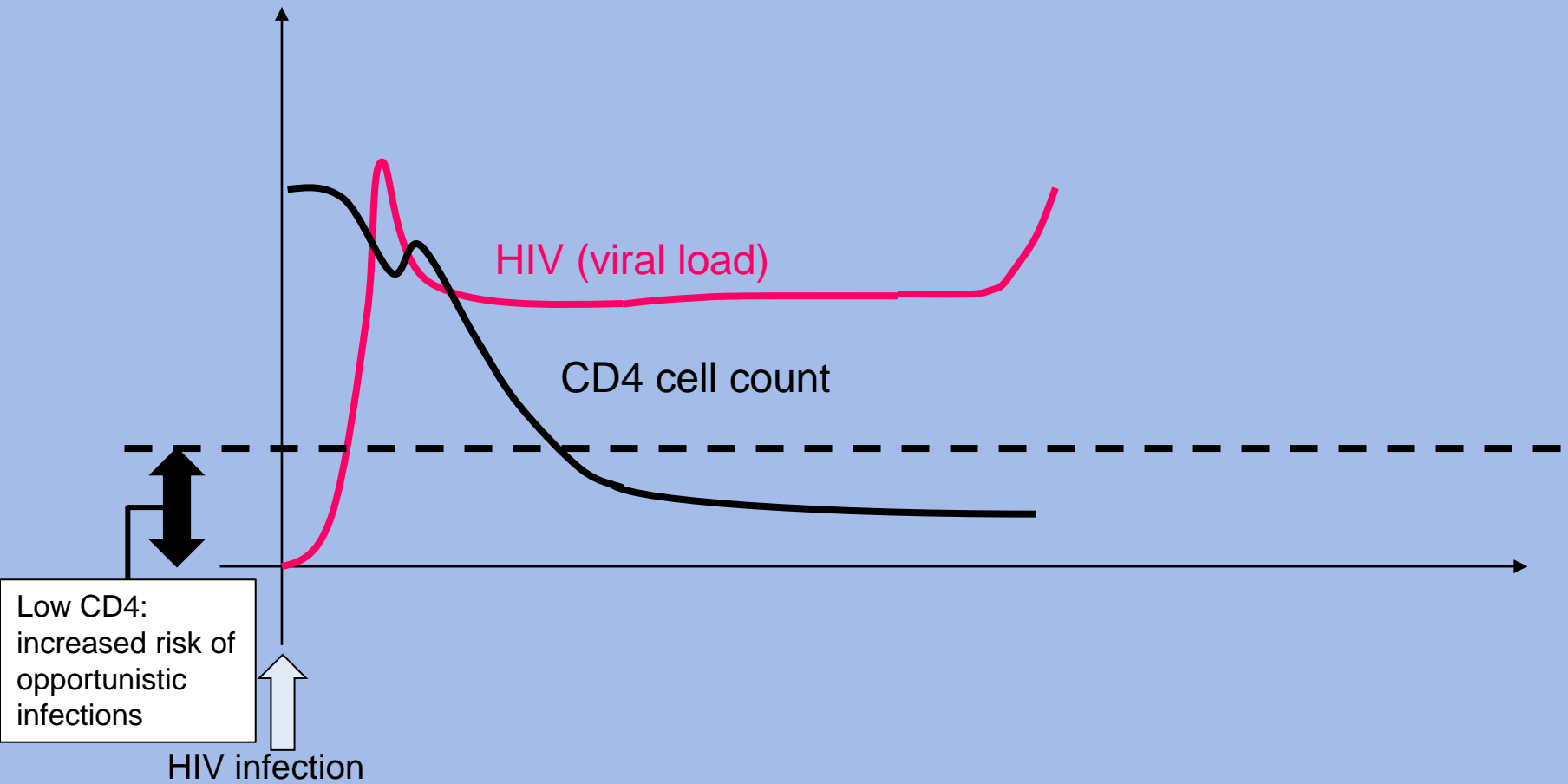


Keiser *et al.*, AIDS 2004

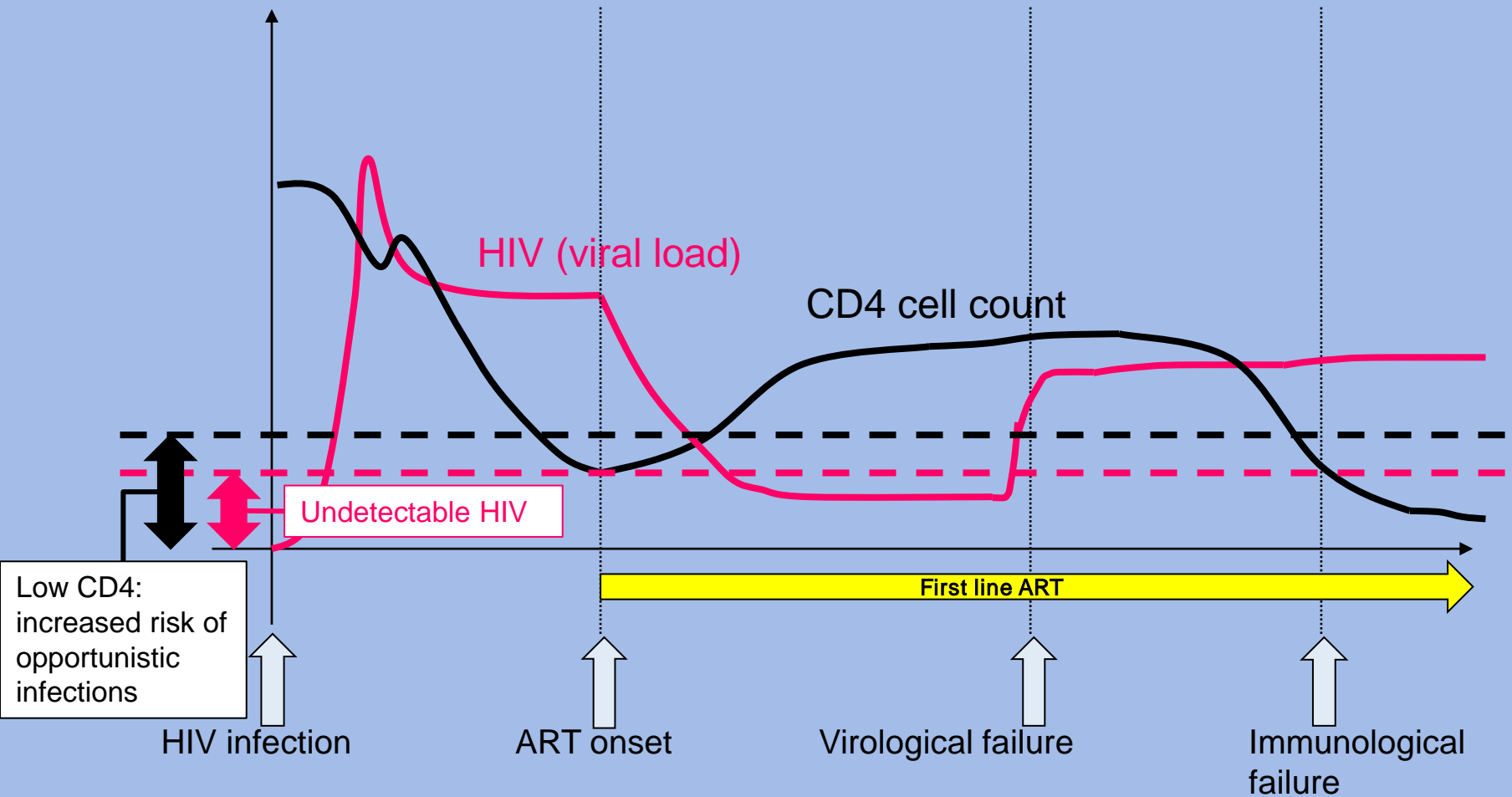
Background: HIV and ART

- > In low-income countries, ART is provided with a public health approach – often with very restricted drug regimen options and laboratory monitoring facilities

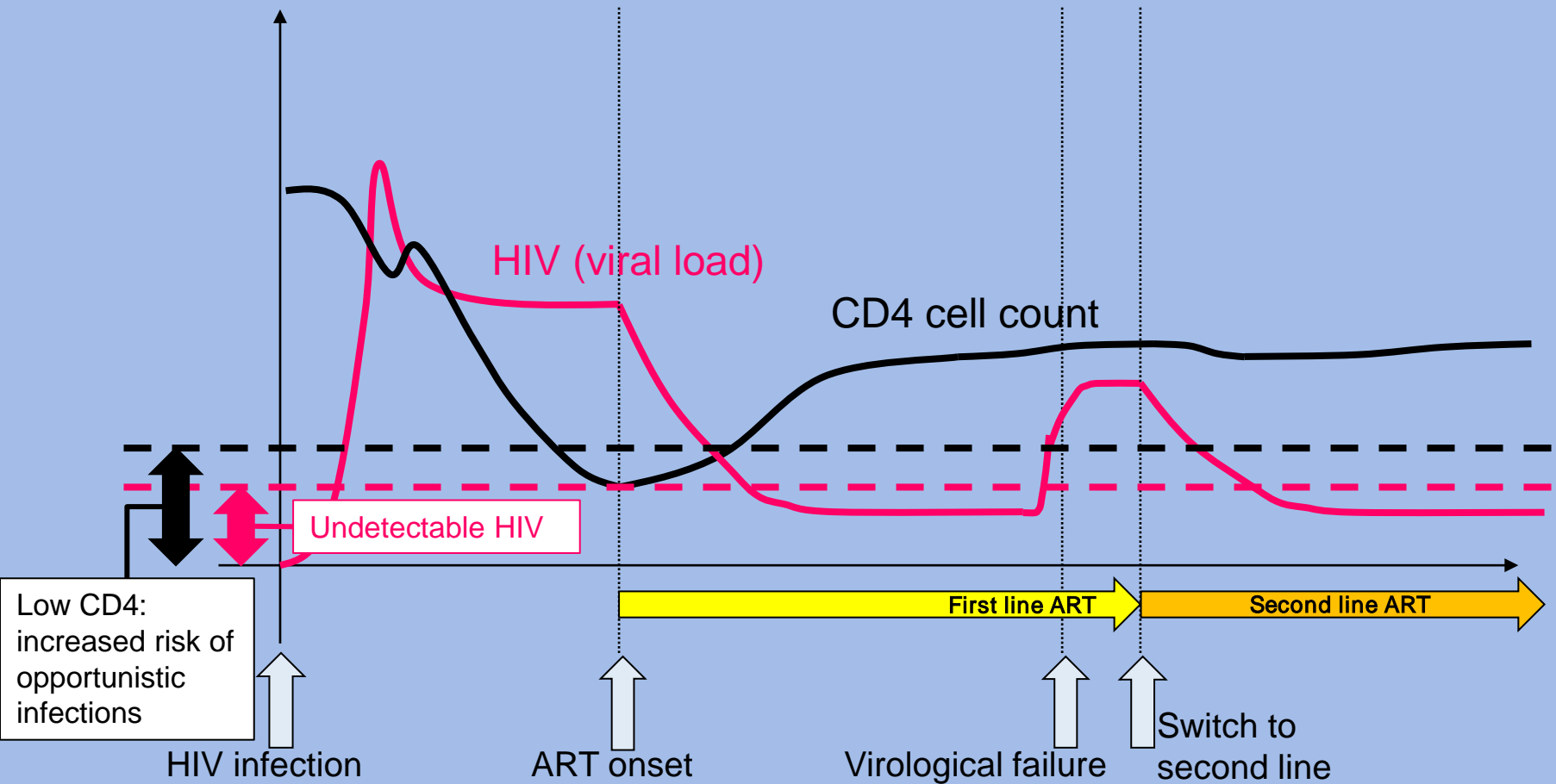
Background: HIV and ART



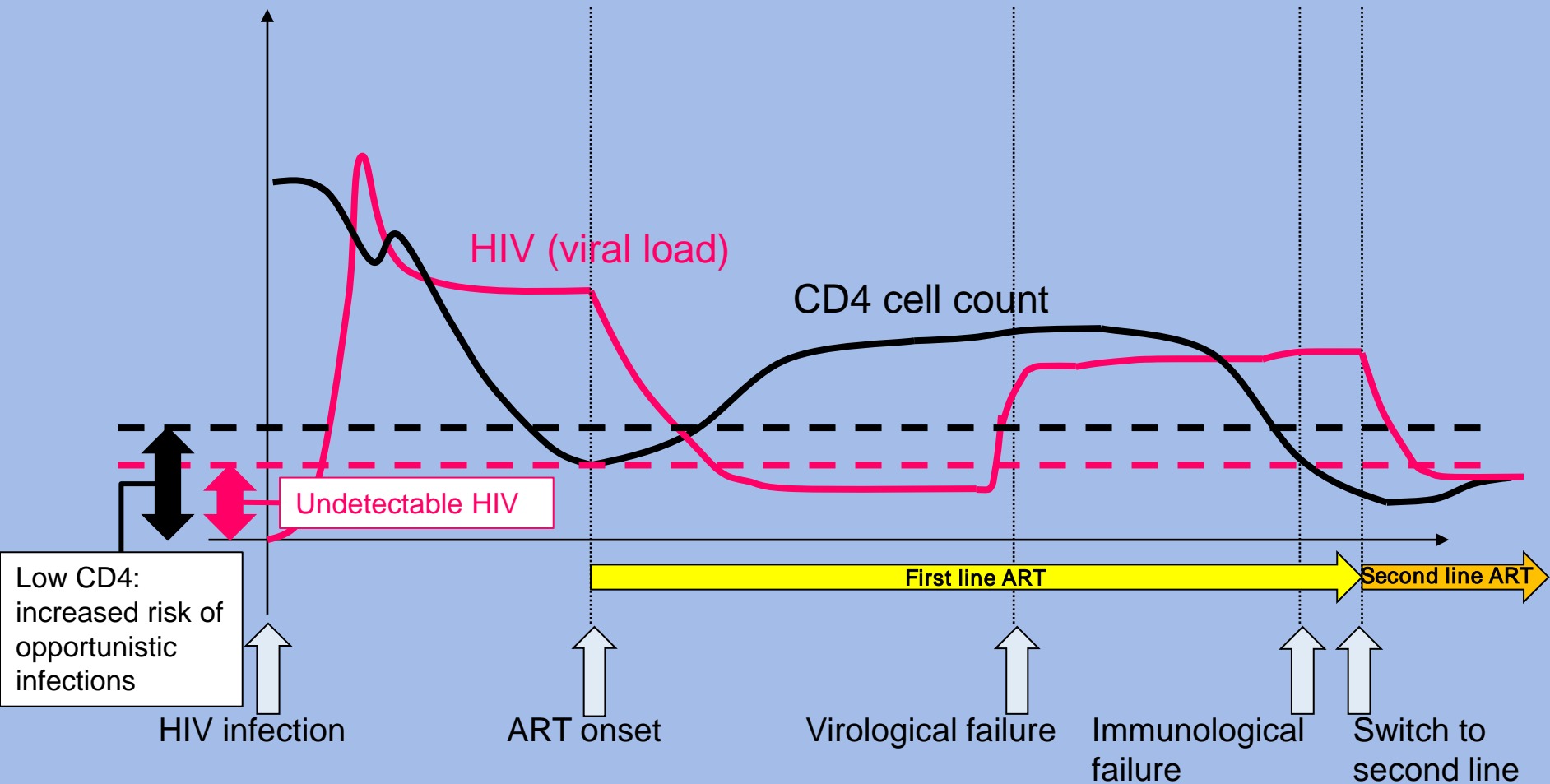
Background: HIV and ART



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Background: HIV and ART

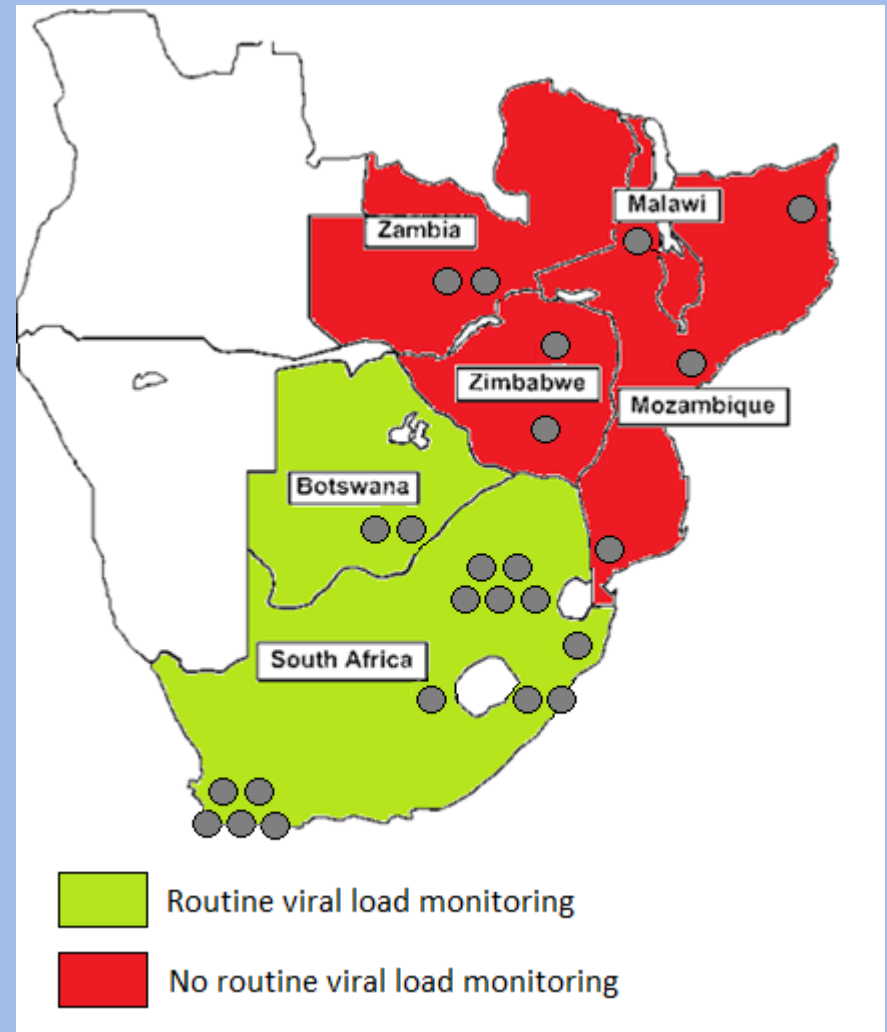


Background: Routine viral load monitoring

- > Routine viral load monitoring: viral load is measured regularly for all patients
- > Question: How large are benefits of routine viral load monitoring on the:
 - Individual level (e.g. reducing mortality)
 - Population level (e.g. reducing transmission)

Background: IeDEA-SA

- > Over 200,000 patients receiving ART
- > 24 cohorts in six countries
- > Two countries (South Africa, Botswana) have routine viral load measurements as part of the national ART programme



The mathematical model

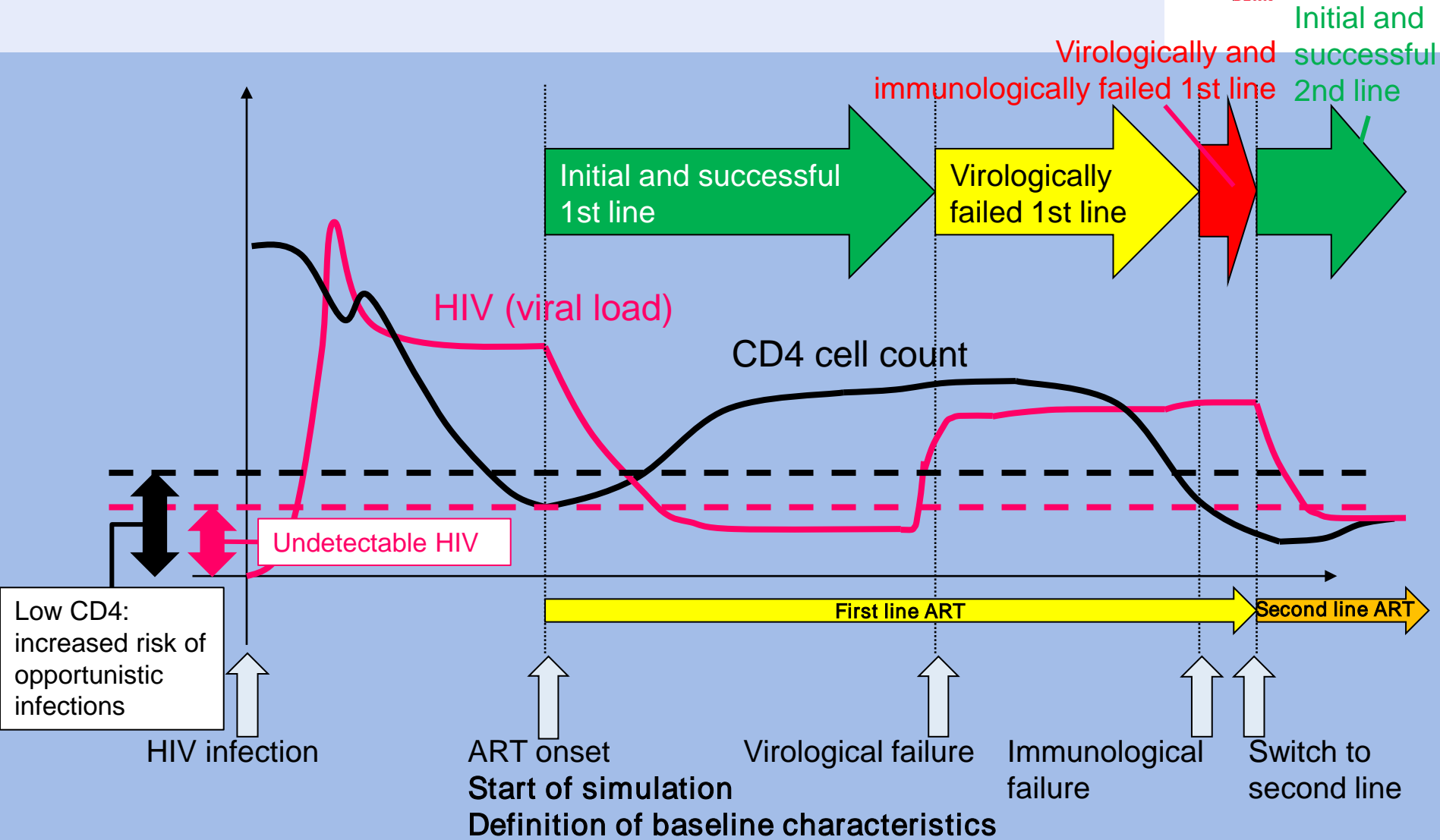
- > Individual based, stochastic simulation model
- > Simulates independently a number of patients receiving ART
- > Programmed in MATLAB programming language

(version 7.8.0, MathWorks Inc)

The mathematical model

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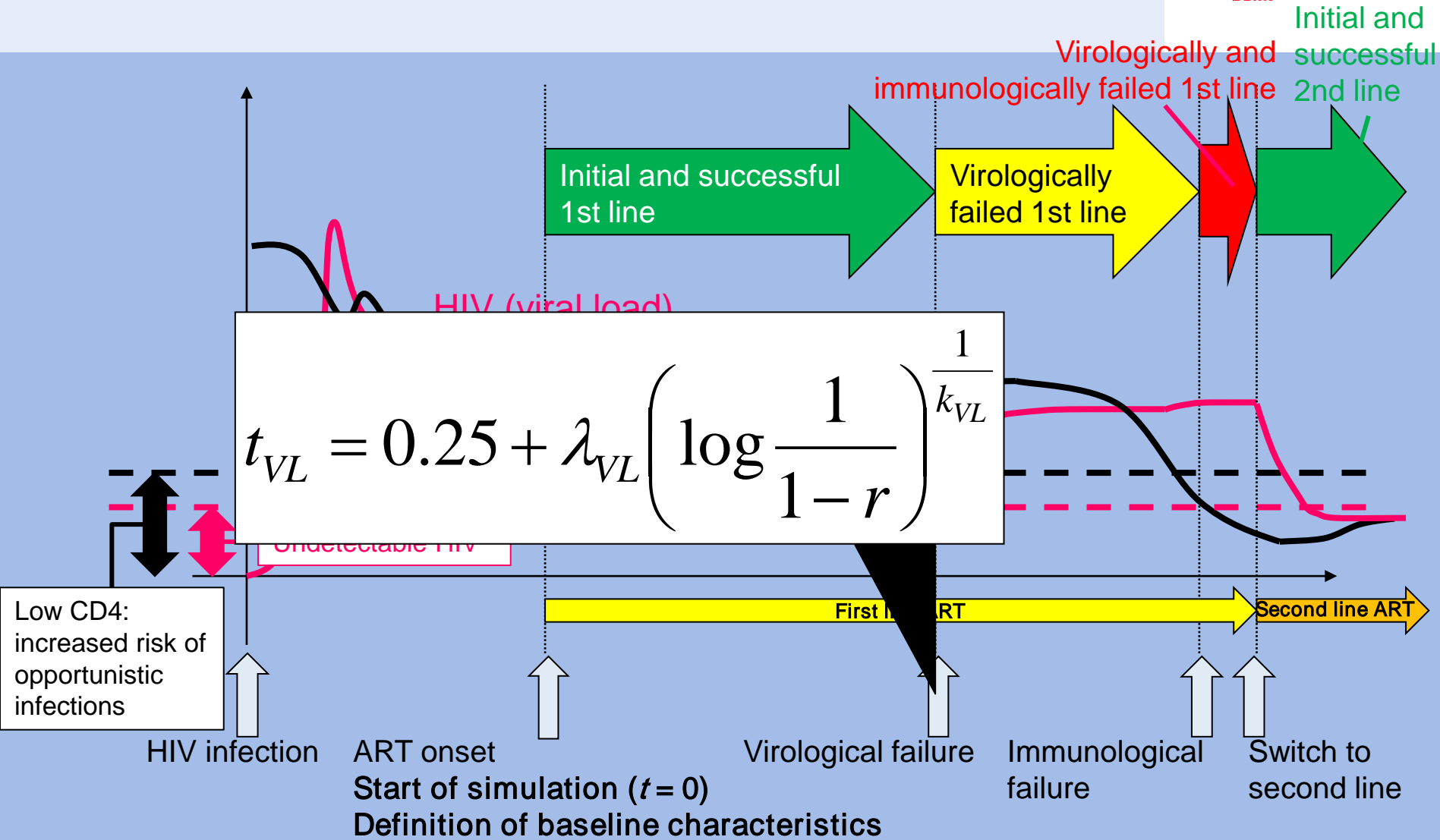
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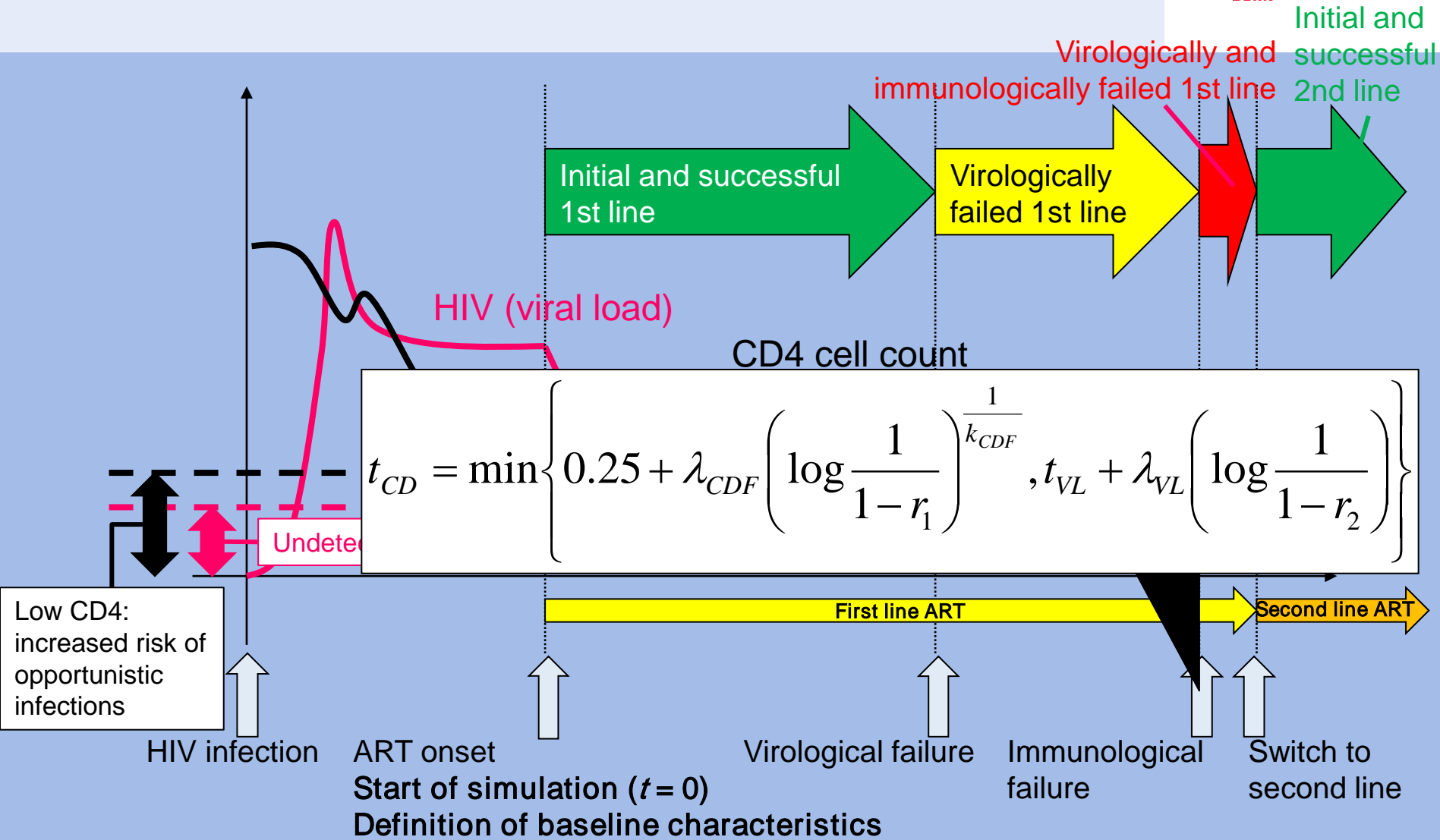
The mathematical model

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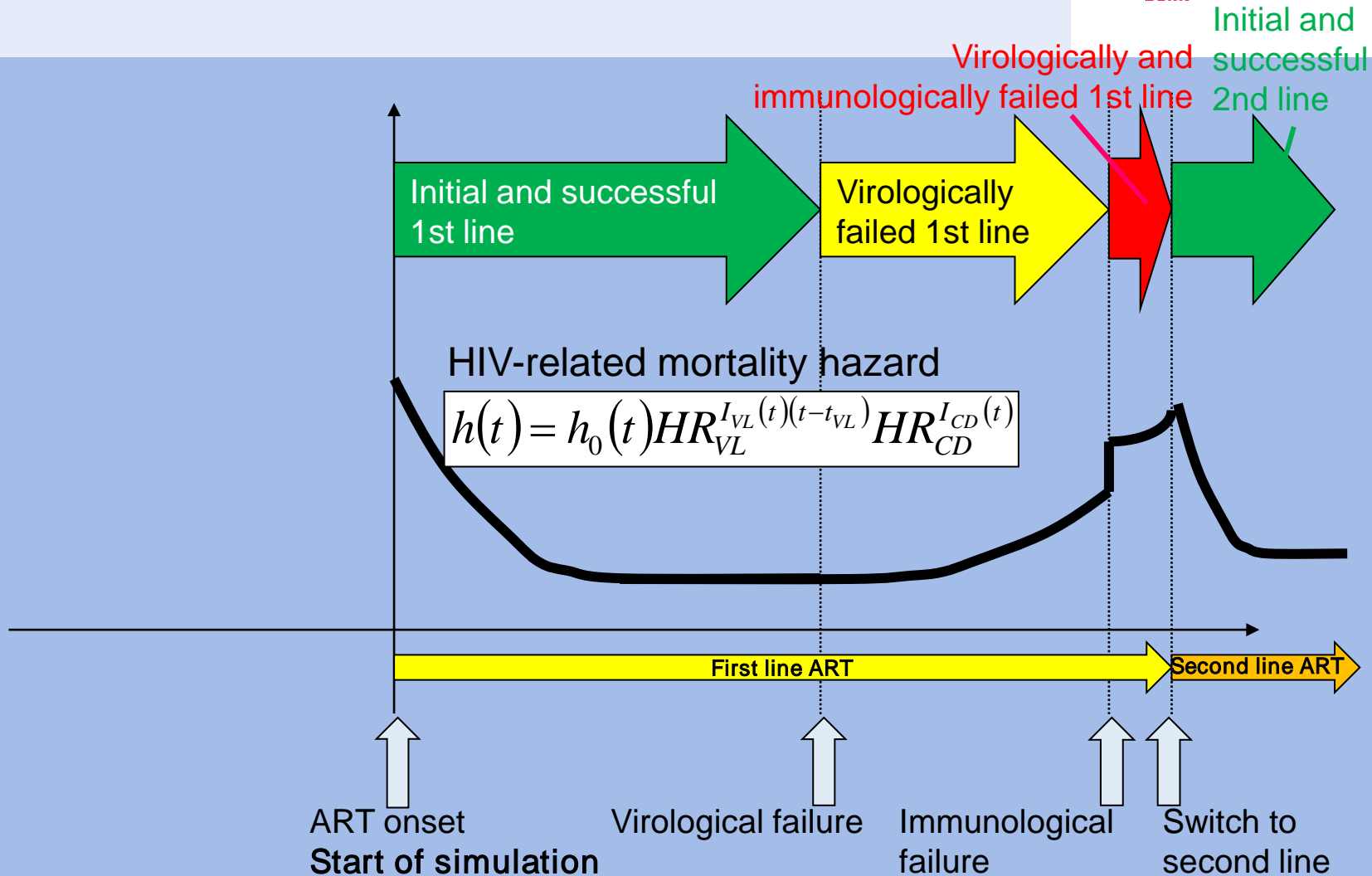
The mathematical model



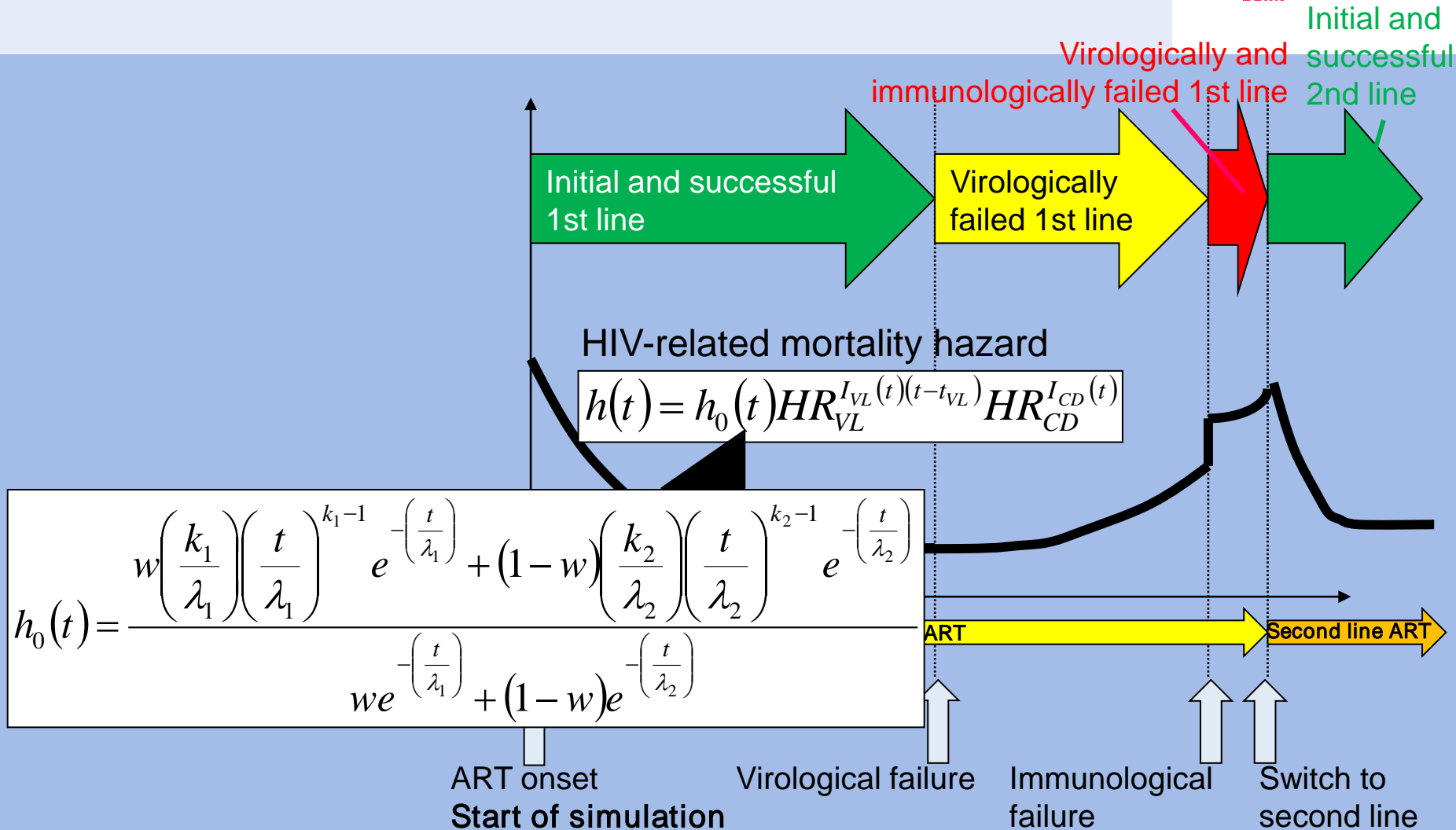
The mathematical model

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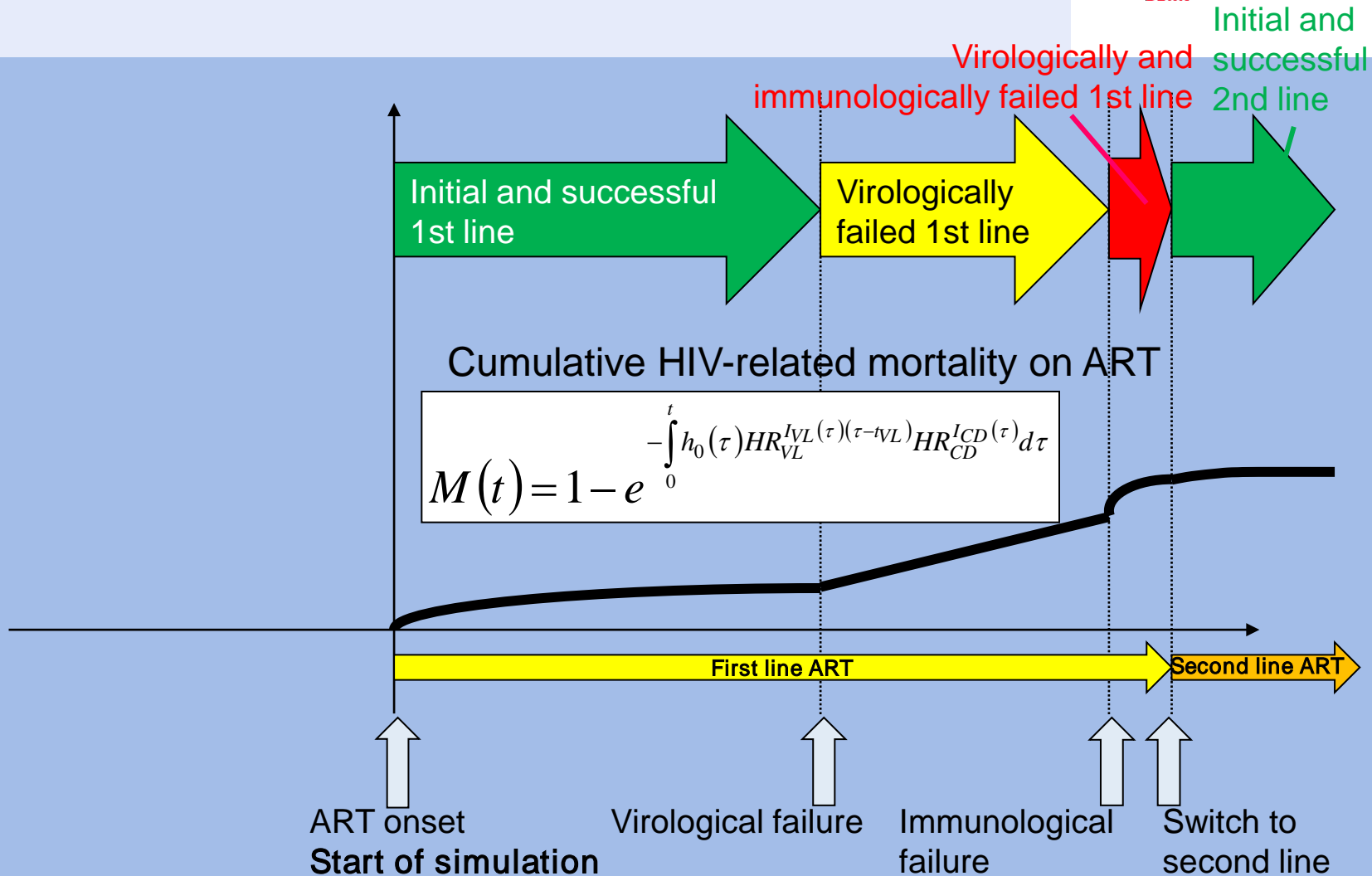
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The mathematical model



The mathematical model



The mathematical model

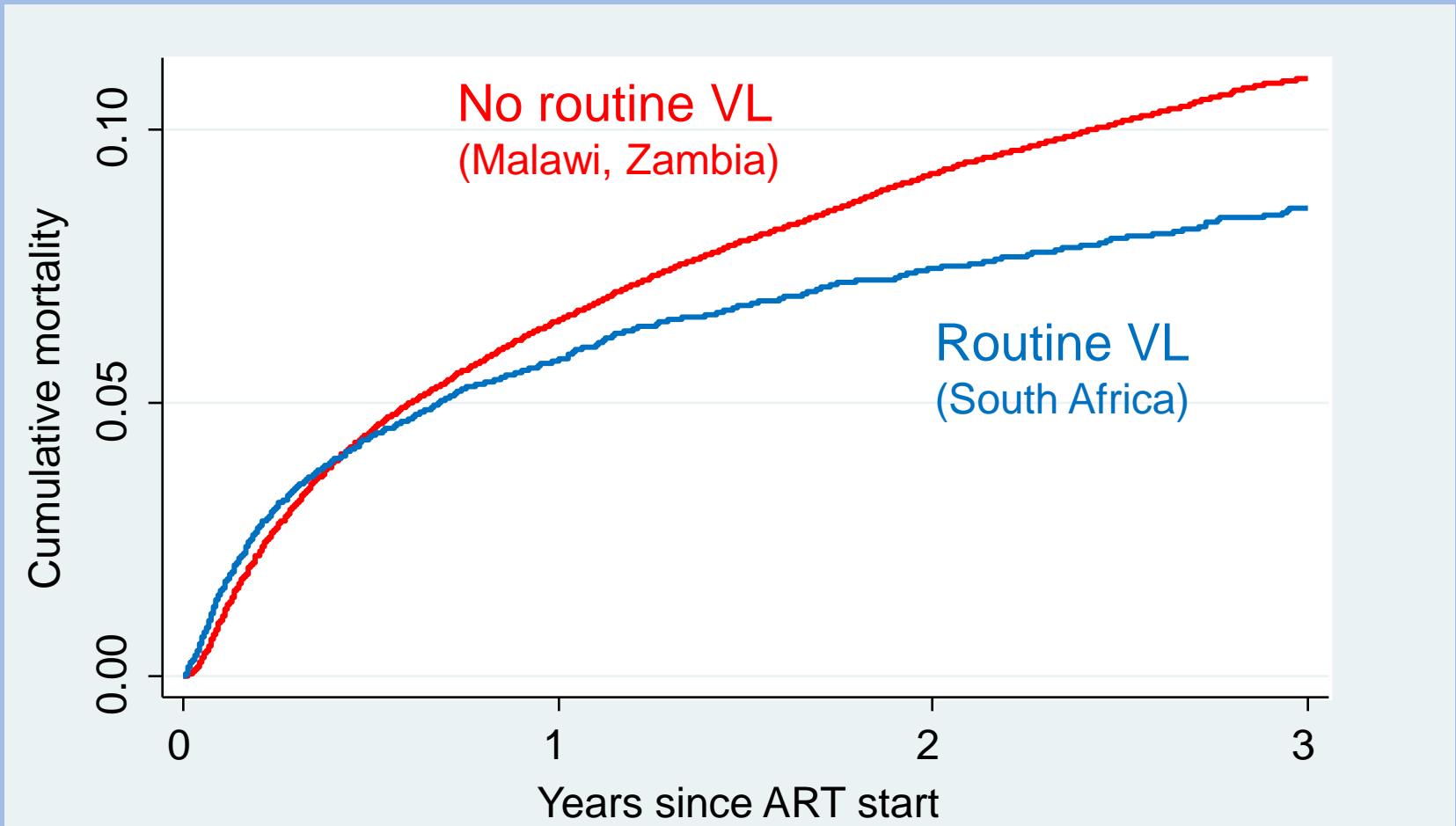
MATLAB Variable Editor: ans
17.08.2011 Page 7
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| 2 | 28.8186 | 52.4573 | 25.7120 | 30.8659 | 40.1345 | 35.6022 |
| 3 | 2 | 1 | 2 | 1 | 2 | 2 |
| 4 | 0 | 1 | 0 | 0 | 0 | 0 |
| 5 | 100000 | 1.7101 | 100000 | 100000 | 100000 | 100000 |
| 6 | 100000 | 2.3499 | 100000 | 100000 | 100000 | 100000 |
| 7 | 0 | 0 | 0 | 0 | 0 | 0 |
| 8 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 9 | 0 | 0 | 0 | 0 | 0 | 0 |
| 10 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 11 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 12 | 0 | 0 | 0 | 0 | 0 | 0 |
| 13 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 14 | 0 | 1 | 0 | 0 | 0 | 0 |
| 15 | 100000 | 2.3499 | 100000 | 100000 | 100000 | 100000 |
| 16 | 0 | 0 | 0 | 0 | 0 | 0 |
| 17 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 18 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 19 | 0 | 0 | 0 | 0 | 0 | 0 |
| 20 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 21 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 22 | 405 | 2.4508e+03 | 405 | 405 | 1.9440 | 405 |
| 23 | 800 | 880 | 800 | 800 | 3.8400 | 800 |
| 24 | 1 | 1 | 1 | 1 | 3 | 1 |
| 25 | -1 | -1 | -1 | -1 | 1 | -1 |
| 26 | 5 | 5 | 5 | 5 | 0.0240 | 5 |
| 27 | Inf | Inf | Inf | Inf | Inf | Inf |
| 28 | 0 | 0 | 0 | 0 | 0 | 0 |
| 29 | 1 | 1 | 1 | 1 | 1 | 1 |
| 30 | -9.5282 | -6.3431 | -4.7648 | -2.5235 | -6.6663 | -8.6103 |
| 31 | 241 | 241 | 241 | 241 | 5.7840 | 241 |
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| 33 | 241 | 742.8435 | 241 | 241 | 0 | 241 |
| 34 | 241 | 1013 | 241 | 241 | 0 | 241 |
| 35 | 241 | 1093 | 241 | 241 | 0 | 241 |

MATLAB Variable Editor: ans
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| | 43 | 44 | 45 | 46 | 47 | 48 |
|----|---------|---------|----------|---------|---------|----------|
| 1 | 43 | 44 | 45 | 46 | 47 | 48 |
| 2 | 46.4748 | 38.0425 | 27.4652 | 52.1228 | 39.1830 | 31.6055 |
| 3 | 1 | 2 | 1 | 1 | 2 | 1 |
| 4 | 0 | 0 | 0 | 0 | 0 | 0 |
| 5 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 6 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 7 | 0 | 0 | 0 | 0 | 0 | 0 |
| 8 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 9 | 0 | 0 | 0 | 0 | 0 | 0 |
| 10 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 11 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 12 | 0 | 0 | 0 | 0 | 0 | 0 |
| 13 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 14 | 0 | 0 | 0 | 0 | 0 | 0 |
| 15 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 16 | 0 | 0 | 0 | 0 | 0 | 0 |
| 17 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 18 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 19 | 0 | 0 | 0 | 0 | 0 | 0 |
| 20 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 21 | 100000 | 100000 | 100000 | 100000 | 100000 | 100000 |
| 22 | 405 | 405 | 250.5330 | 405 | 405 | 34.9920 |
| 23 | 800 | 800 | 494.8800 | 800 | 800 | 69.1200 |
| 24 | 1 | 1 | 3 | 1 | 1 | 3 |
| 25 | -1 | -1 | 1 | -1 | -1 | 1 |
| 26 | 5 | 5 | 3.0930 | 5 | 5 | 0.4320 |
| 27 | Inf | Inf | Inf | Inf | Inf | Inf |
| 28 | 0 | 0 | 0 | 0 | 0 | 0 |
| 29 | 1 | 1 | 1 | 1 | 1 | 1 |
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| 31 | 241 | 241 | 241 | 241 | 241 | 104.1120 |
| 32 | 241 | 241 | 241 | 241 | 241 | 0 |
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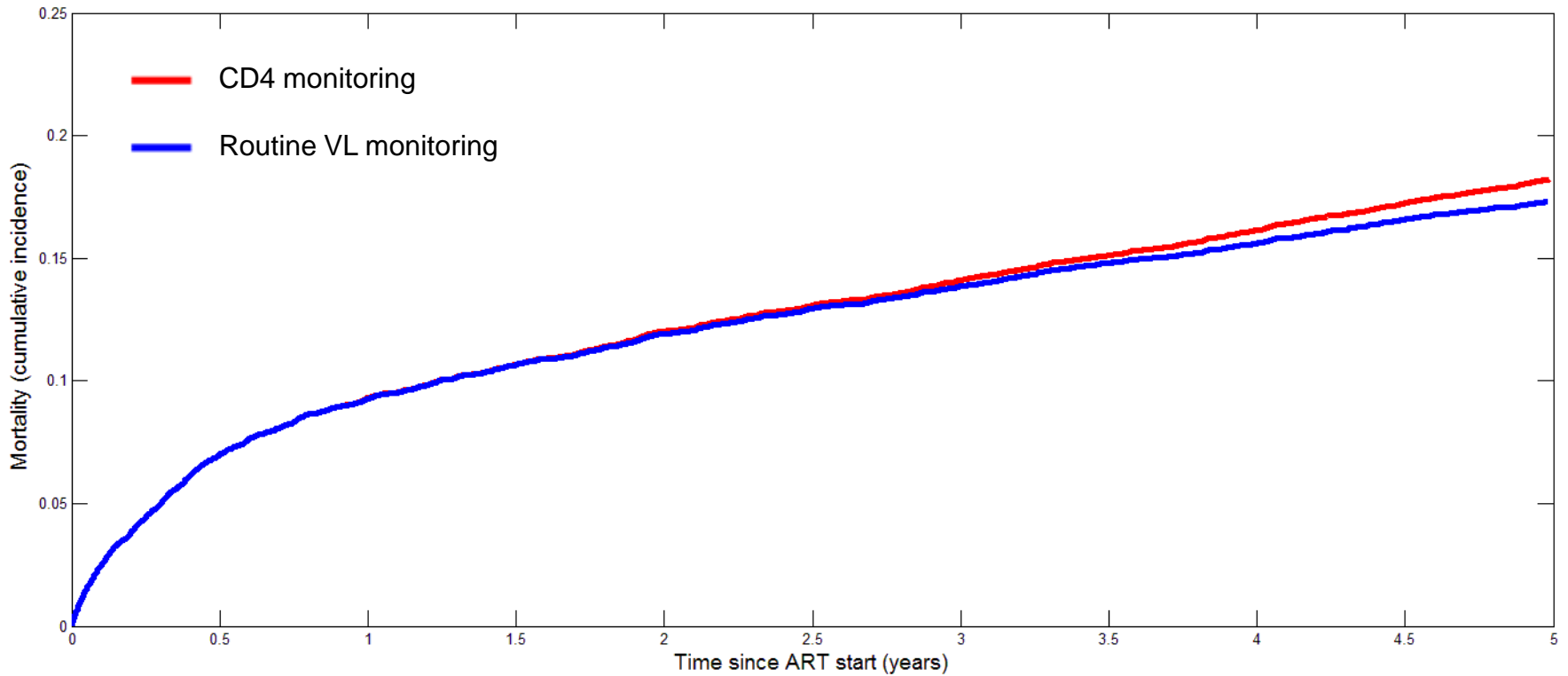
Mortality



Keiser *et al.*, AIDS 2011

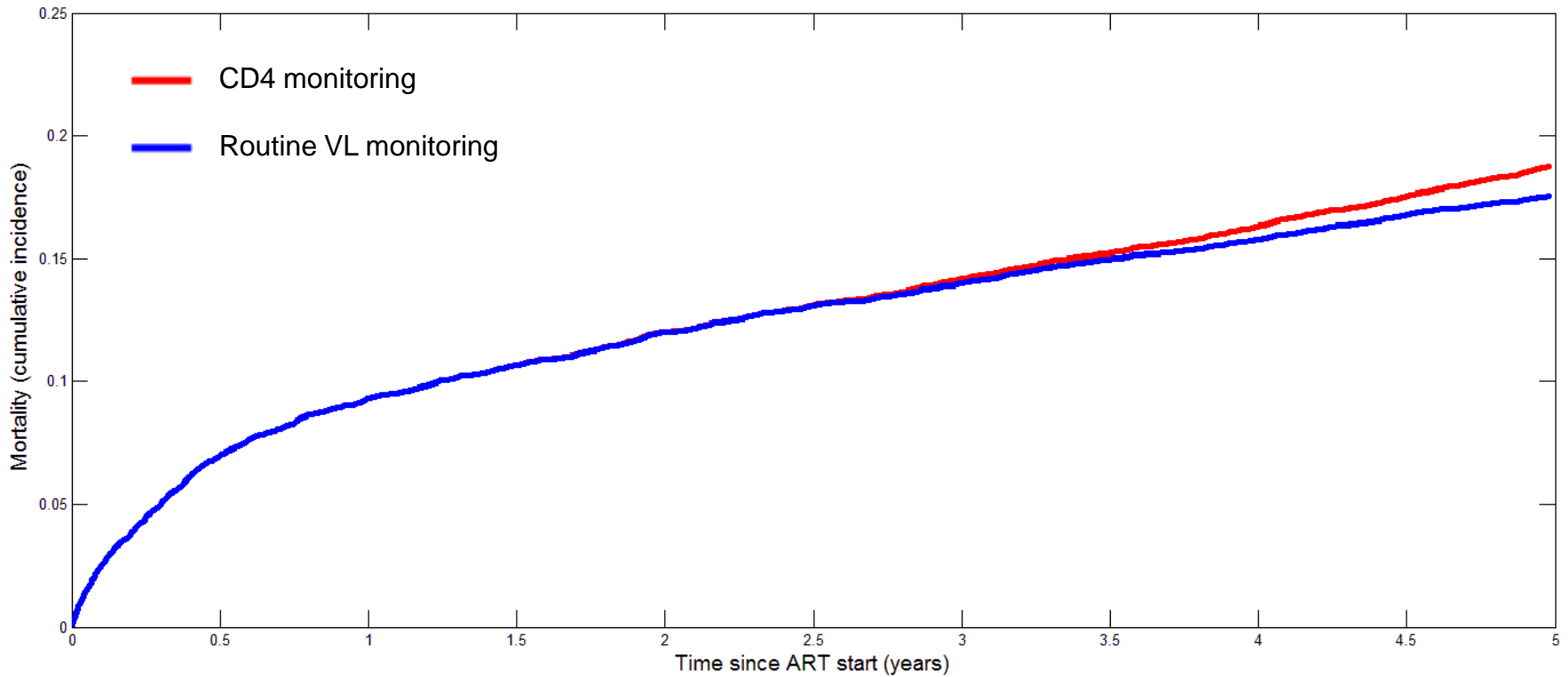
- > What could explain this difference?
 - Purely more accurate failure detection?
 - Increased confidence in the failure detection and lower reluctance to switch?
 - Improved adherence and lower failure rates?
 - Background mortality?
- > Apart from background mortality, all other benefits are related to routine viral load monitoring!

Mortality: Results



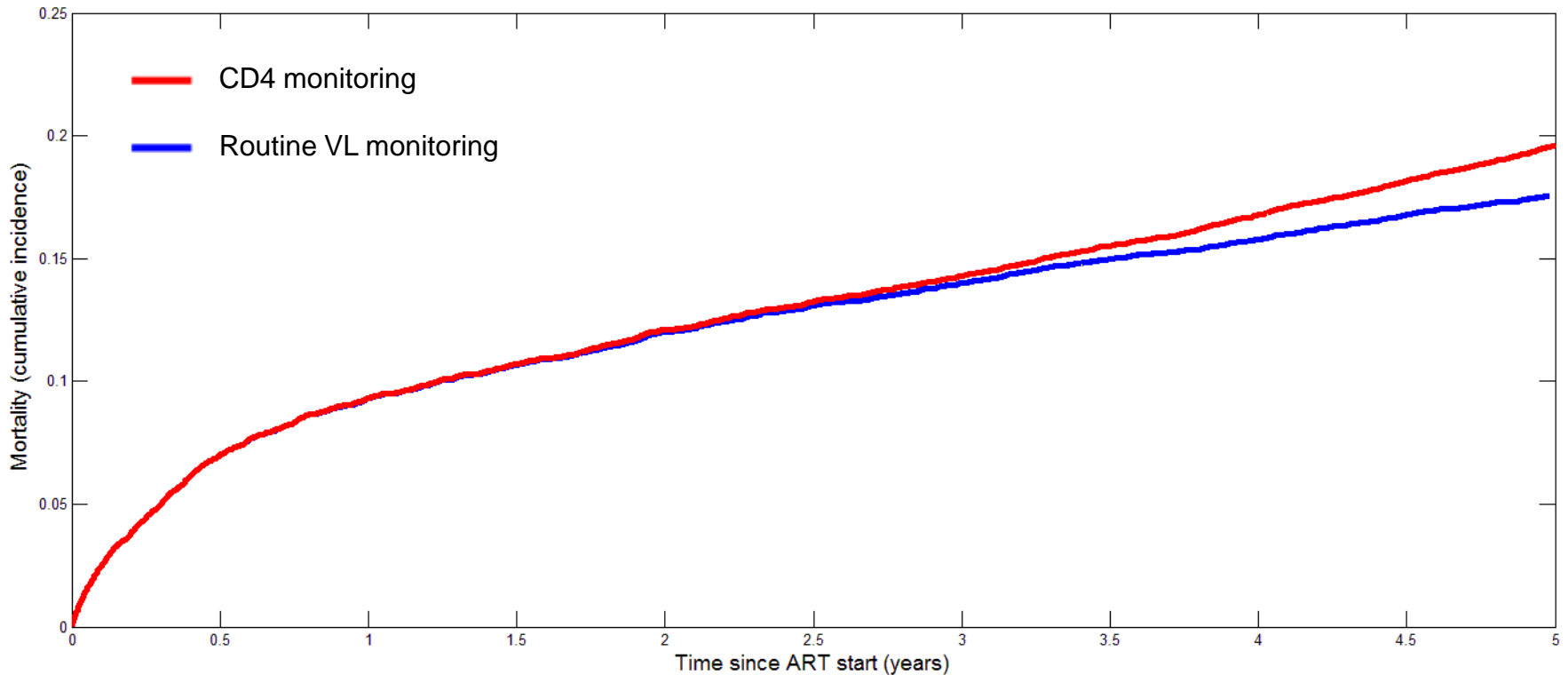
- > Equal failure rates, switching exactly according to criteria
⇒ No clear difference in mortality

Mortality: Results



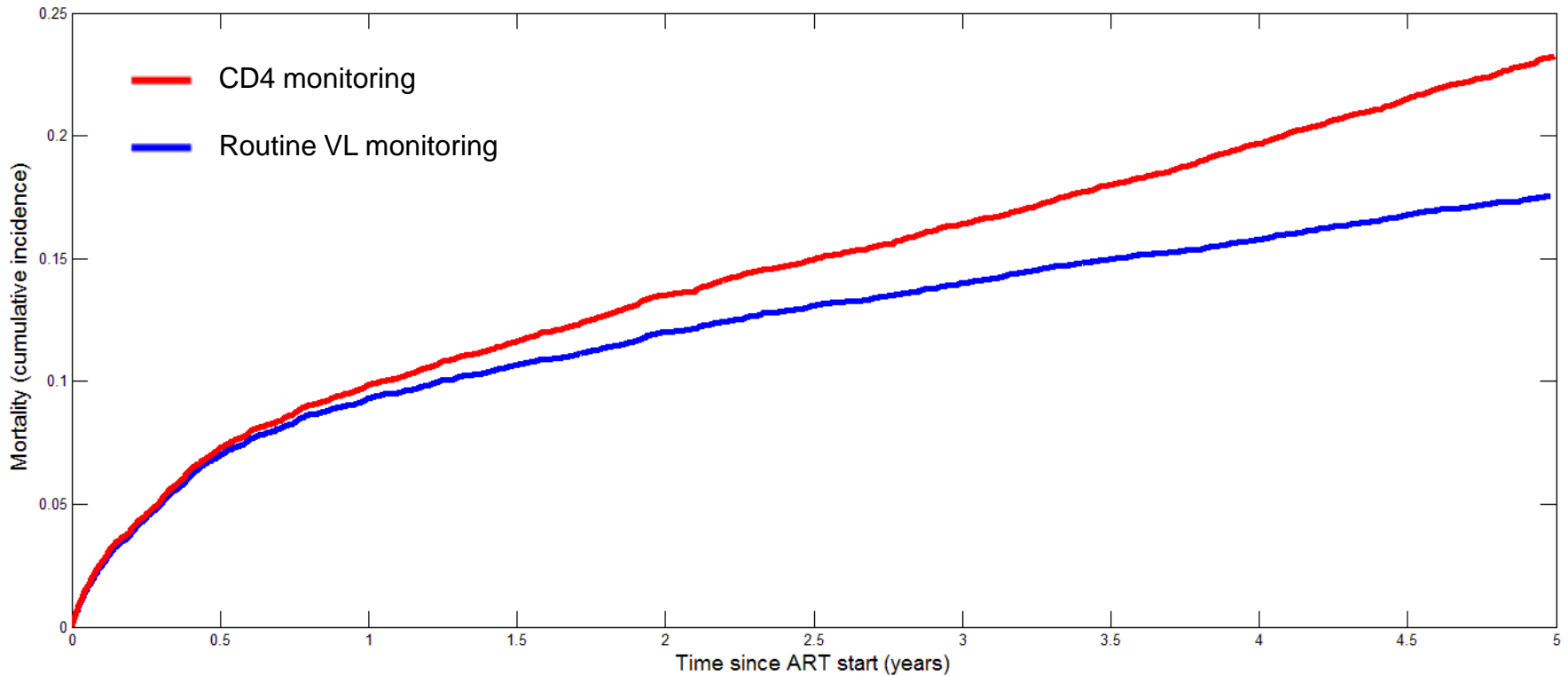
- > Equal failure rates, but realistic delay to switch included
⇒ Difference in mortality remains moderate

Mortality: Results



- > Doubled hazard of failure if no routine viral load monitoring
- ⇒ Mortality already 12% higher after 5 years with CD4 monitoring compared to routine viral load monitoring

Mortality: Results

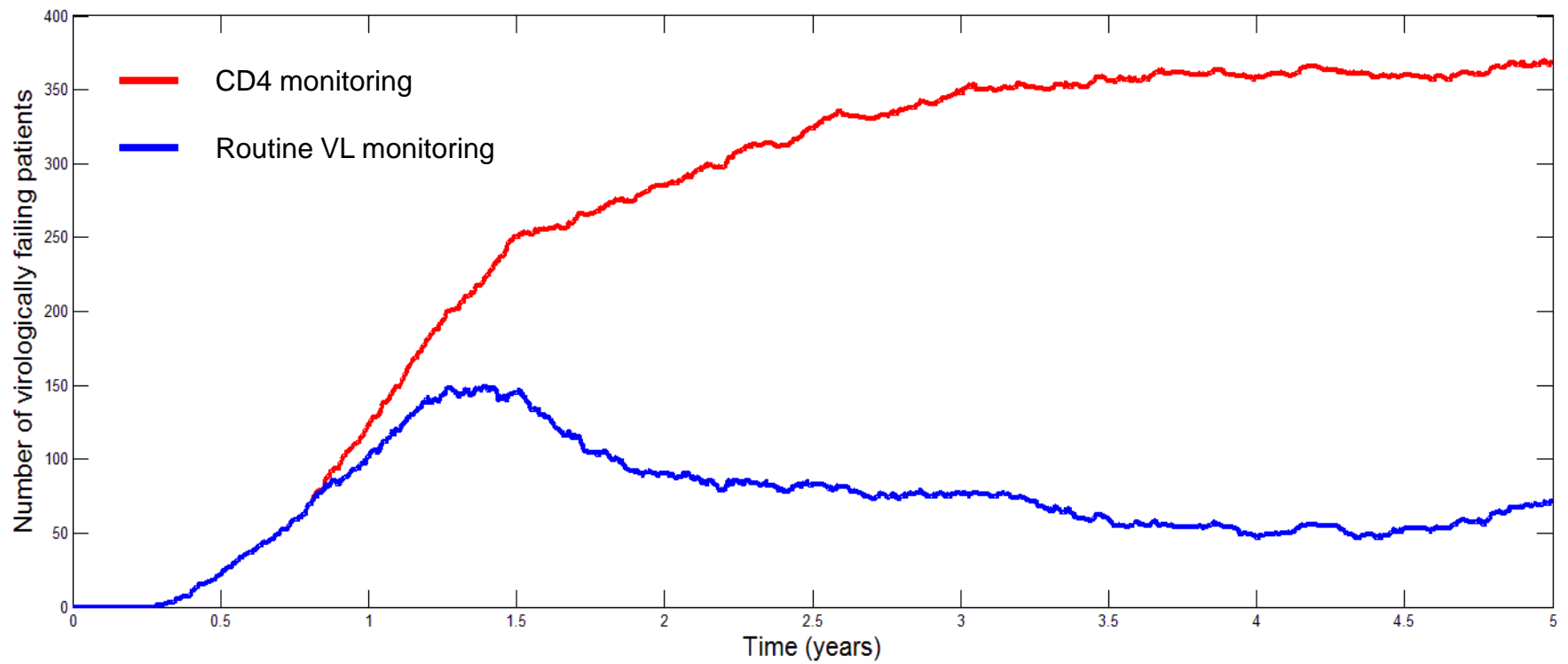


- > Higher background mortality in CD4 monitoring cohort
⇒ Difference in mortality increased substantially

Time spent with failed ART

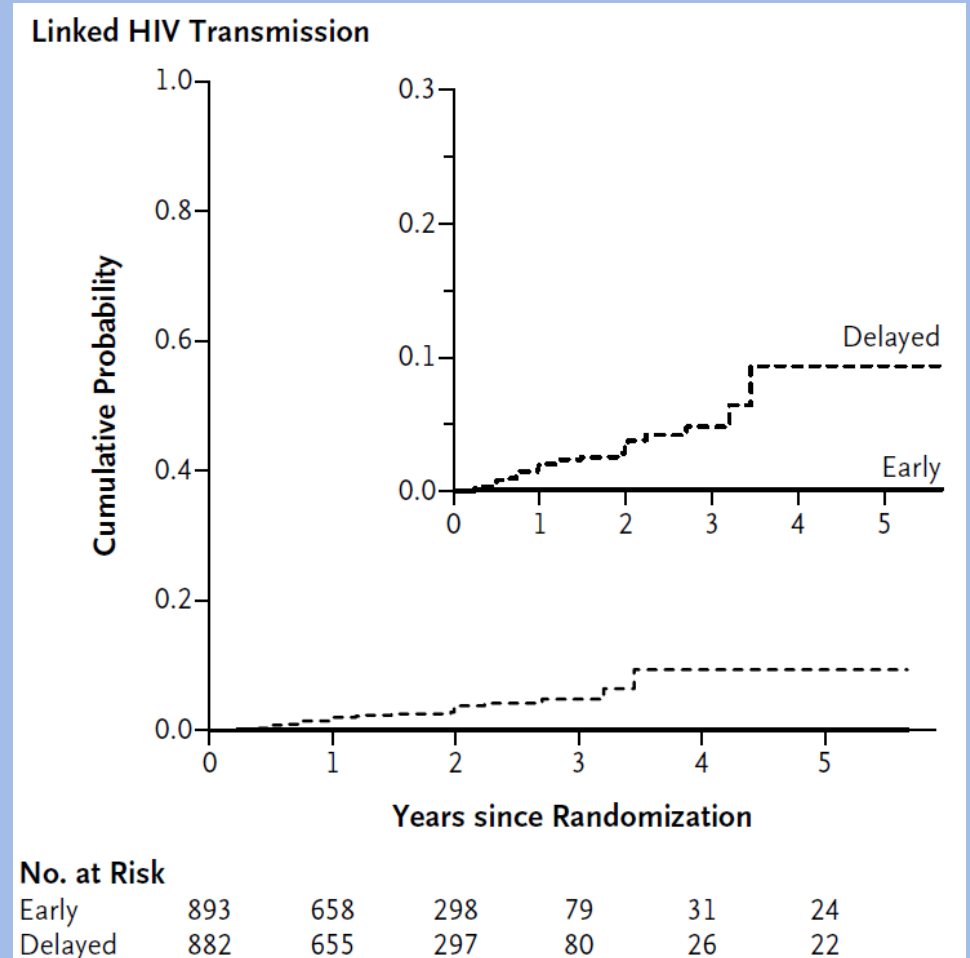
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Transmission

- > Individual viral load is a strong predictor of probability of transmission
- > Randomised clinical trial HPTN 052: ART reduces transmission



Cohen *et al.* NEJM, 2011

Transmission

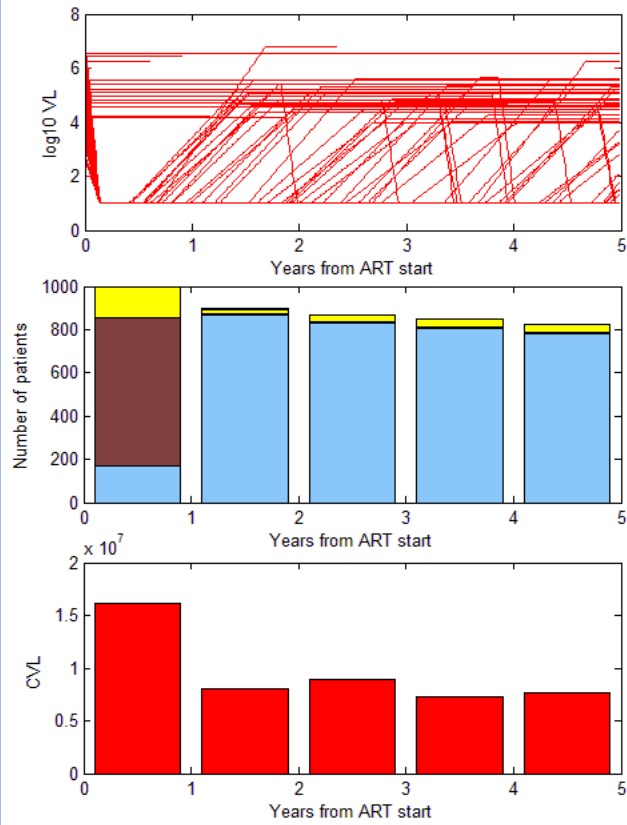
- > Transmission from treated patients currently minimal
- > Introduction of “Test and Treat”
- > Treatment failure may become a substantial source of transmission
- > Efficient detection of ART failure needed
- > To what extent can routine viral load monitoring prevent new infections?

Transmission: Methods

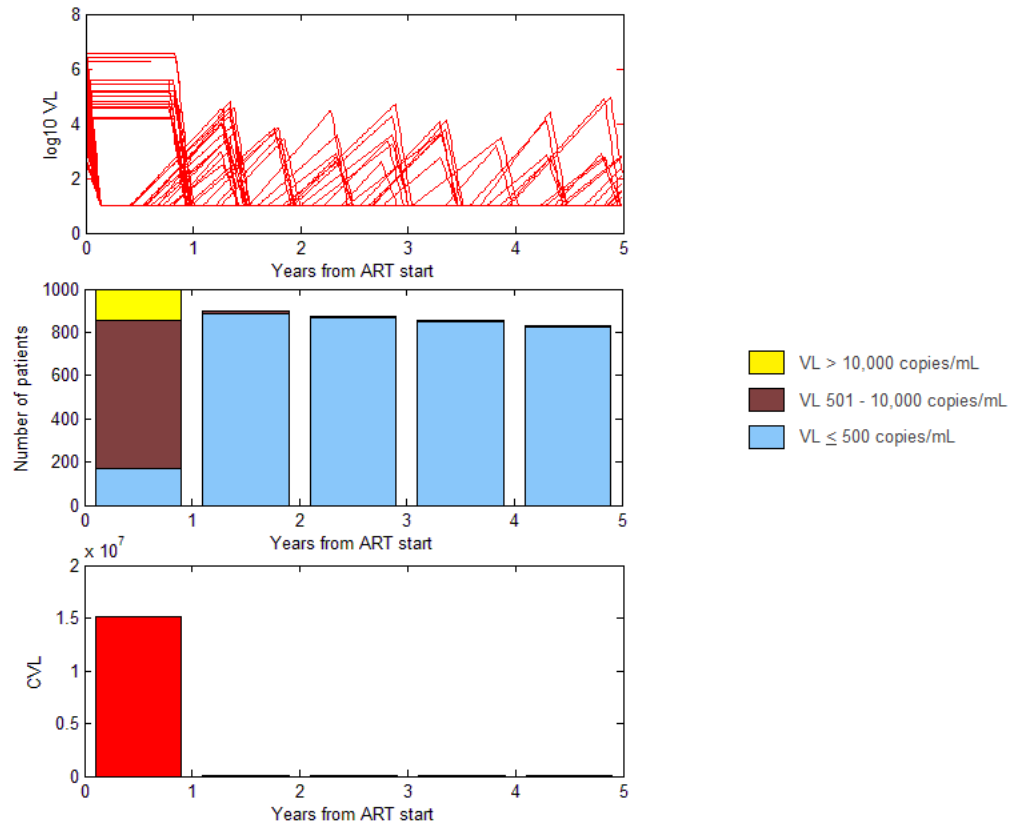
- > Number of new infections in a time period depends also on several other factors: sexual network, risk behaviour, frequency of acts...
- > Community viral load (CVL; sum of individual viral loads) has been proven to correlate with the number of new infections

Transmission: Results

CD4 monitoring



Routine viral load monitoring



Limitations:

- > Follow up time very short
- > Effect of routine viral load monitoring to adherence cannot be estimated accurately
- > Real number of new infections depends not only on CVL but on a variety of assumptions

General conclusions

- > Routine viral load monitoring can reduce mortality and prevent new infections
- > These benefits depend highly on the effect of routine viral load monitoring to adherence
- > Our mathematical model is a useful tool to compare different strategies of ART monitoring

- > Our model can be extended to include several other factors (e.g. costs, CD4 trajectories)
- > We will extend the model to a full transmission model to investigate the long-term outcomes of the epidemic
- > The model can be implemented for different research questions and further to include co-infections or even model other diseases

Acknowledgements

- > Olivia Keiser, Matthias Egger and the entire leDEA Southern African team (University of Bern, Switzerland; University of Cape Town, South Africa)
- > Participating sites:
 - > Gugulethu and Khayelitsha ART Programmes (South Africa)
 - > Center for Infectious Disease Research in Zambia
- > Tim Hallett (Imperial College London, United Kingdom)
- > National Institute of Allergy and Infectious Diseases
- > Swiss National Science Foundation
- > Swiss School of Public Health