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# Antiretroviral therapy reveals triphasic decay of intact SIV genomes and persistence of ancestral variants

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# Summary

The decay kinetics of HIV-1-infected cells are critical to understand virus persistence. We evaluated the frequency of simian immunodeficiency (SIV)-infected cells for 4 years of antiretroviral therapy (ART). The intact proviral DNA assay (IPDA) and an assay for hypermutated proviruses revealed short- and long-term infected cell dynamics in macaques starting ART ~1 year after infection. Intact SIV genomes in circulating CD4<sup>+</sup>T cells showed triphasic decay with an initial phase slower than decay of plasma virus, a second phase faster

E.J.F., R.F.S, J.D.S., D.H.B. designed the study.

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D.H.B., P.L., J.D.V., and R.G. provided samples, information and drugs related to the animal work.

A.M.B. provided samples that were used for assay development and optimization.

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E.J.F. wrote the manuscript.

R.F.S. and J.D.S. revised the manuscript.

Declaration of Interests

Aspects of HIV-1 IPDA are subject of a patent application PCT/ US16/28822 filed by Johns Hopkins University. R.F.S. is an inventor on this application. Accelevir Diagnostics holds an exclusive license for this patent application. R.F.S. holds no equity interest in Accelevir Diagnostics.

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than second phase decay of intact HIV-1, and a stable third phase reached after 1.6–2.9 years. Hypermutated proviruses showed bi- or mono-phasic decay, reflecting different selective pressures. Viruses replicating at ART initiation had mutations conferring antibody escape. With time on ART, viruses with fewer mutations became more prominent, reflecting decay of variants replicating at ART initiation. Collectively, these findings confirm ART efficacy and indicate cells enter the reservoir throughout untreated infection.

# eTOC Blurb

SIV-infected macaques are an important animal model for people living with HIV (PLWH). Fray et al. measured the decay of SIV-infected cells after treatment with antiretroviral therapy. They found that SIV-infected cells decay more rapidly than in PLWH and provide a benchmark for evaluating future cure strategies in this model.

# **Graphical Abstract**



# Introduction

Antiretroviral therapy (ART) halts HIV-1 replication, resulting in a rapid biphasic drop in viremia to below the detection limit<sup>1</sup>. However, ART is not curative due to a pool

of latently infected CD4<sup>+</sup> T cells that harbor replication-competent transcriptionally silent proviruses<sup>2–4</sup>. This small population of cells has a half-life of 3.7 years, guaranteeing lifetime HIV-1 persistence even with optimal ART<sup>5,6</sup>. Regardless of the length of treatment, viremia rapidly rebounds if ART is stopped<sup>7,8</sup>.

The decay kinetics of plasma virus and infected CD4<sup>+</sup> T cells provide insights into the establishment and persistence of the latent reservoir<sup>1,9,10</sup>. However, the measurement of infected cell populations is complicated because in people living with HIV-1 (PLWH) on ART, most infected cells harbor proviruses with fatal defects, including large deletions and APOBEC3G/F-mediated G-to-A hypermutation<sup>11–19</sup>. To address this problem, we developed a digital droplet PCR (ddPCR) assay in which individual proviruses suspended in nanoliter-sized droplets are interrogated with two strategically chosen amplicons that are more likely to detect intact viral genomes<sup>20,21</sup>. This intact proviral DNA assay (IPDA) provides a more accurate measurement of the reservoir size by excluding most defective proviruses.

The IPDA was used to confirm the long-term stability of the reservoir<sup>21–24</sup> and more recently, to measure the decay of intact and defective HIV-1 genomes during the first 2 years of ART<sup>25</sup>. Some intact genomes detected at ART initiation may be linear unintegrated viral DNA molecules in resting cells<sup>26,27</sup>. However, these forms decay within days<sup>28,29</sup>, and in activated cells, integration occurs within hours of completion of reverse transcription<sup>30</sup>. Thus, most viral genomes detected with the IPDA are integrated proviruses. White *et al.* used the IPDA to show that after ART initiation intact genomes decayed with biphasic kinetics characterized by a rapid initial phase ( $t_{1/2} = 12.9$  days) and a slower second phase ( $t_{1/2} = 19$  months) that was still faster than the slow reservoir decay observed in PLWH on long-term ART<sup>5,24,25,31</sup>. In this same study, cells with defective proviruses showed biphasic decay and long-term stability<sup>25,32–35</sup>. These findings raise questions about the nature and location of the populations of infected cells that produce most of the plasma virus, the mechanisms by which they decay, and the relationship between these rapidly decaying populations and the latent reservoir.

These questions can be more easily addressed in macaques infected with simian immunodeficiency virus (SIV) because the sequence of the infecting virus and the timing of infection and ART can be controlled<sup>36–39</sup>. As in PLWH, there is viremia, progressive CD4<sup>+</sup> T cell depletion, chronic immune activation, decay of viremia upon ART initiation, immune control in some instances, and a latent reservoir established in resting CD4<sup>+</sup> T cells<sup>37,40–50</sup>. Measurement of the SIV latent reservoir is also complicated by defective viral genomes<sup>20,51</sup>. The decay of SIV-infected cells in macaques on ART has not been fully described.

Here, we evaluated changes in the frequency of SIV-infected cells for 4 years following ART initiation. We used the IPDA and an assay for hypermutated proviruses to compare the decay rates of intact and defective proviruses. We used single-genome sequencing (SGS) of plasma virus and proviral DNA to examine qualitative changes in infected cell populations during ART. The sequencing analyses provided strong evidence for the efficacy of ART and insights into whether the latent reservoir is established predominantly at ART initiation or

continuously throughout untreated infection<sup>52–56</sup>. The changes in infected cell populations identified here should be considered in the design and evaluation of cure interventions.

# Results

# **Cohort characteristics**

We studied Indian-origin rhesus macaques (cohort 18–02, n=10) inoculated with SIVmac<sub>251</sub> by repetitive low-dose intrarectal challenge (Fig. 1A, Fig. S1). After 48 weeks, animals were placed on a combination ART regimen of tenofovir disoproxil fumarate, emtricitabine, and dolutegravir (TDF/FTC/DTG)<sup>57,58</sup>. They were maintained on ART without additional interventions for >4 years (Fig. 1A). Cohort details are included in the supplement and the STAR Methods section (Fig. S1A).

### Changes in plasma virus upon ART initiation

All animals were infected by SIVmac<sub>251</sub> after one or more challenges, and showed peak viremia typical of SIV infection of rhesus macaques (geometric mean =  $1.05 \times 10^7$  copies/ml) (Fig. S1A)<sup>41</sup>. ART rapidly suppressed viral replication as demonstrated by an exponential decrease in plasma SIV RNA (Fig. 1B, Fig. S1B). For 6 of 10 animals, plasma SIV RNA levels fell below the detection limit within 4 weeks (Fig. 1B, Fig. S1B). 4 of 10 animals experienced infrequent blips during the first 48 weeks of ART, after which plasma SIV RNA remained undetectable (Fig. 1B).

## IPDA analysis of reservoir size and changes in intact proviruses on ART

According to classic viral dynamics models<sup>1,9,10,59</sup>, the rapid drop in viremia following ART initiation (Fig. 1B) reflects the loss of productively infected cells. However, this prediction is difficult to verify because cells that produce most of the plasma virus may not be in the circulation<sup>25,60</sup>, and because many cells carry defective proviruses<sup>20,21,61</sup>. Therefore, we used the SIV IPDA<sup>20</sup> to quantitate cells with intact proviruses. This assay excludes most deleted or hypermutated proviruses<sup>20,21</sup>. Our analysis also included a duplex ddPCR assay for a cellular gene (RPP30) and a duplex ddPCR assay for 2LTR circles (Fig. 1C)<sup>20,62</sup>

At ART initiation, intact proviral frequencies in circulating  $CD4^+$  T cells were similar to those in untreated PLWH (Fig. 2A–C, geometric mean frequency 3,642 copies per 10<sup>6</sup> CD4<sup>+</sup> T cells, compared to 2,255 copies per 10<sup>6</sup> CD4<sup>+</sup> T cells for HIV-1<sup>25</sup>). We did not observe a relationship between viral load at week 0 and the frequency of intact proviruses at either week 0 or at a later time point (week 92) after which the more labile populations of infected cells have largely decayed (Fig. S1B, C). We observed rapid initial decay of intact proviruses over the first 4 weeks of ART, a small but consistent increase around 12 weeks (Fig. 2A), then slower decay for ~2 years until stabilization occurred (Fig. 2B). We used non-linear mixed-effects modeling to determine the decay rate of intact proviruses. Changes in the frequency of cells harboring intact genomes were best described by a three-phase model, which is most evident in plots for individual macaques (Fig. 2C, Table S1).

During the first 4 weeks of ART, intact SIV proviruses decayed with a half-life of 3.3 days (95% CI: 2.5–4.5 days), faster than the initial decay of HIV-1 proviruses in people initiating ART (12.9 days<sup>25</sup>). Although fast compared to the subsequent decay of the remaining intact SIV proviruses, it is nevertheless slower than the decay of plasma SIV RNA over the same period (Fig. S1D, E). Therefore, the very rapid initial decay of viremia may reflect the equally rapid death of infected cells located primarily in tissues, as seen for HIV-1<sup>25</sup>.

Given the strong suppression of viremia upon ART initiation, the increase in intact proviruses at week 12 was unexpected. Single genome sequencing described below did not reveal any unique properties of variants detected at week 12, such as an increase in divergence. This increase at approximately the same time post-treatment has also been observed in an independent cohort of SIV-infected animals (unpublished data, Fray) and may reflect a redistribution of infected cells from tissues to blood<sup>63,64</sup>. In modeling the decay kinetics, we tested models that included (Table S1) or ignored the week 12 time point (Table S2). Whether the week 12 data were included or not, the best fit model was consistent with a triphasic decay pattern. All results discussed below are based on the full dataset (Table S1). It is unclear whether this increase in intact proviruses also occurs in animals that are started on ART after the relatively short periods of untreated infection characteristic of many cure studies.

The rapid initial decay of intact SIV proviruses was followed by a slower second phase ( $t_{1/2}$  = 8.1 months, 95% CI: 6.5–10.0 months). This decay is also faster than the second phase decay of intact HIV-1 proviruses ( $t_{1/2}$  = 19 months<sup>25</sup>). The more rapid first and second-phase decay of intact SIV genomes relative to HIV-1 has not been previously described. After a mean of 2.3 years (95% CI: 1.6–2.9 years), the slope changes to a stable third phase with no decay (Fig. 2C, Tables S1, S3). Most SIV cure experiments are conducted during the first 2 years of ART, when the more rapid second phase decay is still occurring. Thus, adequately powered control groups are needed to distinguish natural and intervention-induced decay.

#### Decay of 2LTR circles during ART

2LTR circles showed triphasic decay similar to that measured for intact proviruses (Fig. S2, Tables S1, S4). After 4 years of ART, 2LTR circles were rare.  $env^+$ 2LTR circles, which are subtracted from the Q2 IPDA result, were only detected in 2 of 8 animals at weeks 208–216 (Fig. S2). The low frequency of  $env^+$ 2LTR circles after 4 years of ART could reflect the death of cells harboring the circles and/or cellular proliferation causing dilution of the circles which are not copied during replication of host cells. Overall, total and  $env^+$  2LTR circles showed decay kinetics that were very similar to those described for intact proviruses (Fig. S2, Tables S1, S3), as is the case with HIV-1<sup>25</sup>.

#### An assay for hypermutated proviruses

In addition to detecting intact proviruses in Q2, the HIV-1 IPDA detects proviruses with hypermutation and/or deletions in Q1 and proviruses with 5' deletions in Q4<sup>21</sup>. Because of differences in the distribution of defects, the SIV IPDA uses different amplicons<sup>20</sup>, and many of the defective proviruses end up in Q3 (Fig. 1C) with the droplets that do not contain a provirus (estimated ~55% compared to ~3.8% for HIV based on *in silico* analyses

of near-full-length sequencing data<sup>20,21</sup>). For this reason, the SIV IPDA does not provide quantitation of defective proviruses. To determine whether decay of intact proviruses is due to virus-dependent factors such as viral cytopathic effects and immune clearance or to virus-independent factors such as normal CD4<sup>+</sup> T cell turnover, we developed a method to quantify one class of defective SIV genomes. APOBEC3G/F-mediated hypermutation introduces multiple missense and nonsense mutations in most open reading frames, likely precluding high-level viral gene expression<sup>20</sup>. We therefore developed a ddPCR assay specific for hypermutated SIV proviruses based on the same principles and amplicon positions as the SIV IPDA. We used fluorescently labeled *pol* and *env* probes with 2 G $\rightarrow$ A mutations at frequently hypermutated positions within each probe and unlabeled competitor probes with the non-mutated sequences (Fig. S3). Details of the Hypermutated Proviral DNA Assay (HPDA) are provided in the supplement (Fig. S3).

Hypermutated proviruses were less frequent than intact proviruses (geometric mean frequency = 539 copies per  $10^6$  CD4<sup>+</sup> T cells, compared to 3,642 intact copies per  $10^6$  CD4<sup>+</sup> T cells, Fig. 3A). Hypermutated proviruses were most abundant at the time of ART initiation (Fig. 3A) and decayed with kinetics different from those of intact proviruses (Fig. 3B) and variable between animals (Table S5). The best-fit model for hypermutated proviruses was not uniform. There was biphasic decay for 5 animals and monophasic decay for the other 5 (Fig. 3B, Table S5). For the animals with biphasic decay, hypermutated proviruses decayed initially with an average half-life of 42 days (95% CI: 31–55 days), followed by a stable second phase with no decay (Fig. 3B, Tables S1, S5). For the other 5 animals, we observed monophasic decay with an average half-life of 27.8 months (95% CI: 19.5–39.9 months) (Fig. 3B, Tables S1, S5). These kinetics are strikingly different from those described for cells harboring intact SIV proviruses. Overall, the decay of hypermutated proviruses is slower, such that by week 216 the average frequencies are similar (Fig. 3A).

#### Analysis of infected cell decay using gag PCR

Many SIV reservoir studies use a single amplicon in the well-conserved *gag* gene to quantify SIV DNA<sup>65,66</sup>. We therefore analyzed viral decay using a ddPCR assay targeting *gag*<sup>67</sup>. This assay gave values similar to, or slightly higher than those measured by the IPDA (Fig. 4A). This reflects the fact that the ratio of intact to defective proviruses is higher for HIV-1 than for SIV<sup>20,21,51</sup> and the fact that some defective SIV proviruses have hypermutation or deletions affecting the *gag* amplicon and thus are also excluded by the *gag* PCR assay. We found a strong positive correlation between the *gag* and IPDA assays (r=0.8812, R<sup>2</sup>=0.7765, 95% CI=0.8281–0.9186, p<0.0001, n=100; Pearson's test). Even when the *gag* data were corrected by the same *env*+2LTR correction applied to the IPDA values (Fig. 4B; r=0.8854, R<sup>2</sup>=0.7840, 95% CI=0.8341–0.9216, p<0.0001, n=100; Pearson's test), *gag* values were, in general, higher, likely reflecting the detection of some defective proviruses with the *gag* assay.

As with intact proviruses, the decay of *gag*<sup>+</sup> DNA was best described by a triphasic model (Fig. 4C, Tables S1, S6). The average first phase half-life was 6.5 days (95% CI: 5.9–7.4 days), not significantly different from the initial decay of intact proviruses. However, at the later time points the half-lives became longer relative to intact proviruses (Table S6). We

calculated an average second phase half-life of 13.0 months (95% CI: 11.8–14.1 months; Table S1). After a mean of 34.5 months (95% CI: 27.3–43.3 months) there was a third phase with essentially no decay (Tables S1, S6). These results are consistent with the fact that the *gag* assay is also capturing some defective proviruses, which generally have a longer half-life<sup>24,25</sup>. Indeed, the *gag* probe detected hypermutated proviruses with 1 to 3 G→A mutations in the probe binding site (Fig. S4A–C). Consistent with this observation, the greatest differential between *gag* and IPDA measurements was found in animals with a higher frequency of hypermutated proviruses detected by the HPDA (animals T523, T530 and T537; Fig. 4C, Fig. S4B, D), although as time on ART increased, there was a greater discrepancy between the two assays in most animals. Therefore, the *gag* assay is a good approximation of the total abundance of viral DNA, including defective proviruses, but overestimates the frequency of intact proviruses, especially after longterm ART.

#### Qualitative changes in infected cell populations on ART

To understand qualitative changes in the pool of SIV-infected cells following ART initiation, we collected a large number of *env* sequences by single-genome sequencing of DNA from peripheral blood CD4<sup>+</sup> T cells at weeks 0–216 of ART (Fig. 5A). After excluding sequences with deletions, frameshifts, or hypermutation, we were left with ~1700 sequences that were non-defective in the *env* gene. We determined the average pairwise distance (APD) from the consensus sequence of the inoculum<sup>57</sup>. We found no increase in APD over ~4 years of treatment (Fig. 5B, Table S7). Thus, despite the enormous diversification and divergence away from the stock sequence during untreated infection, there was no further evolution during ART. In fact, APD decreased with increasing time on ART (Fig. 5C). The mechanism underlying this apparent "reverse evolution" is described below.

We also analyzed env sequences for evidence of proliferation of infected cells, as has been clearly demonstrated in PLWH<sup>68–72</sup>. In macaques infected with SIVmac<sub>251</sub> for ~1.5 years and treated with ART for 60 weeks<sup>20</sup>, we previously found only 2 pairs of identical sequences among more than 500 independent env sequences. Another study used integration site analysis to recover matching integration sites from macaques treated during acute infection, although at low abundance<sup>73</sup>. The extended follow-up here allowed us to observe the appearance of identical sequences over time. Among ~1700 non-defective sequences from 9 animals, the fraction of identical sequences increased with time on ART (Fig. 5C) as seen in PLWH<sup>12,72</sup>. However, proviruses with identical sequences could contain polymorphisms elsewhere  $^{74,75}$ . Therefore, we extended our analysis to include 226 defective, hypermutated sequences collected from 3 animals (Fig. 5D) and captured identical sequences. Proviruses with extensive hypermutation are unable to replicate<sup>20</sup>, and therefore must arise through proliferation or through infection of multiple cells by the same viral variant with APOBEC3G/F-mediated hypermutation subsequently occurring in exactly the same way in each cell. Analysis of the likelihood of  $G \rightarrow A$  mutation at each G in *env* (see Methods) showed that the likelihood of the latter scenario is extremely low ( $p<10^{-7}$ ). Thus, infected cells with identical hypermutated env sequences arise through a proliferative process that also likely explains at least some of the identical intact env sequences observed at later time points.

### env sequence analysis and evidence of antibody pressure

We also compared *env* sequences from plasma virus at ART initiation to non-defective proviral env sequences from circulating CD4<sup>+</sup> T cells at various time points on ART (Fig. 5A). A representative maximum likelihood phylogenetic tree for animal T530 is shown in Figure 6. This tree is rooted on the consensus of the stock sequences<sup>57</sup> and illustrates the enormous sequence divergence from the stock and intra-individual diversification arising during untreated infection. Similar patterns were observed for all other animals (Fig. S5-12). Although all animals were infected with the same stock, the divergence occurred differently in each animal as shown by a composite phylogenetic tree (Fig. S13A). The exception is T624 (Fig. S13B), which spontaneously controlled viral replication to low levels before ART (Fig. S1). However, for the other 9 animals, in all cases mutations accumulated in the gp120 variable regions. The V1/V2 and V4 regions of the SIV env gene are under strong selective pressure from the antibody response  $^{76-90}$ , and key amino acid positions consistently accumulate non-synonymous mutations in MHC-disparate animals, coincident with the development of autologous neutralizing antibodies (aNabs). We found many previously reported mutations<sup>80,88</sup>, including at N202, W345, D415, R420, P421, and R424. In 9 animals, we found the R424Q mutation, an early indicator of escape from humoral immunity<sup>88</sup>. Other mutations alter potential N-linked glycosylation sites (PNGs), including D415N, which creates a new PNG, and non-synonymous changes at residue N202, which removes a PNG in  $V1^{83,84,88}$ . These mutations were observed in more than one, and sometimes as many as 9 of 10 animals. In 2 animals (T530 and T623), we also observed characteristic deletions in V4 (Fig. 6, Fig. S9) that mediate escape from aNabs<sup>80,88</sup>.

# Plasma sequences at ART initiation show high divergence from the stock relative to proviral sequences in CD4<sup>+</sup> T cells

The time 0 plasma sequences represent virus actively replicating at ART initiation. In addition to the ~1700 sequences collected from CD4<sup>+</sup> T cell DNA, we collected over 300 plasma sequences from 9 animals at week 0. Compared to proviral env sequences in circulating CD4<sup>+</sup> T cells at the same time, plasma sequences showed a high mean divergence from the stock in all 9 animals analyzed (Fig. 7A). Plasma sequences were consistently mutated at the positions associated with antibody pressure (Fig. 6, Fig. S5-12). No wild-type sequences that clustered closer to the root were recovered from plasma from any animal at week 0 (Fig. 6, Fig. 7B, Fig. S5-12). Importantly, the time 0 plasma sequences were found predominantly on distal branches (Fig. 6, Fig. 7B, Fig. S5–12). This can be illustrated by comparing the number of non-synonymous mutations away from the stock per sequence for the time 0 plasma and cellular sequences (Fig. 7B). Some circulating CD4<sup>+</sup> T cells present at ART initiation contained SIV variants that had accumulated antibody escape mutations similar to those in plasma, while other  $CD4^+ T$  cells present at the same time harbored variants that had fewer of these mutations and that were not seen in plasma at the time of ART initiation. These are likely ancestral sequences from earlier pre-ART time points preserved in the latent reservoir. This finding was consistent for all animals and not related to the depth of sampling (Fig. 7B).

# Sequences with large numbers of antibody escape mutations become less abundant at later time points

In contrast to the normal pattern of increasing divergence over time in untreated infection<sup>41,74,88,91,92</sup>, sequences with large numbers of antibody escape mutations became less abundant at the later time points on ART (Fig. 7C). This is evident in the phylogenetic trees (Fig. 6, Fig. S5–12). Relatively unmutated sequences close to the root were frequently isolated at later time points. At weeks 120-216 on ART, sequences with few or no mutations relative to the stock became more apparent. We analyzed the kinetics of the decay process by examining changes in the mean number of non-synonymous mutations per sequence (Fig. S5-12. 7D). Modeling revealed a biphasic decay pattern. The initial phase of decay has a half-life of 11.4 weeks (95% CI: 4.6–28.1 weeks). The second phase is so slow as to be statistically indistinguishable from "no decay." The net result of these qualitative changes is summarized in Fig. 7C, which shows that at almost all positions in the env ectodomain mutations are less frequent after 3 years of ART than at ART initiation. This finding is consistent with the decay process described above. The infected cells that decay after ART initiation carry proviruses with multiple immune escape mutations. As these cells decay, less mutated ancestral sequences persisting in the latent reservoir become more apparent. Strikingly, many of these variants closest to the root of the trees are from later on-ART time points (Fig. 6, Fig. S5-12). These results provide strong evidence that ART arrests viral evolution; but more importantly, they show that viruses are deposited in the latent reservoir throughout untreated infection and not just at ART initiation.

# Discussion

To inform HIV-1 cure strategies, we characterized quantitative and qualitative changes in SIV-infected CD4<sup>+</sup> T cells following ART initiation during chronic infection and over the next 4 years. Our findings provide critical insights into the dynamics of infected cells over a time frame in which many intervention studies are conducted.

Overall, the decay kinetics of cells harboring intact SIV proviruses are similar to those reported for HIV-1<sup>25</sup>. In both cases, there is complex, multiphasic decay, with the final phase representing the stable persistence of a latent reservoir in CD4<sup>+</sup> T cells. For both viruses, there are different decay rates for intact and defective proviruses, likely reflecting selective pressures operating on cells capable of expression viral genes. In both cases, cells with 2LTR circles decay with kinetics similar to those of intact proviruses. Together, these findings support the use of the non-human primate (NHP) model in HIV-1 cure research.

Our study did uncover important differences in decay kinetics that must be considered in cure studies. Notably, although the frequency of intact genomes at the start of ART was similar for SIV and HIV-1 (geometric mean frequency = 3,642 vs. 2,255 per  $10^6$  CD4<sup>+</sup> T cells<sup>25</sup>, the first and second phase half-lives for intact SIV genomes are significantly shorter than those reported for HIV-1 (3.3 days and 8.1 months for SIV vs. 12.9 days and 19 months for HIV-1<sup>25</sup>). Differences in the second phase decay kinetics are particularly important given that most cure studies in NHP models involve interventions carried out during second phase decay. The relatively quasi-stable third phase is not reached until ~2.3 years of ART. Studies

of cure interventions during this second phase must include robust untreated controls to distinguish natural vs. intervention-induced decay.

By following treated macaques for 4 years, we observed in the same animals both the early and late phase dynamics shaping the latent reservoir. Most of the plasma virus is produced by rapidly decaying cells that are not present in the circulation (Fig. S1D, E)<sup>60</sup>. However, most infected CD4<sup>+</sup> T cells in the circulation at ART initiation are also labile and decay during the first 2.3 years without entering the stable latent reservoir. The stable reservoir becomes apparent as rapidly decaying cells are eliminated (Figs. 5–7). The proliferation of infected cells generates large clones, which after several years comprise a substantial fraction of the reservoir (Fig. 5C, D). This proliferation is particularly evident in HIV-1-infected individuals on long-term ART<sup>68–70</sup>, and may be responsible for the inflection in the decay of intact proviruses seen after 7 years of ART<sup>24</sup>.

We also developed an assay for hypermutated SIV proviruses. Most hypermutated SIV genomes have premature stop codons in most genes<sup>20,93</sup> and are unlikely to give rise to high-level viral gene expression. We demonstrate slower decay of cells with hypermutated proviruses relative to intact proviruses, consistent with selective processes acting against cells that express viral genes<sup>21,23–25,94</sup>.

We also compared a single amplicon in *gag* to the IPDA. The *gag* assay provides a reasonable measure of intact proviruses at the beginning of ART. However, it becomes progressively less accurate with increasing time on ART as cells with intact proviruses decay and cells with defective proviruses, many of which are detected by the *gag* assay, persist.

Lastly, we used *env* SGS to determine whether the quantitative changes in infected cell populations were accompanied by qualitative changes. We show that infected cell populations change in composition during ART. The populations that decay initially are recently infected cells carrying proviruses with immune escape mutations. As these populations decay, ancestral variants with fewer mutations that are archived in the latent reservoir and that are not present in the plasma at the time of ART initiation become more prominent. Our results show that sequences arising throughout the period of untreated infection can be deposited in the latent reservoir. The reservoir includes both early sequences with few escape mutations as well as sequences that have accumulated more escape mutations and are deposited shortly before the time of ART initiation. All of these variants can persist in the reservoir without immune selection as long as viruses remain latent. What changes is the relative proportion of these early and late variants. The change is due to the decay processes defined here. At the time of ART initiation, the population of productively infected cells, as sampled by sequencing of plasma virus, consists exclusively of sequences with many escape mutations (red bars associated with black squares in Fig. 6 and Figs. S5-12). Some of these variants persist and are deposited in the reservoir after several years of ART (blue and purple bars near the top of Fig. 6, Figs. S5–12). Variants with fewer mutations are also preserved in the reservoir and become more prominent with increasing time on ART, as most of the variants that were actively replicating at the time of ART initiation decay. In the long-term, variants from both early and late in untreated infection persist in the reservoir.

This finding is important in the context of recent studies suggesting that the reservoir is predominantly comprised of cells infected at or around the time of ART initiation<sup>52,53,56,95</sup>. The observed decrease in APD from the stock, the observation that sequences with more mutations in the *env* variable regions become less apparent at later time points, and the emergence of archival variants during ART are more consistent with a model in which sequences enter the reservoir continually throughout untreated infection<sup>54</sup>. Latency explains how the cells harboring archival sequences persist during untreated infection in the context of high levels of immune activation, CD4<sup>+</sup> T cell death and surveillance from the host immune system. Some of these factors are altered by ART, skewing the reservoir towards variants replicating around the time of treatment initiation. However, it is incorrect to conclude that the reservoir is composed exclusively of such variants.

There are limitations to our study. First, we analyzed only peripheral blood  $CD4^+$  T cells. Although we hypothesize that the increase in intact proviruses observed at week 12 is due to the redistribution of  $CD4^+$  T cells from tissues to the blood, we have not directly tested this due to limited tissue sample availability from this longitudinal cohort.

Furthermore, the discrepancy between the initial decay rates of plasma viremia and intact proviruses in the blood suggests that the cells producing plasma virus are found at another anatomical location. It will be important to test this hypothesis in future studies using contemporaneous blood and tissue samples. Another important consideration is that the animals in cohort 18-02 were treated during chronic infection. Many NHP studies initiate ART much earlier and may show different decay dynamics.

Together, these findings reveal that the population of SIV-infected CD4<sup>+</sup> T cells is dynamic and changes quantitatively and qualitatively for several years following ART initiation. These data provide a framework for evaluating and interpreting intervention trials utilizing the SIV/NHP model.

# STAR Methods

### Resource availability

**Lead contact**—Further information and requests for resources and reagents should be directed to and will be fulfilled by the lead contact, Dr. Robert F. Siliciano (rsiliciano@jhmi.edu).

Materials availability—This study did not generate new unique reagents.

#### Data and code availability

- Sequences generated in this study have been deposited in Genbank and are publicly available as of the date of publication. Accession numbers are listed in the key resources table.
- This study does not report original code and all computational resources used are publicly available and listed in the key resources table.

Any additional information required to reanalyze the data reported in this paper is available from the lead contact upon request.

#### Experimental model and subject details

**Animals**—Animal work was approved by the Institutional Care & Use Committees of Bioqual and the NIH and determined to be in accordance with the guidelines outlined by the Animal Welfare Act and Regulation (USDA) and the Guide for the Care & Use of Laboratory Animals, 8<sup>th</sup> Edition (NIH).

Cohort 15–09: The details of this study have been described elsewhere<sup>20,93</sup>. Near-full-length sequencing data collected from SIV-infected Rhesus macaques (n=7, Bender, et al.<sup>20</sup>; or n=16, Liu, et al.<sup>93</sup>) were used for assay development and verification of assay targets, as detailed in the "HPDA sequence validation" subsection below.

Cohort 18–02: 10 outbred Indian-origin rhesus macaques (*Macaca mulatta*) were housed at Bioqual Inc. in Rockville, MD. Animals were infected via repetitive intrarectal challenge with the SIVmac<sub>251</sub> swarm<sup>57</sup> until infection was confirmed by detection of SIV RNA in the plasma via qPCR. After ~48 weeks, the animals were placed on a daily regimen of tenofovir disoproxil fumarate, emtricitabine, and dolutegravir (TDF/FTC/DTG, Gilead Sciences, Inc.<sup>58</sup>. The animals were MHC class I genotyped as previously described<sup>96</sup>. MHC genotypes, ages and sexes of the animals in this cohort are detailed below.

Animal ID	Sex	Age at time of infection (years)	MHC-A haplotype 1	MHC-A haplotype 2	MHC-B haplotype 1	MHC-B haplotype 2
T523	F	7.6	A*002	A*701	B*017	B*017
T530	F	6.6	A*023	A*002	B*001	B*024
T537	F	5.8	A*011	A*012	B*012	B*012
T544	М	3.6	A*004	A*019	B*024	B*015
T545	М	4.8	A*004	A*002	B*015	B*055
T623	М	4.9	A*004	A*018	B*015	B*076
T624	М	5.1	A*028	A*002	B*001	B*055
T625	М	4.8	A*002	A*002	B*015	B*043
T627	М	3.3	A*004	A*025	B*048	B*069
T628	М	4.4	A*001	A*004	B*012	B*012

#### Method details

**SIV viral load quantification**—Plasma SIV RNA was quantified using a qRT-PCR assay targeting *gag* as described<sup>97</sup>.

**CD4<sup>+</sup> T cell isolation & DNA extraction**—PBMCs were collected from whole blood, viably frozen in DMSO, and stored in liquid nitrogen until sample processing. Cells were rapidly thawed at 37°C in RPMI + 20% heat-inactivated FBS and subjected to negative depletion using the Miltenyi NHP CD4 Isolation Kit according to the manufacturer's

protocol. After negative depletion, up to  $5 \times 10^6$  cells were pelleted and resuspended in 200 µl PBS, then lysed for DNA extraction using the QiAamp DNA Mini Kit according to the manufacturer's directions.

**Droplet digital PCR (ddPCR)**—Specific primer and probe sequences for each assay are described in Table S8<sup>20,67</sup>. Details specific to individual assays are described below under sub-headings. Conditions common to all ddPCR experiments are described here:

Samples were assayed in triplicate unless indicated otherwise. Reactions were conducted in a total volume of 22 µl with 10 µl 2X Bio-Rad ddPCR Supermix (no dUTPs). Primers were included at a final concentration of 600 nM, and probes at a final concentration of 200 nM. Droplets were made using the Bio-Rad QX200 manual droplet generator and thermal-cycled using a Bio-Rad QX200 Thermalcycler and the following conditions: 95°C for 10 minutes, 50 cycles of (30 seconds at 94°C, 2 minutes at 56°C), and 10 minutes at 98°C, with a ramp rate of 2°C/s. Cycling conditions were modified from the original protocol described by Bender et al.<sup>20</sup> to include more cycles, a lower extension temperature and a longer extension time. Droplets were read by the Bio-Rad QX200 Reader and analyzed with Quantasoft Studio Software. Wells with <10,000 droplets were not analyzed.

**RPP30**—Host genomes in each sample were quantified using a duplex ddPCR assay with 2 amplicons specific for the Rhesus macaque Ribonuclease P/MRP Subunit 30 (*RPP30*) gene and spaced at the same distance as the SIV IPDA amplicons<sup>20,21</sup>. The RPP30 primer/probe pairs are listed in Table S8. Primers were included at a final concentration of 500 nM and probes at a final concentration of 250 nM. RPP30 data were used to correct for DNA shearing and to determine the number of host cells per sample.

**IPDA**—The IPDA was performed as described<sup>20</sup> using the primer/probe pairs indicated in Table S8.

**env-2LTRc**—The *env-*2LTRc duplex assay was performed as described<sup>20,62</sup> using the primer/probe pairs indicated in Table S8.

**Hypermutated Proviral DNA Assay (HPDA)**—The HPDA was performed using the primer/probe pairs described in Table S8. 6 replicates were performed per sample to account for the overall lower frequency of hypermutated proviruses. Details of assay design, optimization and validation are given below.

**HPDA** – **sensitivity and specificity**—The HPDA is an assay designed to quantify hypermutated proviruses, based on the same principles as the IPDA (Fig. S3A)<sup>1</sup>. To test whether the HPDA correctly distinguishes between templates that are intact at both positions and those which are hypermutated at both positions, we designed synthetic DNA templates to match the *pol* and *env* sequence encompassing the region of the HPDA amplicons (Fig. S3B). We designed these templates to reflect the intact probe sequence (no G→A mutations) or hypermutated probe sequence (two G→A mutations) at one or both amplicons, and tested them using the HPDA, or, as a control, the IPDA (Fig. S3C). Both assays performed as predicted for proviruses matching hypermutated or intact sequences at one or both

amplicons (Fig. S3C). These data are consistent with control experiments performed when validating the SIV IPDA<sup>1</sup> and provide evidence that switching the labeled and unlabeled probes does not affect the assay's ability to differentiate between intact and hypermutated templates. Using these controls, we determined that the HPDA is sensitive and specific for hypermutated proviruses and performs well using the same thermal-cycling conditions as the IPDA.

**HPDA** – sequence validation—Although the HPDA performed well when used to measure templates which exactly match one of two target sequences, in vivo, SIV proviruses may contain polymorphisms which could affect probe binding. Because the assay we describe here essentially relies on two bases within each amplicon to discriminate intact and hypermutated proviruses, it is important to determine whether additional sequence variation in the probe site could affect our ability to detect hypermutated genomes in biological samples from infected macaques. We therefore analyzed the same 266 sequences used to design the IPDA<sup>1</sup> for sequence conservation within the probe binding site (Fig. S3D, E). By this analysis, approximately 30% of hypermutated proviruses would be missed by our assay due to deletions encompassing both probe sites. However, ~90% of proviruses with sequence information for at least one of two probe sites (i.e. proviruses without deletions at both amplicons) would be detected by the HPDA. In addition to these 266 sequences, we extended our analysis to a dataset of 259 near full-length (nFL) hypermutated sequences collected from 16 SIVmac<sub>251</sub>-infected macaques from that same cohort (Fig. S3F, G)  $(1509)^3$ . This dataset was generated using PCR product size as an exclusion-criteria to specifically collect nFL sequences, therefore proviruses with deletions are not included. The majority (81% for *pol* and 66% for *env*) of hypermutated proviruses included in this analysis directly matched the HPDA probe sequences, emphasizing that the HPDA probe positions with  $G \rightarrow A$  mutations are indeed good indicators of APOBEC3G/F-mediated hypermutation status. Interestingly, proviruses with additional  $G \rightarrow A$  mutations (three or four) in the *env* probe binding site were relatively common in this dataset (~11%, compared to  $\sim 3\%$  in the first dataset). Of the nFL hypermutated sequences with 3 or 4 G $\rightarrow$ A mutations in the region of the HPDA *env* probe, 93% had 2 G $\rightarrow$ A mutations at the *pol* probe binding site and would therefore be detected by the HPDA in O1. Although approximately 16% of the hypermutated sequences from the second dataset had SNPs that could prevent the hypermutated env probe from binding, we found that 85% of these sequences were hypermutated at both positions in the *pol* probe binding site. Based on this analysis, we concluded that the most accurate way to estimate the frequency of hypermutated proviruses would be to sum the positive events detected in quadrants 1, 2 and 4 by the HPDA to give an estimate of "total hypermutated proviruses," rather than attempt to categorize positive droplets based on the region of hypermutation (i.e. 5'HM (Q1), 3'HM (Q4) or 2XHM (Q2)). An important implication of this analysis is that single-positive events do not necessarily represent proviruses that are deleted at the other amplicon.

**gag ddPCR**—We designed synthetic double-stranded DNA templates (corresponding to nt: 1185-1620 in the SIVmac<sub>251</sub> reference genome – accession no: M19499.1) to adapt the previously described SIV *gag* qPCR assay<sup>67</sup> to the Bio-Rad ddPCR platform (Fig. S4A, C;

Table S8). Primers were included at a final concentration of 500 nM and the probe at a final concentration of 250 nM.

**gag** mutation analysis—Sequences from SIV-infected macaques<sup>20,93</sup> were analyzed for G→A sequence polymorphisms in the *gag* probe binding site (Fig. S4C). Sequences with 1-to-5 mutations were used to design synthetic DNA templates to determine the effect of mismatches on assay performance, including the amplitude of positive droplets (Fig. S4A, C). 250 copies of each template were loaded in a 22 µl reaction in triplicate and scored for fluorescence in the FAM channel.

Envelope sequencing & analysis—DNA used for ddPCR was also used to collect individual env sequences by limiting dilution nested PCR. Each sample was diluted for an outer PCR using the primers SOUTF - (5' - GGC TAA GGC TAA TAC ATC TTC TGC ATC - 3') and NOUTR (5' - TTT AAG CAA GCA AGC GTG GAG - 3')<sup>82</sup> at a final concentration of 0.2 µM with Platinum Taq and the following cycling conditions: 5 minutes at 95°C, 35 cycles of (94°C for 1 minute, 58°C for 1 minute, 72°C for 3 minutes) then 10 minutes at 72°C<sup>82</sup>. PCR products were diluted 1 in 2 with 10 mM Tris-HCl and 2 µl were used as the template for a nested inner PCR with the primers EnvF2 (5' - GGA ACA ACT CAG TGC CTA CCA GAT AAT GGT G - 3') and EnvR2 (5' - GTA GGT CAG TTC AGT CCT GAG GAC TTC TCG -3')<sup>98</sup> at a final concentration of 0.20 µM and the following PCR conditions: 2 minutes at 94°C, 41 cycles of (94°C for 30 seconds, 55°C for 30 seconds, 72°C for 2 minutes) then 3 minutes at 72°C<sup>98</sup>. 3 µl of each inner PCR product was added to 17 µl loading dye, run on an agarose gel and visualized using UV illumination. Gels in which <30% of wells were positive were considered to be at limiting dilution and to have resulted from a single template. Positive wells were submitted for Sanger Sequencing (Genewiz). Chromatograms were assembled using the "de novo assembly" function in Geneious Prime. Chromatograms with one or more overlapping peaks - indicative of Taq polymerase-induced error or multiple proviral templates in a single well - were removed from analysis.

**Phylogenetic analysis**—Sequences were defined as "non-defective" based on the absence of premature stop codons, deletions, or evidence of APOBEC3G/F-mediated G-to-A hypermutation, assessed using Los Alamos National Lab's Hypermut 2.0 program<sup>99</sup>. Only non-defective sequences were used for phylogenetic tree construction (Fig. 6, Figs. S5–13) and other analyses including: percent of sequences with a match (Fig. 5), average pairwise-distance calculations (Table S7, Fig. 5B and Fig. 7A), and frequency of non-synonymous mutations (Fig. 7B–D). The evolutionary history was inferred by using the Maximum Likelihood method implemented in MEGA11<sup>100</sup> using the optimal model selected by the program. Trees were rooted using a consensus of the stock sequences<sup>57</sup>.

Average pairwise distances were calculated between the consensus sequence of the virus stock<sup>57</sup> and all non-defective *envelope* nucleotide sequences retrieved from plasma and gDNA. Calculations were implemented in MEGA v.7 with a p-distance substitution model. Analyses were run for 1000 replicates.

To determine the likelihood of identical hypermutated sequences arising independently in different infected cells, we calculated the frequency of  $G \rightarrow A$  mutation at each G in the sequenced region of *env* in 226 hypermutated sequences from 3 animals (Fig. 5D) and used per site mutations probabilities in simulations to determine how often identical hypermutated sequences would arise assuming each site behaved independently.

**Isolation of RNA from plasma for sequencing**—To allow for consistent amplification of plasma virus, plasma aliquots were thawed and ~10,000 copies of SIV RNA were used. Viral RNA was extracted as previously described<sup>101</sup>. Viral RNA pellets were resuspended in 20ul Buffer TDR (5 mM Tris-HCl, 1 mM DDT, 2.5 mM RNaseOUT) and immediately used for reverse transcription with SuperScript III. A mixture of 20  $\mu$ I SIV RNA, 2.5  $\mu$ I of 2  $\mu$ M primer NOUTR (5' – TTT AAG CAA GCA AGC GTG GAG – 3')<sup>82</sup> and 2.5  $\mu$ I 10 mM dNTPs was heated to 65°C for 10 minutes then placed on ice for 1 minute. A reaction mixture of 10  $\mu$ I 5X First Strand Buffer, 13.5  $\mu$ I water, 0.5  $\mu$ I 0.1 M DTT, 0.5  $\mu$ I SuperScript III and 0.5  $\mu$ I 40 U/ $\mu$ I RNaseOUT was then added to reaction volume of 50  $\mu$ I. The mixture was heated at 50°C for 55 minutes then inactivated at 85°C for 10 minutes. The resulting cDNA was serial diluted with 10 mM Tris-HCl to reach limiting dilution as input for single-genome sequencing using the approach described above.

**Modeling of decay processes**—We used a non-linear mixed effect approach to fit multiple models for the decay of SIV DNA species in macaques infected with SIV on ART. Given the long time scale of the study, the following general model was used:

$$y = \begin{cases} y_0 \left( A e^{-b_1 t} + (1 - A) e^{-b_2 t} \right) & \text{if } t \le T_s \\ y_0 \left( A e^{-b_1 T_s} + (1 - A) e^{-b_2 T_s} \right) e^{-b_3 t} & \text{if } t > T_s \end{cases}$$
(1)

where *y* is the variable of interest,  $y_0$  is its baseline value, *A* is the fraction of *y* that decays in the first phase with decay rate  $b_1$ , and (1 - A) is the fraction of *y* which decays in the second phase with decay rate  $b_2$ . After this potential biphasic decay lasting until time  $T_s$ , there could be a third phase with decay rate  $b_3$ , which would be smaller than the two initial phases.

With this general formula, multiple models can be tested. If we fix  $b_3 = 0$ , then the third phase of decay starting at time  $T_s$  is flat and remains at the value of y attained at time  $T_s$ . On the other hand, if we fix  $T_s$  at a large value (say  $T_s = 10,000$ ) then we never reach  $T_s$  and have the usual biphasic decay model. In this latter case, with A = 0, we can test for a single decay model, estimating only  $b_2$ . Note that in the case of a single decay,  $b_1$  is not estimated. Using this approach, we statistically compare the quality of the fits (using the corrected Bayesian Information Criteria, BIC) among these models<sup>102</sup>. In addition, we also tested a hybrid model, (particularly for the hypermutated DNA), where some macaques (specifically T544, T545, T624, T627 and T628) had a biphasic decay, and another group of macaques (T523, T530, T537, T623 and T625) had a single phase of decay. This was prompted by visual inspection of the decay patterns across the animals.

To fit the model of the decay processes – equations (1) above – to the data, we used a nonlinear mixed-effects model. This approach assumes that a model parameter  $\eta_i$  is drawn

from a distribution with a fixed part  $\theta$ , which is the median value of the parameter in the population, and a random term  $\phi_i$ , which is assumed to be normally distributed with zero mean and standard deviation  $\sigma$ . We assumed that parameters  $b_1$ ,  $b_2$ ,  $b_3$  follow a lognormal distribution (to guarantee that they are positive), and A is logit normal (between 0 and 1). We fit instances of the model to the data, with different parameters fixed as described above, and estimate the parameters using the software Monolix 2020R1 (Lixoft)<sup>103</sup>. We calculated 95% CI for the parameters based on the Fisher Information matrix using the Monolix function confintmlx.

For intact proviruses,  $gag^+$  DNA and 2LTR circles, the best fit models were triphasic, with the last phase after  $T_s$ , essentially flat,  $b_3 = 0$ . For the  $env^+$  and  $env^-$  2LTR species, the biphasic and triphasic models had similar statistical support, with biphasic slightly better, because  $T_s$  was very high. We suspect that this is the case due to multiple censored values (i.e. no positive events were detected) for these species. We note that we couldn't fit the 2LTR species for T624, because it showed almost no decay with many censored values. Finally, for hypermutated SIV proviruses, the hybrid model gave the best fits.

We used the same general modeling equations (1) to quantify the decay of non-synonymous mutations over time, which was well described by a biphasic decline.

**Quantification and statistical analysis**—Details regarding the statistical tests used and the represented data can be found in the figure legends, or, for the mathematical modeling in the "Modeling of decay processes" section. Statistical tests were considered significant when P values were less than 0.05. Statistical analyses were performed via GraphPad Prism (Prism Software) or, for the modeling of decay processes, Monolix2020R1 (Lixoft).

### Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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# Highlights

• Intact SIV genomes decay with triphasic kinetics upon treatment with ART.

- Defective (hypermutated) proviruses decay with mono or biphasic kinetics.
- Early after treatment, labile populations of recently infected cells decay.
- Long-term ART reveals persistence of archival variants & infected cell proliferation



#### Figure 1. Study design.

(A) Timeline of infection, initiation of ART, and sampling. Animals were infected by repetitive intrarectal challenge with SIVmac<sub>251</sub> and maintained untreated for 48 weeks after initial challenge (red) before initiation of ART (blue). Orange triangles indicate sampling times. The red triangle indicates the last time point before two animals (T545 and T628) were necropsied due to unrelated complications. (B) Plasma SIV RNA levels after ART initiation. The assay detection limit (200 copies/ml) is indicated by the dashed gray line.
(C) Design of the SIV Intact Proviral DNA Assay (IPDA)<sup>20</sup>. Locations of two amplicons

in the SIV genome are indicated in yellow (*pol*) and pink (*env*). Data from 3 individual assays are used to determine the frequency of intact proviruses per  $10^6$  CD4<sup>+</sup> T cells. Events from quadrant 2 (Q2) of the IPDA measure the number of intact genomes. Proviruses with deletions or hypermutation affecting the *pol* amplicon (5'del/HM) appear in Q4 while proviruses with deletions or hypermutation affecting both amplicons appear in Q3 along with droplets lacking a provirus. The number of intact proviruses (Q2) is corrected for shearing using the DNA Shearing Index (DSI), and the input cell number is determined using ddPCR amplification of two similarly spaced amplicons in a cellular gene (RPP30) as described<sup>20,21</sup>. 2LTR circles are quantitated in a separate ddPCR assay using two amplicons, one spanning the LTR-LTR junction<sup>62</sup> and one in *env* (red arrows)<sup>20</sup>. Events in Q2 of the *env*-2LTRc duplex assay are subtracted from the number of intact proviruses to correct for 2LTR circles.





Frequency of intact proviruses during (A) the first 6 months of ART or (B) over the first 4 years of treatment. Datapoints represent the geometric mean from at least 3 replicates per animal. Open circles indicate that no positive events were detected by the IPDA; the y-axis value indicates the limit of detection based on the number of cell equivalents assayed. (C) Decay of intact proviruses in individual animals during ART. Data were fitted to a triphasic model (black line) as described in the Methods. Vertical lines indicate the standard deviations.

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#### Figure 3. Decay of hypermutated proviruses after ART initiation.

(A) Comparison of the frequency of intact and hypermutated proviruses prior to ART initiation (t=0) and at the latest time point analyzed (week 208 for all animals except T537, in which case it is week 216). Each datapoint represents the geometric mean for the IPDA or HPDA. A total of 3 replicates for each animal are included for the IPDA, and 6 replicates for the HPDA. IPDA data are corrected for  $env^+$ 2LTR circles and shearing. HPDA data are corrected for shearing. Black lines show the geometric means. (B) Decay of hypermutated

proviruses on ART. Data were fitted to biphasic or monophasic decay models (black line) as described in the Methods section. Vertical lines represent the standard deviations.

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#### Figure 4. Comparison of gag ddPCR and IPDA quantification of SIV DNA.

(A) Correlation between  $gag^+$  SIV DNA copies and intact proviruses quantified using the IPDA. Individual datapoints represent the number of copies detected using either an amplicon in gag (y-axis)<sup>67</sup> or the IPDA (x-axis)<sup>20</sup>. Each point is the geometric mean of 3 replicates. Intact proviruses are corrected for shearing (DSI) and  $env^+$ 2LTR circles. The correlation between the two variables was calculated using Pearson's coefficient. Data from one animal, T624, were excluded from this analysis due to failure of the *gag* amplicon resulting from mutations or deletion. (B) Correlation between  $gag^+$  SIV DNA copies and

intact proviruses, with *gag* values corrected using the same  $env^+$ 2LTR correction factor applied to the IPDA data, calculated using Pearson's coefficient. (C) Comparison of the decay of SIV *gag* copies and intact proviruses for the animals in cohort 18–02. IPDA data are corrected for  $env^+$ 2LTR circles and DNA shearing. Vertical lines represent the standard deviations. See also Figure S4.



#### Figure 5. Analysis of *env* sequences from CD4<sup>+</sup> T cell DNA during ART.

(A) Timeline for sequence analysis. Colored dots indicate sampling times for each animal.
(B) Average pairwise distance from the stock<sup>57</sup> of *env* sequences collected at early (weeks 0–12), intermediate (weeks 28–48) or late (weeks 104–216) time points after ART initiation. The number of sequences analyzed for each animal is listed in Table S7. Statistical significance was determined using one-way ANOVA (GraphPad Prism). (C) Percent of non-defective *env* sequences that exactly match another independent sequence from the same sample at early, intermediate, or late time points on ART. Sequences with hypermutation

(as determined using Los Alamos National Lab's Hypermut Program<sup>99</sup>), or deletions were excluded from this analysis. Animal T624 was excluded due to a high frequency of identical sequences at all time points, reflecting early control of replication (Fig. 1B, Fig. S13). (D) Highlighter plots of identical hypermutated *env* sequences from 3 animals. The animal (colored dot, see key in panel A), time point (colored bar), and the number of times an identical sequence was recovered from a given sample are indicated. Vertical bars indicate a nucleotide difference from the consensus of the stock<sup>57</sup>. The color of the bar represents the mutant nucleotide (red – thymine, blue – cytosine, orange – guanine, green – adenine). Alignment numbering corresponds to nucleotide positions based on the SIVmac<sub>239</sub> reference (accession no: M33262.1).

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Phylogenetic tree and highlighter plot of *env* sequences collected from either plasma or CD4<sup>+</sup> T cell DNA from animal T530. Highlighter plot was generated using Los Alamos National Lab's Highlighter program. The tree is rooted on a consensus sequence of the stock<sup>57</sup>. Sequence analysis includes 2054 nt.





(A) Comparison of average pairwise distance from the stock<sup>57</sup> between sequences collected from plasma (red) or peripheral blood CD4<sup>+</sup> T cell DNA (blue) at the time of ART initiation (t=0). The number of sequences analyzed and standard deviations are given in Table S7.
(B) Violin plots comparing the number of non-synonymous amino acid mutations per *env* sequence in plasma (red) vs. CD4<sup>+</sup> T cell DNA (blue) at the time of ART initiation. Numbers above the violin plots indicate the number of sequences included in the analysis.
(C) Heat map depicting changes in mutation frequency at different positions in *env* between

sequences collected from week 0 and week 146 for each animal. Week 146 was chosen as a late time point because slight increases in mutational frequency were observed between week 146 and 208, reflecting distortions introduced by the proliferation of particular infected cell clones. Red or blue squares indicate increases or decreases, respectively, in the frequency of sequences with a mutation at the indicate position. Analysis covers sequenced positions where there were mutations away from the stock consensus in at least 20% of sequences at that time point. (D) Decay of non-synonymous mutations in *env* sequences during ART. Data were fitted to a biphasic model (black line) as described in the Methods section. The number of sequences included in this analysis, mean APD, and standard deviation for each animal at the indicated timepoints are included in Table S7.

# Key resources table

REAGENT or RESOURCE	SOURCE	IDENTIFIER					
Bacterial and virus strains							
SIVmac <sub>251</sub> swarm <sup>57</sup>	Dr. Dan Barouch, BIDMC	N/A					
Biological samples							
SIVmac <sub>251</sub> -infected Rhesus macaque PBMCs	Dr. Dan Barouch, BIDMC	N/A					
Chemicals, peptides, and recombinant proteins							
Platinum Taq DNA Polymerase High Fidelity	ThermoFisher Scientific	Cat # 11304011					
SuperScript III Reverse Transcriptase	ThermoFisher Scientific	Cat # 18-080-044					
dNTP Mix (10 mM each)	ThermoFisher Scientific	Cat # 18-427-088					
UltraPure 1M Tris-HCl Buffer (pH 8.0)	ThermoFisher Scientific	Cat # 15-568-025					
RNaseOUT Recombinant Ribonuclease Inhibitor	ThermoFisher Scientific	Cat # 10777019					
Critical commercial assays							
QIAamp DNA Mini Kit	Qiagen	Cat # 51304					
CD4+ T Cell Isolation Kit, Non-Human Primate	Miltenyi Biotec	Cat # 130-092-144					
2X ddPCR Supermix for Probes (no dUTPs)	Bio-Rad	Cat # 186-3024					
Deposited data							
SIV - plasma RNA sequences	This paper	OQ168641-OQ168979					
SIV - non-defective proviral DNA sequences	This paper	OQ168980-OQ170751					
SIV - hypermutated (defective) proviral sequences	This paper	OQ170752-OQ170785					
Experimental models: Organisms/strains							
Rhesus macaque (Macaca mulatta) infected with SIVmac <sub>251</sub>	Indian origin	Animals T523, T530, T537, T544, T545, T623, T624, T625, T627 & T628					
Oligonucleotides							
Oligonucleotides, standard desalting (Sanger sequencing & ddPCR) - see Methods and Table S8	IDT	N/A					
FAM/VIC labeled probes with MGB quencher, HPLC purified (see Table S8)	Applied Biosystems	N/A					
Unlabeled competition probes w/MGB quencher, HPLC purified (see Table S8)	Applied Biosystems	N/A					
FAM/HEX labeled probes w/MGB-NFQ quencher, HPLC purified (see Table S8)	IDT	N/A					
Recombinant DNA							
Synthetic double-stranded DNA controls (gBlocks) - see Methods	IDT	N/A					
Software and algorithms							
QuantaSoft Analysis-Pro	Bio-Rad	http://www.bio-rad.com/en-us/product/qx200- droplet-digital-pcr-system?ID=MPOQQE4VY					
Geneious Prime	Dotmatics	https://www.geneious.com/prime/					
MEGA v7.0 & v11	MEGA	https://www.megasoftware.net/					
Clustal W	EMBL-EBI	http://www.ebi.ac.uk/Tools/msa/clustalw2/					
GraphPad Prism	Dotmatics	https://www.graphpad.com/					

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Monolix 2020R1	Lixoft	https://lixoft.com/
Los Alamos National Labs - Highlighter	Keele et al. <sup>91</sup>	https://www.hiv.lanl.gov/content/sequence/ HIGHLIGHT/highlighter_top.html
Los Alamos National Labs - Hypermut 2.0	Rose et al. <sup>99</sup>	https://www.hiv.lanl.gov/content/sequence/ HYPERMUT/hypermut.html