

Impact of Suboptimal APOBEC3G Neutralization on the Emergence of HIV Drug Resistance in Humanized Mice

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ABSTRACT HIV diversification facilitates immune escape and complicates antiretroviral therapy. In this study, we take advantage of a humanized-mouse model to probe the contribution of APOBEC3 mutagenesis to viral evolution. Humanized mice were infected with isogenic HIV molecular clones (HIV-WT, HIV-45G, and HIV-ΔSLQ) that differ in their abilities to counteract APOBEC3G (A3G). Infected mice remained naive or were treated with the reverse transcriptase (RT) inhibitor lamivudine (3TC). Viremia, emergence of drug-resistant variants, and quasispecies diversification in the plasma compartment were determined throughout infection. While both HIV-WT and HIV-45G achieved robust infection, over time, HIV-45G replication was significantly reduced compared to that of HIV-WT in the absence of 3TC treatment. In contrast, treatment responses differed significantly between HIV-45G- and HIV-WTinfected mice. Antiretroviral treatment failed in 91% of HIV-45G-infected mice, while only 36% of HIV-WT-infected mice displayed a similar negative outcome. Emergence of 3TC-resistant variants and nucleotide diversity were determined by analyzing 155,462 single HIV reverse transcriptase gene (RT) and 6,985 vif sequences from 33 mice. Prior to treatment, variants with genotypic 3TC resistance (RT-M184I/V) were detected at low levels in over a third of all the animals. Upon treatment, the composition of the plasma quasispecies rapidly changed, leading to a majority of circulating viral variants encoding RT-184I. Interestingly, increased viral diversity prior to treatment initiation correlated with higher plasma viremia in HIV-45G-infected animals, but not in HIV-WT-infected animals. Taken together, HIV variants with suboptimal anti-A3G activity were attenuated in the absence of selection but displayed a fitness advantage in the presence of antiretroviral treatment.

IMPORTANCE Both viral (e.g., RT) and host (e.g., A3G) factors can contribute to HIV sequence diversity. This study shows that suboptimal anti-A3G activity shapes viral fitness and drives viral evolution in the plasma compartment in humanized mice.

KEYWORDS APOBEC3, HIV diversification, HIV drug resistance, HIV Vif, human immunodeficiency virus, humanized mice, virus-host interactions

HIV diversity is extensive on both an individual level and a global level. It drives viral
adaptation in distinct cellular environments and facilitates escape from immune surveillance and antiretroviral therapy (ART) [\(1\)](#page-13-0). A combination of HIV features, including a high in vivo mutation rate, a high replication rate, and recombination between **Citation** Hernandez MM, Fahrny A, Jayaprakash A, Gers-Huber G, Dillon-White M, Audigé A, Mulder LCF, Sachidanandam R, Speck RF, Simon V. 2020. Impact of suboptimal APOBEC3G neutralization on the emergence of HIV drug resistance in humanized mice. J Virol 94:e01543-19. [https://doi.org/10.1128/JVI](https://doi.org/10.1128/JVI.01543-19) [.01543-19.](https://doi.org/10.1128/JVI.01543-19)

Editor Guido Silvestri, Emory University **Copyright** © 2020 American Society for Microbiology. [All Rights Reserved.](https://doi.org/10.1128/ASMCopyrightv2) Address correspondence to Viviana Simon,

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copackaged genomes contributes to viral diversification [\(2,](#page-13-1) [3\)](#page-13-2). Although the high mutation rate is caused by the error-prone nature of the HIV reverse transcriptase (RT) [\(4,](#page-13-3) [5\)](#page-13-4), mutagenesis by the host apolipoprotein B mRNA-editing enzyme, catalytic polypeptide-like 3 (APOBEC3) cytidine deaminases also contributes to diversity [\(6](#page-13-5)[–](#page-13-6)[8\)](#page-13-7). If left unchecked by HIV Vif, several of the APOBEC3 family members limit HIV replication by mutating the viral cDNA during reverse transcription, introducing guanosine-toadenosine (G-to-A) mutations [\(9](#page-13-8)[–](#page-13-9)[13\)](#page-13-10). Counteraction of APOBEC3G (A3G), APOBEC3F (A3F), and the stable haplotypes of APOBEC3H (A3H) by HIV Vif is essential for establishing a robust infection in vivo (reviewed in references [10](#page-13-11) and [14\)](#page-13-12). However, proviruses in HIV-infected patients frequently display high numbers of G-to-A mutations in dinucleotide contexts, suggesting previous suboptimal anti-APOBEC3 activity [\(15](#page-14-0)[–](#page-14-1)[17\)](#page-14-2). In fact, HIV Vif alleles obtained from the plasma and/or peripheral blood cell compartments of patients differ—to some extent—in their abilities to counteract the different APOBEC3 proteins [\(18](#page-14-3)[–](#page-14-4)[20\)](#page-14-5).

Our understanding of the impact of HIV Vif variation on HIV/AIDS disease outcomes remains incomplete, since such studies in patients are inherently limited in scope and descriptive in nature [\(11,](#page-13-13) [21,](#page-14-6) [22\)](#page-14-7). With the advent of the humanized-mouse model in the past decade, in vivo studies investigating HIV pathogenesis [\(23](#page-14-8)[–](#page-14-9)[25\)](#page-14-10), novel therapeutic interventions [\(26](#page-14-11)[–](#page-14-12)[29\)](#page-14-13), and viral evolution [\(30](#page-14-14)[–](#page-14-15)[32\)](#page-14-16) under controlled experimental conditions have become possible. Experiments in different humanized-mouse systems (e.g., NOG, NSG, and BLT) established that HIV Vif is necessary for infection [\(33,](#page-14-17) [34\)](#page-14-18). Moreover, the impacts of A3F, A3G, and A3H on replication have been tested using HIV Vif mutant viruses that are defective in counteracting A3D, A3F, A3G, or A3H [\(35](#page-14-19)[–](#page-14-20)[37\)](#page-14-21). These studies show that the failure to neutralize A3G results in severe attenuation of viral replication, with viruses unable to counteract A3G being less diverse than their wild-type (WT) counterparts [\(35,](#page-14-19) [36\)](#page-14-20). Thus, interrogation of A3G-driven HIV diversification in an "all or nothing" fashion indicates that a complete loss of anti-A3G activity results in HIV restriction and limits viral diversification.

However, most circulating HIV strains maintain some activity against A3G, so experiments with viruses with suboptimal anti-A3G activity may provide a more relevant picture regarding the effects of partial APOBEC3 neutralization. Moreover, we reasoned that to directly test to what extent variation in APOBEC3 neutralization capacity influences HIV evolution in vivo, one needs to perturb not only the HIV Vif-A3G axis (e.g., by using HIV Vif mutants), but also the viral equilibrium reached upon establishment of infection (e.g., by administrating an antiretroviral to apply selection pressure). Thus, in this study, we infected humanized mice with wild-type and selected Vif mutant viruses and monitored infection in the plasma compartment over time in the presence and absence of antiretroviral treatment in the form of lamivudine (3TC) monotherapy. We assessed viral replication by longitudinally quantifying plasma viremia, as well as viral diversification, using a high-resolution, molecular identification tag-based deep-sequencing approach. Our data indicate that suboptimal neutralization of A3G results in attenuated viral replication in the absence of selection but provides a replication advantage in the presence of 3TC antiretroviral treatment.

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RESULTS

HIV-WT and HIV-45G establish productive infection in the humanized-mouse model system. We performed three independent long-term infection experiments in 48 humanized NSG (hu-NSG) mice mimicking natural infection (experiment 1, 85 days of follow-up postinfection) or treatment interventions (experiment 2 and experiment 3, 58 to 75 days of follow-up postinfection). [Figure 1A](#page-2-0) depicts the time line for each experiment, including the viruses used for infection and the time points at which blood samples were collected for further analysis (e.g., plasma viremia or HIV RNA sequence analysis).

The three viruses selected for these experiments (HIV-WT, HIV-45G, and HIV-ΔSLQ) consist of isogenic clones of the HIV NL4-3 isolate that differ in their abilities to

FIG 1 Infection of humanized mice with HIV-Vif variants. (A) Newborn NSG mice were irradiated after birth, and human donor cord blood-derived CD34⁺ cells were transplanted into them. The mice were infected intraperitoneally with 2×10^5 TCID₅₀ of virus (HIV-WT, HIV-45G, or HIV- Δ SLQ). The specifics for each of the three infection experiments are provided in the timelines. Plasma was collected at the indicated time points for viremia measurements and sequence analysis. (B) Comparison of plasma viremias at day 30 postinfection (baseline) in mice infected with different viruses in three different experiments (#1, #2, and #3). The lower limit of detection of the assay was 400 copies (cp)/ml. The means and standard deviations of the viral loads are depicted. Viremia for HIV-ΔSLQ was significantly different from HIV-WT or HIV-45G viremia ($P \le 0.0020$; Mann-Whitney test). **, $P \le 0.01$.

counteract A3G. These mutants have been well characterized previously by us and others [\(12,](#page-13-9) [18,](#page-14-3) [39\)](#page-14-23). Briefly, NL4-3 served as HIV-WT. NL4-3 Vif counteracts A3G, A3F, and A3D but is inactive against the stable A3H haplotypes [\(40\)](#page-14-24). HIV-ΔSLQ fails to bind the Cullin5 E3 ligase complex due to three alanines replacing the SLQ BC-box motif (positions 144 to 146) and therefore fails to counteract any of the APOBEC3 proteins. HIV-45G carries a single point mutation in codon 45 of Vif [\(18,](#page-14-3) [39,](#page-14-23) [41\)](#page-14-25). This mutation in Vif results in attenuation, but not complete abrogation, of its activity against A3G while preserving activity against A3F and A3D [\(18\)](#page-14-3). Importantly, residue 45 of Vif has not been associated with other Vif functions and is not involved in any other viral gene products [\(42,](#page-14-26) [43\)](#page-14-27). HIV-WT and HIV-45G replicate to comparable levels in primary human peripheral mononuclear cells, while HIV-ΔSLQ fails to initiate a spreading infection in cell culture [\(39\)](#page-14-23). Importantly, suboptimal neutralization of A3G by HIV-45G does not result in a sizeable replication defect in short-term cell culture infection experiments, making it very well suited for in vivo infection experiments aimed at studying evolution in humanized mice.

Hu-NSG mice were reconstituted with CD34⁺ cells isolated from umbilical cord blood, and immune reconstitution was confirmed after 90 days, prior to infection. A total of 12 different cord blood donors were used across the three independent infection experiments. Since HIV NL4-3 fails to counteract the active A3H haplotypes

[\(40\)](#page-14-24), we determined the A3H genotypes of all cord blood donors. None of the donors harbored two alleles of the active, stable A3H haplotypes. Five donors had one stable A3H haplotype, and seven had two alleles of the unstable A3H haplotypes.

In all three experiments, we measured viremia at day 30 postinfection. Infection with HIV-WT and HIV-45G established comparable average viremias with no significant differences among the three independent infection experiments [\(Fig. 1B\)](#page-2-0). In good agreement with previous findings, functional HIV Vif protein was necessary to establish a productive infection, since all four hu-NSG mice infected with HIV-ΔSLQ displayed no detectable plasma viremia at day 30 postinfection [\(Fig. 1B\)](#page-2-0). As anticipated, the presence of a single active A3H allele did not differentially influence the baseline viral load observed with the isogenic HIV-WT or HIV-45G as tested by post hoc multiplecomparison (Dunn's) tests ($P \ge 0.1084$).

Replication of HIV-45G, but not HIV-WT, is attenuated over time in humanized mice. In the natural-infection experiment (experiment 1), we followed viral replication in the plasma compartment for nearly 3 months postinfection. Plasma viremia was measured using molecular diagnostics at regular intervals. All the productively infected animals (HIV-WT, $n = 14$; HIV-45G, $n = 8$) maintained viremia above the limit of detection until the end of the experiment. HIV-ΔSLQ-infected animals never displayed viral load measurements above 400 copies/ml (the limit of detection of the assay). The change in plasma viremia over time is plotted in [Fig. 2A.](#page-4-0) While HIV-WT infection resulted in an increase in replication over time in all but two animals, HIV-45G replication was attenuated in the majority of infected animals within 40 to 60 days postinfection. The changes in plasma viremia between baseline (i.e., day 30 postinfection) and endpoint were significantly different between the two viruses (0.77 log_{10}) decrease [HIV-45G] versus 0.43 log_{10} increase [HIV-WT]; $P = 0.0026$). Taken together, in vivo HIV-45G replication appears to be attenuated, although the trait becomes apparent only 50 to 60 days postinfection.

Suboptimal neutralization of A3G confers superior viral fitness in the presence of 3TC in the humanized-mouse model system. In the treatment intervention infection experiments (experiment 2 and experiment 3), animals robustly infected with either HIV-WT ($n = 11$) or HIV-45G ($n = 11$) were treated with 3TC starting at day 30 postinfection until the end of infection (i.e., day 75 in experiment 2 and day 58 in experiment 3). Of note, the blood collection intervals in experiment 3 were shorter than in experiment 2 (4- to 7-day versus 14-day intervals).

The initial virological responses upon 3TC initiation were comparable between the two groups. Within the first 2 weeks of 3TC treatment, both HIV-WT and HIV-45G viremias decreased to comparable nadirs (0.69 log_{10} versus 0.66 log_{10} units, respectively) [\(Fig. 2C\)](#page-4-0). One mouse (no. 120, infected with HIV-45G) was euthanized at day 44 postinfection according to the animal safety protocol due to signs of wasting. Considering the overall change from baseline to experiment termination, HIV-WT replication decreased by 0.55 log_{10} units in the presence of 3TC whereas HIV-45G viremia had increased by 0.25 log_{10} units from baseline ($P = 0.0045$) [\(Fig. 2D\)](#page-4-0). Moreover, HIV-45Ginfected animals experienced a larger (0.99 log_{10} versus 0.52 log_{10} units; $P = 0.0068$) [\(Fig. 2E\)](#page-4-0) and faster (0.061 log_{10} versus 0.033 log_{10} units/day; P = 0.0052) [\(Fig. 2F\)](#page-4-0) viral rebound from the initial lowest points reached upon 3TC treatment initiation.

We also assessed 3TC treatment outcomes in a qualitative manner (e.g., treatment success versus failure, with success being defined as sustained reduction in viremia, with less than 0.5 log_{10} -unit rebound from the lowest points). Antiviral treatment was successful in 64% of HIV-WT-infected mice but in only 9% of HIV-45G-infected mice [\(Fig.](#page-4-0) [2G\)](#page-4-0). Thus, HIV-45G-infected mice had a significantly higher risk of failing treatment (relative risk [RR], 7; 95% confidence interval [CI], 1.482 to 40.54; $P = 0.0237$).

Taken together, the replication rates of HIV-45G in the absence (experiment 1) and in the presence (experiment 2 and experiment 3) of 3TC were very different (compare [Fig. 2B](#page-4-0) and [D\)](#page-4-0). While the fitness of HIV-45G was attenuated over time in naive animals, its replication was significantly less affected by 3TC than that of HIV WT, suggesting the existence of a selection advantage.

FIG 2 Viral replication in humanized mice in the absence or presence of 3TC treatment. (A) Spaghetti plots depicting the changes in viremia relative to baseline viral load (day 30 postinfection) of individual untreated mice (thin lines) and mean changes in viremia in untreated mice (thick lines). (B) Changes in viremia at the end of infection (last available time point) versus baseline viremia in untreated mice. Means and standard deviation are depicted. $P = 0.0026$ by unpaired Student's t test. (C) Spaghetti plots depicting the changes in viremia in 3TC-treated mice. (D) Overall change in viremia at the end of infection in 3TC-treated mice, with means and standard deviations. $P = 0.0045$ by unpaired Student's t test. (E) Rebound viremia {defined as the maximum fold rebound in viral load (VL) from nadir [maximum level of suppression observed; $log(VL_{max}/VL_{nadir})$]} for mice treated with 3TC. Each point represents an individual mouse. Means and standard deviations are depicted. $P = 0.0068$ by Mann-Whitney test. **, $P \le 0.01$. (F) The rate of rebound was also measured over the time from nadir to maximum viremia. Means and standard deviations are shown. $P = 0.0052$ by unpaired Student's t test. (G) Qualitative assessment of treatment outcomes. 3TC treatment was defined as successful if the viral rebound was less than 0.5 $log₁₀$ units from the nadir. Conversely, treatment failure was met if the viral rebound was greater than 0.5 log_{10} units from the nadir. $P = 0.0237$; Fisher's exact test.

Dynamics of genotypic 3TC drug resistance. The molecular mechanisms resulting in 3TC resistance are well described [\(44](#page-14-28)[–](#page-15-0)[50\)](#page-15-1). Single point mutations in codon 184 of HIV RT emerge rapidly upon 3TC treatment both in vivo and in cell culture. RT-184I (ATG \rightarrow ATA) and RT-184V (ATG \rightarrow GTG) are the most common substitutions observed in HIV-infected patients failing 3TC-containing ART [\(51\)](#page-15-2) [\(Fig. 3A\)](#page-5-0). These substitutions

FIG 3 Drug resistance development in 3TC-treated mice. (A) Genotypic 3TC drug resistance is due to single point mutations in codon 184 of the HIV reverse transcriptase (RT) gene. Methionine (M184) represents the susceptible wild-type sequence, while RT-184I or RT-184V renders the virus resistant to 3TC. (B) Preexisting 3TC resistance detected at day 30 postinfection (D30) prior to 3TC treatment initiation. Each dot represents the percentage of viruses encoding RT-184I or RT-184V in a given mouse. Minority 3TC-resistant viral populations were defined as representing at least 1% of the total number of UMIDs sequenced for each mouse at this time point (dotted line). Some mice harbored both M184I/V variants and are indicated by mouse ID number. $^*, P \leq 0.05$; Wilcoxon matched-pairs signed-rank test. (C) Spaghetti plots longitudinally depicting the relative proportion of 3TC-susceptible and -resistant viral variants in HIV-WT-infected mice. M184, RT-184I, and RT-184V data for individual mice (thin lines) and mean proportions at each time point (thick lines) are depicted. The slopes of lines of best fit were calculated to measure the kinetics of RT-184M, RT-184I, and RT-184V variants. The slopes were compared by F test (ns, not significant; $P = 0.5372$). (D) Spaghetti plots longitudinally depicting the relative proportions of $3TC$ -susceptible and -resistant viral variants in HIV-45G-infected mice. The slopes were compared by F test ($P = 0.0035$).

70 80

30 40 50 60 70 80

60

Days Post Infection .

 $\mathbf 0$

30 40 50 60

confer up to $>1,000$ -fold-reduced susceptibility to 3TC [\(45,](#page-14-29) [50\)](#page-15-1). Both mutations can result from reverse transcription errors, although the mutation leading to RT-184I is also within a dinucleotide context favored for A3G-driven mutagenesis (e.g., GG-to-AG mutations [ATGG \rightarrow ATAG]) [\(47,](#page-14-30) [52\)](#page-15-3).

70 80

40 50

30

0

30 40 50 60 70 80 40

50 60

30

 -2.324

70 80

To further investigate the in vivo dynamics of resistance appearance, we used a next-generation-sequencing approach to analyze a 250-bp region of HIV RT (codons 177 to 258) from cell-free HIV RNA (viral RNA [vRNA]) present in the plasma compartment. We combined a unique molecular identifier (UMID) strategy to compensate for PCR-mediated amplification bias and errors [\(53,](#page-15-4) [54\)](#page-15-5), with 150-bp paired-end Illumina sequencing chemistry. Briefly, two series of custom primers with 8-bp randomized IDs were used to tag HIV RNA during the reverse transcription step prior to amplification and sequencing. We sequenced a total of 111 vRNA samples obtained from 34 animals (primer no. 4372, 69 vRNAs from 14 mice; primer no. 4633, 42 vRNAs from 20 mice), generating a total of 9,705,468 high-quality paired-end reads representing 155,462 UMIDs (i.e., individual HIV genomes). On average, we obtained 1,400 UMIDs for each individual plasma sample, generating between 1,333 and 17,854 unique RT consensus sequences for each infected animal over the course of the infection.

This approach, importantly, provides sufficient resolution to identify minority viral populations and to provide insights into the composition of the viral quasispecies. We first analyzed the mutations present at codon 184 of RT [\(Fig. 3B](#page-5-0) to [D\)](#page-5-0). Minority 3TC-resistant populations (defined as 1% or more of the overall number of UMIDs present in a given sample) were detectable after day 30 postinfection but prior to 3TC treatment in a third of the HIV-WT-infected ($n = 4$) and HIV-45G-infected ($n = 5$) mice [\(Fig. 3B,](#page-5-0) preexisting 3TC drug resistance). RT-184I-resistant viruses were far more common than RT-184V viruses (HIV-WT, $P = 0.0342$; HIV-45G, $P = 0.0273$) but generally made up less than 10% of the sampled circulating viruses in a given animal. A combination of RT-184V and RT-184I viruses was found in two animals (identified by specific mouse numbers in [Fig. 3B\)](#page-5-0). Of note, when we stratified by treatment outcome, preexisting 3TC drug resistance was not associated with treatment failure ($P = 0.5227$; Fisher's exact test) and did not display any significant relationship with the rate of nadir formation (HIV-WT, $P = 0.0762$; HIV-45G, $P = 0.1115$) or the rebound rate (HIV-WT, $P = 0.3267$; HIV-45G, $P = 0.0849$).

We next examined the dynamics of 3TC drug resistance in treated mice [\(Fig. 3C](#page-5-0) and [D\)](#page-5-0). In most animals, the 3TC-susceptible RT-184M majority was rapidly replaced with viruses carrying the 3TC-resistant RT-184I or RT-184V allele. On rare occasions, substitutions other than valine or isoleucine were detected at codon 184 (e.g., ACG[T] or AAG[K]). The kinetics of RT-184I and RT-184V appearance in the plasma compartment were comparable in HIV-WT-infected mice ($P = 0.2107$) [\(Fig. 3C\)](#page-5-0), but RT-184I variants emerged 8.7 times more rapidly than RT-184V variants in HIV-45G-infected mice $(P = 0.0035)$ [\(Fig. 3D\)](#page-5-0). Overall, the relative proportion of the HIV-45G variants with RT-184V remained stable or declined over time, while HIV-45G variants with RT-184I steadily increased [\(Fig. 3D\)](#page-5-0). Thus, the emergence of viral variants with RT-184I is favored over that of RT-184V variants in animals infected with a virus displaying suboptimal A3G neutralization activity. Of note, M184I variants also often appeared prior to M184V variants in 3TC-treated patients [\(45,](#page-14-29) [50\)](#page-15-1).

Characterization of *RT* **sequence diversity throughout the course of infection.** We next determined sequence diversity within the sequenced RT region beyond the 3TC drug resistance-associated codon 184. We calculated the nucleotide diversity (π) among unique RT variants within a given plasma sample [\(55](#page-15-6)[–](#page-15-7)[57\)](#page-15-8).

Prior to 3TC treatment (day 30 postinfection), mice infected with HIV-WT and HIV-45G showed comparable nucleotide diversities in RT ($P = 0.6308$) [\(Fig. 4A\)](#page-7-0). However, when we assessed the relationship between RT nucleotide diversity and the plasma viral load measured at day 30 (prior to treatment initiation), we noted that nucleotide diversity was positively correlated with the level of plasma viremia in HIV-45G-infected animals [\(Fig. 4C\)](#page-7-0) while the opposite was true for HIV-WT-infected animals [\(Fig. 4B\)](#page-7-0). For this analysis, we assumed an exponential (Malthusian) relationship based on the nature of HIV growth and diversity in acute infection [\(58,](#page-15-9) [59\)](#page-15-10).

We next explored how RT sequence diversity changed throughout the course of infection. While RT diversity remained largely unchanged in treatment-naive animals, both HIV-WT and HIV-45G diversities in treated animals initially increased but then

FIG 4 Genetic diversity of circulating viruses in the plasma of infected mice. (A) Dot plot depicting nucleotide diversity (π) in the sequenced HIV RT gene in HIV-WT- and HIV-45G-infected mice prior to initiation of 3TC treatment (30 days postinfection). The points represent π in each mouse, and the horizontal lines depict means. (B) Diversity and viremia (VL) data in mice infected with HIV-WT prior to treatment were fitted to a weighted nonlinear exponential-growth (Malthusian) model. Best-fit curve and 95% CI bands are shown. The corresponding curve equation and weighted correlation coefficient (R) are depicted at the top. (C) Diversity and VL data for mice infected with HIV-45G prior to treatment fitted to an exponential-growth model as in panel B. (D) Diversity in plasma viruses of HIV-WT-infected mice over time (left, untreated; right, 3TC treated). Significance was determined by Mann-Whitney test (*, P \leq 0.05; ** , P \leq 0.01; **** , P \leq 0.0001). (E) Diversity in plasma viruses of HIV-45G-infected mice over time (left untreated; right, 3TC treated). Significance was determined by Mann-Whitney test (*, $P \le 0.05$; **, $P \leq 0.01$).

stabilized (day 44 postinfection) [\(Fig. 4D](#page-7-0) and [E\)](#page-7-0). RT sequence diversity in 3TC-treated mice was driven by drug resistance-associated mutations. Indeed, mutations at RT codon 184 contributed to 49 to 74% of HIV-WT and 45 to 69% of HIV-45G diversity (data not shown). When we excluded codon 184 from π analyses, any increases in diversity from baseline to day 44 through day 75 were lost in the HIV-WT-infected mice $(P \ge 0.3097)$. However, when we did the same for HIV-45G-infected mice, HIV-45G displayed a significant increase in diversity starting at day 58 through day 75 postinfection ($P \le 0.0430$; Mann-Whitney test). Thus, while the observed increase in RT sequence diversity is mainly due to selection of 3TC-resistant variants, other sites within

FIG 5 Mutagenesis in the HIV RT gene in plasma viruses of HIV-infected mice. (A) Dot plots depicting fractions of GG and GA dinucleotides mutated to AG (GG-to-AG) and AA (GA-to-AA), respectively, in individual mice (data points) prior to 3TC treatment (day 30 postinfection). The horizontal lines depict means. $P = 0.0020$; Wilcoxon matched-pairs signed-rank test. (B) Stop codons were quantitated across all plasma sequences, and a stop codon rate for every 1,000 codons sequenced was calculated for infected mice at day 30 postinfection. (C) Fraction of GG-to-AG or GA-to-AA dinucleotide mutations in plasma samples at day 58 postinfection in 3TC-treated mice. *, $P \le 0.05$; **, $P \le 0.01$; Wilcoxon matched-pairs signed-rank test. (D) Stop codon rates in plasma samples from day 58 postinfection.

RT contribute to viral diversity in HIV-45G-infected mice. However, these non-drugresistance-associated changes in HIV-45G are observed only at later time points, suggesting that they require more time to appear.

Next, we explored the contribution of APOBEC3-driven mutagenesis to the RT sequence diversity. Toward this end, we measured G-to-A mutations within APOBEC3 specific dinucleotide motifs (e.g., A3G, GG to AG; A3D/A3F, GA to AA) [\(60\)](#page-15-11). The 250-bp-long region of RT that we sequenced contains 15 GG and 25 GA dinucleotides that could serve as APOBEC3 target motifs. At day 30 postinfection (prior to 3TC treatment), both HIV-WT and HIV-45G carried more GG-to-AG than GA-to-AA mutations, but the differences were significant only for the HIV-45G-infected animals ($P = 0.0020$) [\(Fig. 5A\)](#page-8-0). At day 58 postinfection in treated mice [\(Fig. 5C\)](#page-8-0), GG-to-AG rates were higher than GA-to-AA rates in both HIV-WT-infected ($P = 0.0078$) and HIV-45G-infected $(P = 0.0020)$ mice. GG-to-AG mutation rates in HIV-WT- and HIV-45G-infected mice were comparable ($P = 0.6965$) and were not due to selection of RT-184I, as the rates were still comparable after analyses of sequences with codon 184 excluded ($P = 0.3445$; Mann-Whitney test).

Due to its preferred dinucleotide context, A3G-induced mutagenesis can introduce mutations resulting in premature stop codons (e.g., UGG to UAG) [\(7,](#page-13-6) [61,](#page-15-12) [62\)](#page-15-13). Given that premature stop codons within RT are deleterious to replication [\(63](#page-15-14)-[68\)](#page-15-16), we were surprised to see that most infected animals (10/14 with HIV-WT and 11/12 with HIV-45G) had at least one plasma viral genome with mutations resulting in a stop codon upon protein translation. HIV-WT and HIV-45G populations in the plasma displayed stop codons predominantly at the four tryptophan (UGG-to-UAG or -UGA) codons (e.g., W212, W229, W239, and W252) and, rarely, at one of the six glutamineencoding codons (CAG-to-UAG and CAA-to-UAA; Q182, Q197, Q207, Q222, Q242, and Q258). Of the 155,462 unique RTs analyzed, 868 carried mutations leading to a premature stop codon. The majority of the RT sequences (85%) had only a single stop

codon, but a small portion of sequences had two (11%), three (3%), or at most four (1%) stop codons. The rates of stop codons at day 30 and at day 58 postinfection were, however, comparable between the two groups $(P = 0.1294$ [\[Fig. 5B\]](#page-8-0); $P = 0.1211$ [\[Fig. 5D\]](#page-8-0)).

Characterization of *vif* **sequence diversity throughout the course of infection.** Lastly, we were interested in the extent to which the vif sequences changed over the course of infection. We used samples remaining from a subset of 14 animals included in experiment 3 to sequence a 268-bp-long region of HIV vif (corresponding to codons 23 to 112) using a sequencing approach comprising UMID and Illumina 150-bp paired-end sequencing technology analogous to the approach taken for analyzing RT sequence diversity. In total, we generated 579,466 high-quality paired-end reads representing 6,983 distinct UMIDs from 27 plasma vRNA samples.

We first looked for evidence of HIV-45G revertants at day 30 and day 58 postinfection in five HIV-45G-infected animals [\(Fig. 6A\)](#page-10-0). Viruses in HIV-45G-infected animals carrying the Vif-45E reversion were rare at day 30 postinfection (less than 1% in all five animals) but ranged between 0.5% and 9% of the plasma virus population present at day 58 postinfection [\(Fig. 6A\)](#page-10-0). These data suggest that the Vif-45G genotype is quite stable over time.

Since it has been suggested that vif diversification may be distinct from that of other HIV genes depending on the selective pressures exerted [\(7,](#page-13-6) [62,](#page-15-13) [69\)](#page-15-17), we analyzed the nucleotide diversity, the APOBEC3-driven mutagenesis, and the rate of stop codons for the vif region sequenced [\(Fig. 6B](#page-10-0) to [G\)](#page-10-0). The 268-bp-long region of vif that we sequenced contains 17 or 18 GG (HIV-WT, Vif E45 $=$ GAA; HIV-45G, Vif E45G $=$ GGA) and 22 GA dinucleotides that could serve as APOBEC3 target motifs. Prior to treatment (day 30 postinfection), vif sequence diversities [\(Fig. 6B\)](#page-10-0), GG-to-AG/GA-to-AA mutation rates [\(Fig. 6C\)](#page-10-0), and stop codon frequencies [\(Fig. 6C\)](#page-10-0) were comparable between HIV-WT- and HIV-45G-infected mice. However, at day 58 postinfection, Vif diversity was significantly higher in HIV-45G than in its wild-type counterparts ($P = 0.0357$) [\(Fig. 6E\)](#page-10-0). APOBEC3 mutagenesis (GG to AG, GA to AA, or the rate of stop codons) [\(Fig. 6F](#page-10-0) and [G\)](#page-10-0) was comparable between the two groups.

Taken together, the HIV-45G genotype can revert to wild-type Vif, but it accounts for only a small percentage of the circulating plasma variants in a portion of the mice tested. Moreover, there is some evidence suggesting that RT and vif region diversities are caused by different mechanisms.

DISCUSSION

Proviruses with footprints of past cytidine deamination are found in many, if not all, HIV-infected patients [\(11,](#page-13-13) [17,](#page-14-2) [22,](#page-14-7) [52,](#page-15-3) [70](#page-15-18)[–](#page-15-19)[75\)](#page-15-20). Nonetheless, the extent to which APOBEC3-driven mutagenesis contributes to viral evolution and HIV/AIDS disease outcome in vivo remains controversial. Some clinical studies have found correlations between the frequency of G-to-A mutations in proviruses and plasma viral loads [\(7,](#page-13-6) [74,](#page-15-19) [76\)](#page-15-21), whereas others failed to find such associations [\(17,](#page-14-2) [75,](#page-15-20) [77\)](#page-15-22). Controlled experiments in cell culture, however, provide strong experimental evidence in support of the notion that A3G-driven mutagenesis facilitates HIV diversification and promotes escape from selection pressure [\(39,](#page-14-23) [61,](#page-15-12) [78\)](#page-15-23). In the current study, we performed controlled in vivo infection experiments to provide new insights into the dynamics of HIV diversification within the plasma compartment in humanized mice in the absence and presence of selection pressure. We show that suboptimal neutralization of A3G shapes the phenotype of circulating viruses and compromises 3TC treatment outcomes.

Previous studies in cell culture [\(20,](#page-14-5) [39,](#page-14-23) [79\)](#page-15-24) and in humanized mice [\(33](#page-14-17)[–](#page-14-20)[37\)](#page-14-21) have examined the role of APOBEC3 proteins in HIV replication and pathogenesis in vivo, but our study dissects the impact of A3G-driven mutagenesis in the context of viral evolution by introducing selection in the form of antiretroviral treatment. Moreover, we focus on viral diversification within the plasma compartment, which reflects the actively replicating viral quasispecies in an immediate and dynamic manner. HIV-45G, which has suboptimal anti-A3G activity, is less fit than HIV-WT in treatment-naive animals over

FIG 6 Characterizing HIV vif mutations in infected mice. (A) Genotypes of vif codon 45 in five mice infected with HIV-45G and treated with 3TC from 30 to 58 days postinfection. The percentages of 45G and revertant E45 sequences are indicated on stacked bar plots. The percentages of the latter are annotated, as well. (B) Dot plots depicting nucleotide diversity (π) in vif sequences in individual mice (data points) infected with HIV-WT or HIV-45G at 30 days postinfection (prior to 3TC treatment). The horizontal lines depict means. (C) Dot plots depicting fractions of GG and GA dinucleotides mutated to AG (GG-to-AG) and AA (GA-to-AA), respectively, in individual mice (data points) at 30 days postinfection. The horizontal lines depict means. (D) Stop codon rates were quantitated across plasma vif sequences at day 30 postinfection (as in [Fig. 5B\)](#page-8-0). (E) Dot plots depicting π in vif sequences in individual mice (data points) at day 58 postinfection in 3TC-treated mice. $P = 0.0357$; Mann-Whitney test. $*$, $P \le 0.05$. (F) Fractions of GG-to-AG or GA-to-AA dinucleotide mutations in vif at day 58 postinfection in 3TC-treated mice. (G) Stop codon rates in vif sequences determined at day 58 postinfection in 3TC-treated mice.

time [\(Fig. 2A\)](#page-4-0), pointing to the slow accumulation of mutations. Conversely, HIV-45G responds less well to and rebounds more rapidly in the presence of 3TC treatment [\(Fig.](#page-4-0) [2B](#page-4-0) to [D\)](#page-4-0). Thus, complete inactivation of A3G is dispensable for initiating a productive and robust infection of humanized mice, and suboptimal A3G neutralization can be beneficial to HIV in overcoming evolutionary bottlenecks, such as selection pressure by antiretroviral drugs. Of note, a limitation of our experimental system is the fact that the hu-NSG mouse model system used in the study lacks robust immunologic pressures against HIV (i.e., CD4⁺ CD8⁺ T cell responses or antibodies) [\(80\)](#page-15-25) and thus does not recapitulate well the continued selection pressure exerted by the adaptive immune system.

Sequencing technologies have dramatically improved over the last decade, allowing

high-resolution, accurate representation of viral quasispecies. We combined UMIDs with Illumina paired-end sequencing to analyze $>$ 150,000 individual RT sequences, sampling approximately 1,170 distinct viral genomes for each individual time point. Previous studies in humanized mice examined sequence diversity using bulk amplification followed by sequencing of individual clones [\(33](#page-14-17)[–](#page-14-19)[36\)](#page-14-20) or by single-genome sequencing (SGS) [\(36\)](#page-14-20). The first of these methods fails to reliably distinguish between individual variants and may skew viral diversity measurements due to PCR errors or bias [\(53,](#page-15-4) [54\)](#page-15-5). SGS is regarded as the gold standard in the field, since it analyzes distinct genomes and provides information on large regions. However, the approach is very work intensive and costly, limiting the numbers of genomes that can be sampled [\(81](#page-15-26)[–](#page-15-27)[83\)](#page-16-0). For example, one previous study used SGS to analyze a total of 265 genomes from eight mice [\(36\)](#page-14-20). In our study, in contrast, we analyzed on average 1,400 RT sequences per infected animal, providing us with solid data on minority viral populations. It must be noted that even at our high sequencing depth, we sampled only a limited portion of the viruses circulating in the plasma compartment (i.e., average plasma viremia at day 30 postinfection is 89,620 copies/ml). Despite this limitation, our sequencing data revealed a number of previously overlooked facts regarding the dynamics of HIV evolution in vivo. First, we found 3TC-resistant viral variants in a third of the animals prior to 3TC treatment initiation [\(Fig. 3B\)](#page-5-0). Preexisting 3TC resistance, however, was not linked to more rapid treatment failure, suggesting that these viruses may not be fully replication competent and/or that drug-resistant variants arise de novo upon initiation of antiretroviral treatment. Second, we noted a positive correlation between increased RT sequence diversity and high plasma viremia in HIV-45G-infected animals after 30 days of unchecked replication [\(Fig. 4B\)](#page-7-0). This association is surprising, since conventional wisdom would predict the opposite to be true. Indeed, this is exactly what we observe for HIV-WT infections, where increased RT diversity is associated with lower plasma viremia [\(Fig. 4C\)](#page-7-0). Third, the kinetics with which the two drug-resistant variants, RT-184I and RT-184V, appeared in the plasma differed between the two

viruses. In mice infected with HIV-45G, the RT-184I variants arose at a rate 8.3 times higher than that of RT-184V variants, whereas emergence rates for the variants were comparable in mice infected with HIV-WT [\(Fig. 3D\)](#page-5-0). However, RT-184I did not appear more readily in HIV-45G-infected animals. This could be due to the fact that our earliest collection time point was 10 days after treatment initiation. It is also conceivable that drug-resistant variants first evolve, replicate, and expand in tissue compartments, with the plasma compartment being a mere reflection after the fact.

Future studies investigating viral diversification at the viral RNA, cellular viral RNA, and proviral levels in vivo in the humanized-mouse model will provide further insights into how viral quasispecies shaped by APOBEC3 mutagenesis inform about HIV pathogenesis.

MATERIALS AND METHODS

Ethics statement. Animal experiments were approved by the Cantonal Veterinary Office (no. 26/2011 and no. 93/2014) and were performed in accordance with local guidelines and the Swiss animal protection law. The Ethical Committee of the University of Zurich approved the procurement of human cord blood, and written informed consent was provided prior to the collection of cord blood.

Cell lines. HEK293T cells were obtained from the ATCC (CRL-3216), and TZM-bl reporter cells were obtained from the AIDS Research and Reference Reagent Program, Division of AIDS, NIAID, National Institutes of Health (NIH AIDS Reagent Program; catalog no. 8129) [\(84](#page-16-1)[–](#page-16-2)[88\)](#page-16-3). HEK 293T cells and TZM-bl reporter cells were maintained in Dulbecco**'**s modified Eagle medium (DMEM) (Fisher Scientific; catalog no. MT10-013-CV) supplemented with 10% fetal bovine serum (FBS) (Gemini Bio-Products) and 100 U/ml penicillin-streptomycin (Fisher Scientific; catalog no. MT30002CI). HEK 293T and TZM-bl cells were grown on 100-mm Falcon standard tissue culture dishes (Fisher Scientific; catalog no. 08-772E).

Generation of viral stocks. Isogenic molecular clones were derived from pNL4-3 (HIV-WT; NIH AIDS Reagent Program; catalog no. 114) [\(89\)](#page-16-4), Replication-competent molecular clones encoding Vif mutants E45G (HIV-45G) and SLQ144AAA (HIV-ΔSLQ) were generated as previously described [\(39\)](#page-14-23). Viral stocks were generated by transfecting HEK293T cells using 4 μ g/ml polyethylenimine (PEI) (Polysciences Inc.; catalog no. 23966). Culture supernatants were collected 48 h posttransfection, filtered, and frozen at – 80°C for further use. Viral stock concentrations were quantitated using an in-house p24 enzyme-linked immunosorbent assay (ELISA) [\(90\)](#page-16-5) and/or the titer was determined on TZM-bl reporter cells as previously described [\(39\)](#page-14-23).

Generation of humanized mice. Animals were housed under specific-pathogen-free conditions. Humanized mice were generated as previously described [\(29\)](#page-14-13). Briefly, newborn immunodeficient NODscid interleukin 2 receptor gamma (IL-2Ry)-null (NSG) mice (Jackson Laboratory, Bar Harbor, ME) were irradiated 1 to 3 days after birth with 1 Gy and transplanted intrahepatically with approximately $2.0 \times 10^5 \pm 0.5 \times 10^5$ cord blood-derived CD34⁺ cells. Cells from the same donor were transplanted into between 2 and 6 mice. A total of 12 donors were used for the three infection experiments.

Twelve to 16 weeks after transplantation, human engraftment and de novo human immune system reconstitution in the mice were assessed by staining peripheral blood with monoclonal antibodies against the panhuman markers CD45 (Beckman Coulter, Brea, CA; catalog no. B36294), CD19 (Biolegend; catalog no. 302212), CD3 (Biolegend; catalog no. 300308), CD4 (Biolegend; catalog no. 300518), and CD8 (Biolegend; catalog no. 301035). Flow cytometry analyses were performed on a CyAN ADP analyzer (Beckman Coulter).

A3H genotyping. We determined the A3H genotype as described previously [\(40\)](#page-14-24) for the 12 cord blood donors whose CD34+ cells were used for the reconstitution of the mice. Briefly, genomic DNA was extracted from the CD34-negative flowthrough fraction of the cord blood using a DNeasy DNA isolation kit (Qiagen; catalog no. 69504). The regions surrounding A3H codon 15 and A3H codon 105 were amplified using Taq polymerase (Qiagen; catalog no. 201203). The column-purified PCR products were sequenced and manually aligned using DNAStar (SeqMan; DNAStar, Madison, WI).

Infection and antiretroviral treatment of humanized mice. Mice were infected intraperitoneally with 2×10^5 50% tissue culture infective doses (TCID₅₀s) per mouse of each of the 3 HIV clones in a 200-µl volume. Plasma viremia was measured using Cobas Amplicor (Roche, Switzerland) technology at the indicated time points throughout the infection. The detection limit of the assay is 400 HIV RNA copies/ml.

Lamivudine (3TC) (Epivir; GlaxoSmithKlein, United Kingdom) treatment was started 30 days postinfection in the treatment group of the infected mice. 3TC tablets were weighed, pulverized, and combined with food pellets as previously described [\(29\)](#page-14-13).

Amplification of HIV from plasma viral RNA. Viral RNA was extracted from 140 μ l frozen plasma using the QIAamp viral RNA minikit (Qiagen; catalog no. 52904) according to the manufacturer's instructions.

For deep sequencing, cDNAs were synthesized using custom reverse transcription primers (Integrated DNA Technologies) (see Table S1 in the supplemental material). From 5' to 3', our first-generation RT cDNA primer (4372) included a 16-bp HIV-specific sequence (accession no. [AF324493.2;](https://www.ncbi.nlm.nih.gov/nuccore/AF324493.2) bp 3336 to 3351), an 8-bp randomized sequence (UMID), and an additional 23-bp HIV-specific sequence [\(AF324493.2;](https://www.ncbi.nlm.nih.gov/nuccore/AF324493.2) bp 3305 to 3327). Viral cDNA was synthesized using the Invitrogen ThermoScript RT-PCR system (Thermo Fisher Scientific; catalog no. 11146016). Briefly, the RNA and primer were denatured at 65°C for 5 min. The ThermoScript reaction mixture was added to the RNA and primer and incubated at 50°C for 60 min, followed by an inactivation step of 85°C for 5 min.

Viral cDNA was column purified (Zymo Clean and Concentrator kit; catalog no. D4034) and amplified in a first-round PCR using primers 1922 [\(AF324493.2;](https://www.ncbi.nlm.nih.gov/nuccore/AF324493.2) bp 2929 to 2946) and 1923 [\(AF324493.2:](https://www.ncbi.nlm.nih.gov/nuccore/AF324493.2) bp 3337 to 3356). The first-round PCR (94°C for 2 min, followed by 23 cycles of 93°C for 15 s, 48°C for 30 s, 68°C for 60 s, and a final extension of 68°C for 10 min) used Pfx50 polymerase (Thermo Fisher Scientific; catalog no. 12355012). The first-round products were purified (Zymo Clean and Concentrator), and a second PCR was performed to add Illumina-based adapters using the custom primer 1690 and one of 73 primers with distinct MiSeq barcode identifiers (see Table S1). The second-round PCR (95°C for 2 min, followed by 25 cycles of 93°C for 20 s, 50°C for 20 s, 72°C for 15 s, and a final extension of 72°C for 10 min) used PfuUltra II Fusion HS polymerase (Agilent Technologies; catalog no. 600672). The second-round PCR products were confirmed by electrophoresis and purified by SPRIselect magnetic-bead selection (Beckman Coulter; catalog no. B23317).

To amplify vif sequences from plasma vRNA, a vif-specific cDNA synthesis primer (4373) was used. From 5' to 3', primer 4373 included a 16-bp T7 sequence, an 8-bp randomized sequence, and a 23-bp HIV-specific sequence [\(AF324493.2;](https://www.ncbi.nlm.nih.gov/nuccore/AF324493.2) bp 5386 to 5406). Viral cDNA was synthesized using the ThermoScript RT-PCR system and purified as described above. cDNAs were amplified in the first-round PCR using primers 2402 [\(AF324493.2;](https://www.ncbi.nlm.nih.gov/nuccore/AF324493.2) bp 4993 to 5012) and 2401 (T7). The first-round products were purified and amplified in a second-round PCR using primers 2403 and one of 80 primers with distinct MiSeq barcode identifiers and complementarity to the T7 sequence. PCR cycling conditions were the same as those used for the RT products.

MiSeq library preparation and MiSeq instrumentation. Sequencing libraries were run on the Illumina MiSeq and sequenced as paired-end reads. To prepare libraries, bead-purified PCR products containing Illumina adapters (376-bp RT amplicons and 393-bp vif amplicons) were quantitated with a Qubit double-stranded DNA (dsDNA) HS assay kit (Thermo Fisher Scientific; catalog no. Q32854). To sequence 250 bp of the RT region, a 6-pM final library was run with a 20% spike-in of PhiX Control V3 (Illumina; catalog no. FC-110-3001) for 2 sets of 150 cycles using a MiSeq reagent kit v2 (300 cycles; Illumina; catalog no. MS-102-2002) or a MiSeq reagent kit v3 (600 cycles; Illumina; catalog no. MS-102- 3003). Custom sequencing primers were used for the forward (1692), index (3890), and reverse (3889) reads. To sequence a 269-bp-long region of vif, a 6-pM final library was run with a 15% spike-in of PhiX Control V3 for 2 sets of 150 cycles. Custom sequencing primers were used for the forward (4580), index (4577), and reverse (4578) reads (see Table S1).

Bioinformatic pipeline for sequence analyses. Custom Unix and Perl scripts were written to process FASTQ files. First, paired-end reads were merged using Paired-End reAd mergeR [\(91\)](#page-16-6). The reads were aligned to pNL4-3 RT or vif reference sequences [\(AF324493.2\)](https://www.ncbi.nlm.nih.gov/nuccore/AF324493.2) and filtered. Sequences were grouped

by distinct UMIDs. A minimum of three high-quality merged paired-end reads that contained the same UMID were required to generate a consensus sequence. Consensus sequences were defined as sequences in which each nucleotide reflected 70% or more of all the nucleotides sequenced for a given position. Consensus sequences for sequences defined by a distinct UMID were identified using in-house scripts. Twenty-five UMIDs that differed by only one mismatch from the HIV template sequence were considered to be experimental artifacts and excluded from the analyses.

Additional custom scripts were written to identify 3TC resistance mutations at RT codon 184 and to compute overall mutation rates, GG-to-GA as well as GA-to-AA mutagenesis, and the frequency of stop codons within the sequenced RT and vif regions. DNASP v5 polymorphism software was used to calculate the nucleotide diversity (π) , defined as the average pairwise number of nucleotide differences per site in all possible pairs of consensus sequences per sample [\(92\)](#page-16-7).

Statistics. Normality was assessed using the D'Agostino and Pearson test for numerical data, such as baseline plasma viremia, changes in viremia, proportions of 3TC-susceptible and -resistant viral sequences, nucleotide diversity, and mutation rates. If groups passed normality tests, parametric Student t tests for unpaired data or paired Student t tests for paired data were used. Otherwise, nonparametric Mann-Whitney or Wilcoxon matched-pairs signed-rank tests were used. For categorical data (e.g., treatment failure/success), Fisher's exact test was used. Linear-regression models were used for replication kinetics, and F tests were used to compare slopes of curves of best fit. Finally, nonlinear-regression methods (exponential [Malthusian]) using weighted least squares were used, with an extra sum-ofsquares F test to compare nonlinear curves of best fit.

Significance testing results are reported as exact P values in the text or using asterisks. All statistics were performed using the built-in analysis packages from the GraphPad Prism suite v8.0 (GraphPad Software, Inc., La Jolla, CA).

Data availability. All raw FASTQ sequencing files have been made publicly available at the NCBI Short Read Archive (BioProject [PRJNA579142,](https://www.ncbi.nlm.nih.gov/bioproject/?term=PRJNA579142) sample accession no. [SAMN13103784](https://www.ncbi.nlm.nih.gov/biosample/SAMN13103784) to [SAMN13103916\)](https://www.ncbi.nlm.nih.gov/biosample/SAMN13103916). In addition, all in-house scripts for sequence read processing and data analyses can be accessed at [https://github.com/SimonLab1850/Vif-pipeline.](https://github.com/SimonLab1850/Vif-pipeline)

SUPPLEMENTAL MATERIAL

Supplemental material is available online only. **SUPPLEMENTAL FILE 1**, PDF file, 0.1 MB.

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