Evolutionary rate shifts suggest species-specific adaptation events 1 in HIV-1 and SIV 2 3 4 Maoz Gelbart and Adi Stern 5 School of Molecular Cell Biology and Biotechnology, George S. Wise faculty of Life Sciences, Tel Aviv 6 University, Israel 7 * Correspondence to AS: sternadi@post.tau.ac.il Abstract 8 9 The process of molecular adaptation following a cross-species virus transmission event is 10 currently poorly understood. Here, we identified 137 protein sites that experienced deceleration 11 in their rate of evolution along the HIV-1/SIV phylogeny, likely indicating gain-of-function and 12 consequent adaptation. The majority of such events occurred in parallel to cross-species 13 transmission events and varied between HIV-1 groups, indicating independent adaptation 14 strategies. The evolutionary rate decelerations we found were particularly prominent in 15 accessory proteins that counteract host antiviral restriction factors, suggesting that these factors 16 are a major barrier to viral adaptation to a new host. Surprisingly, we observed that the non-17 pandemic HIV-1 group O, derived from gorillas, exhibited more rate deceleration events than 18 the pandemic group M, derived from chimpanzees. We suggest that the species barrier is higher 19 when the genetic distance of the hosts increases. Our approach paves the way for subsequent 20 studies on cross-species transfers in other major pathogens.

21 Introduction

22	The Human Immunodeficiency Viruses HIV-1 and HIV-2 are the causative agents of AIDS in
23	humans, infecting millions of people worldwide. Both viruses emerged from a clade of
24	lentiviruses known as the Simian Immunodeficiency Virus (SIV), which naturally infect a variety
25	of non-human primate species. HIV in humans arose from several independent transmission
26	events of primate SIVs that resulted in HIV-1 groups M and N (from SIV infecting chimpanzees,
27	SIVcpz), HIV-1 groups O and P (from SIV infecting gorillas, SIVgor), and HIV-2 groups A through H
28	(from SIV naturally infecting sooty mangabeys, SIVsmm) [1-3]. The gorilla infecting lentivirus,
29	SIVgor, is itself a result of a transmission of SIVcpz to gorillas [4, 5]. Phylogenetic analyses date
30	the most common recent ancestors of HIV groups M and O to the beginning of the 20 th century,
31	making it a relatively new human pathogen [6, 7]. Similar analyses of SIVgor date the inception
32	of this virus in the western lowland gorilla population somewhere in the 19 th century [4]. SIVcpz
33	itself was found to be a transmission from other primates, dated at roughly 1500 and leading to
34	the two lineages of SIVcpz: SIVcpzptt infecting the chimpanzee subspecies Pan troglodytes
35	troglodytes of central Africa, and SIVcpzpts infecting the Pan troglodytes schweinfurthii
36	chimpanzee subspecies of eastern Africa [5, 8-12].
37	How viruses are able to cross species barrier is a subject of much interest, since many pandemic
38	human viruses arose from zoonosis events such as the influenza strain of "Spanish flu" H1N1,
39	measles virus (MeV), and SARS coronavirus [13]. Due to genetic differences between the hosts,
40	virus adaptation occurs at multiple levels: at the level of entry to target cells; interaction with
41	the host adaptive immune system; interaction with host antiviral restriction factors; and
42	recruitment of host cellular machinery by the virus [14-16]. Protein adaptations are reflected in
43	the history of genomes and may be manifested in changes in the amino acid substitution rates

44 of the adaptive sites, which are expected to be more conserved in the clade where adaptation

45	happened [17]. This is due to new roles gained by these protein sites that constrain their
46	evolution. A reciprocal phenomenon where amino acids are less conserved in one clade than in
47	other clades is also possible, and may either reflect a loss of function or a gain of function
48	manifested as positive diversifying selection. Identification of such "rate shifting sites" can thus
49	reveal virus adaptation events, and is expected to promote a better understanding of cross-
50	species transmissions in general and in the HIV pandemic in particular in this study.
51	A method for identification of evolutionary rate changes has been previously established and
52	was used to study intra-subtype HIV adaptation events [18]. To date, the lack of SIVcpz and
53	group O full genomic sequences limited the ability to study adaptation across cross-species
54	transmission events. Here, we utilized the growing availability of diverse and full HIV-1 and SIV
55	genomes to identify many sites in various SIVcpz/SIVgor/HIV-1 clades whose evolutionary rate
56	changed across clades [19]. We demonstrate how cross-species transmissions are correlated
57	with abundant evolutionary rate shifts and how known adaptation events are manifested in
58	different amino acid substitution rates between lineages. Based on the rate shift patterns, we
59	suggest previously unknown adaptation events, and highlight the exceptional amount of
60	evolutionary rate shifts observed in HIV-1 group O, possibly due to a more extreme host species
61	barrier.

62 Results

We have previously developed the RASER tool to identify sites that display change in the rate of
evolution along a given branch of a phylogenetic tree (see example in Figure 1) [18]. In essence,
this tool takes a phylogeny and a multiple sequence alignment and contrasts the rates of
evolution of amino acids along all branches in the phylogeny, to determine if the evolutionary
rates of some amino acids in some branches are better explained by a model that allows for

68	evolutionary rate changes. We queried the Los Alamos HIV database [19] for all available HIV-1,
69	SIVcpz and SIVgor full sequences, from which we took the sequences of all nine HIV-1 proteins.
70	Due to high representation of group M sequences, we downsampled this group to the size of
71	available group O sequences, retaining the strains with the most internal variation (total number
72	of sequences N=126, see Methods). A different downsample of group M sequences to a bigger
73	size was also conducted, to validate results robustness to cohort size variation (N=223, see
74	Methods). All site coordinates are reported based on the HIV-1 subtype B reference strain HXB2
75	(Methods).
76	Most rate shift events were identified in speciation branches. We first sought to characterize
77	the branches where rate shift events were suggested. A total of 271 rate shifting positions were
78	identified along the phylogeny. 137 of them were identified as rate-deceleration events and an
79	additional 134 were identified as rate-accelerations. As listed in Table 1, 230 out of the 271 rate
80	shifting positions were attributed to four branches: the branch separating group M from SIVcpz,
81	the branch separating group O from SIVgor, the branch separating SIVgor and group O from
82	SIVcpz and the branch separating SIVcpzpts from other viruses. Likelihood ratio tests were found
83	to be highly significant in favor of a rate shift model across all HIV proteins (Supplementary
84	Table 2).

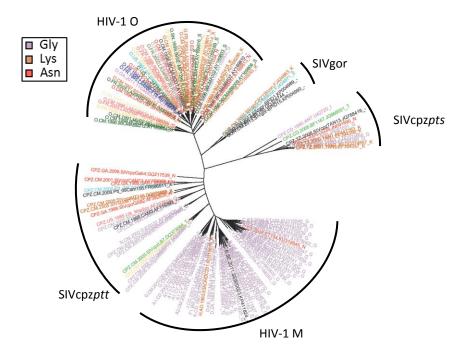


Figure 1. Projection of Env₄₅₈ **on the HIV-1/SIV phylogeny.** Each leaf (corresponding to an HIV/SIV strain) is color coded based on the amino acid present at Env_{458} . The evolutionary rate of Env_{458} was found to be slower in HIV-1 group M than in the rest of the phylogeny.

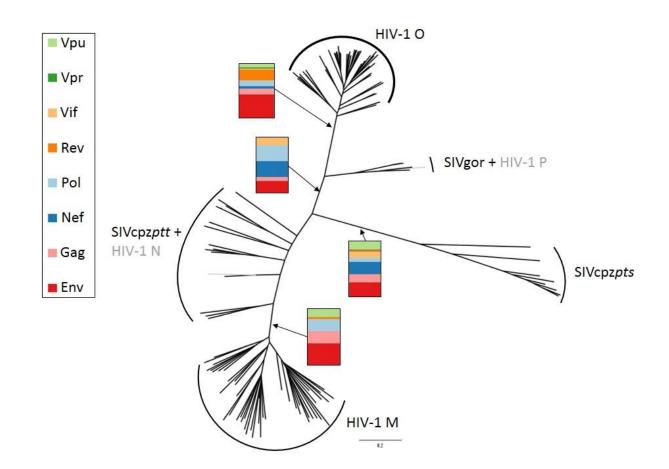
86	Different rate deceleration patterns identified in different branches. A special focus was given
87	to rate deceleration events, as they likely indicate a gain of function in a protein. In Figure 2 we
88	mapped the percent of rate shifts in each protein observed in each lineage, corresponding to
89	different virus speciation events. While rate deceleration distribution patterns differed between
90	the different lineages (see Figure 2 and Supplementary Table 1), one common theme was that
91	all prominent branches underwent a significant portion of their rate deceleration events in the
92	Env protein. The next two common rate decelerating proteins were Gag and Pol identified in all
93	four highlighted branches, which is expected given that together with Env these are the longest
94	proteins in HIV/SIV. When controlling for protein size (as in Table 1), a different pattern
95	emerged: Vpu seems to have undergone a disproportionate portion of rate deceleration events,
96	in particular in the branch leading to group M. In general, the rate deceleration patterns for the
97	non-structural proteins seemed to be branch-specific: In the branch leading to SIVgor and group

- 98 O, Nef and Vif experienced the most relative rate deceleration events. In the branch leading to
- 99 group M, Vpu was responsible for the most rate deceleration events; and in the branch leading
- 100 to group O, Rev contributed a significant portion of all rate decelerations for that branch
- 101 (Supplementary Table 1). The branch separating SIVcpzpts from other viruses displayed a more
- 102 diverse pattern with relatively less rate decelerations in the Env protein and more rate
- 103 decelerations in the Nef, Vif and Vpu proteins.

104 Table 1. Rate shifts as *percentage from total protein size* for prominent branches, for rate

- 105 decelerating sites (upper) and rate accelerating sites (lower), colored by intensity. The raw
- 106 data underlying this table are provided in Supplementary File 2.

Structural		Regulatory		Accessory						
DEC	I	proteins		prot	eins		prot	eins		
			I		I				I	Total number of
Branch/protein	Env	Gag	Pol	Rev	Tat	Nef	Vif	Vpr	Vpu	mutations
Group M	1%	1%	1%	1%	0%	0%	0%	0%	5%	28
Group O	2%	1%	0%	8%	0%	1%	1%	1%	4%	46
SIVgor+P+O	0%	0%	0%	0%	0%	2%	1%	0%	0%	14
SIVcpz <i>pts</i>	1%	1%	0%	0%	0%	3%	2%	1%	5%	27
ACC										Total number of
Branch/protein	Env	Gag	Pol	Rev	Tat	Nef	Vif	Vpr	Vpu	mutations
Group M	1%	1%	0%	0%	1%	1%	1%	1%	1%	23
Group O	3%	2%	1%	3%	0%	1%	2%	0%	1%	51
SIVgor+P+O	0%	0%	0%	0%	0%	2%	0%	1%	1%	10
SIVcpz <i>pts</i>	1%	1%	0%	0%	0%	3%	1%	2%	5%	31



108

109 Figure 2. Proposed rate deceleration patterns in prominent branches, shown on the

phylogeny. Rate decelerations are shown as percentage from total rate decelerations for eachbranch.

- 113 groups are of special interest, since they may better reflect the species barrier in general and
- not lineage-specific adaptation event. As is evident from Table 2, most parallel rate shift events
- of HIV-1 groups O and M (or their closest precursor branch) were rate deceleration events, half
- of which occurred in the highly conserved Pol protein. Notably, the consensus amino acid
- 117 identity in those parallel-occurring rate deceleration events varied between the M and O clade
- 118 for all identified positions, suggesting once again that different adaptation strategies occurred in
- each lineage. Only a single parallel rate acceleration event was identified, in Nef₈ of HIV-1

¹¹² Parallel rate shift events in HIV-1 groups M and O. Rate shift events common to several HIV-1

- 120 groups M and O. This may indicate a relaxation of prior constraint as the SIV allele was
- 121 maintained in many HIV-1 sequences.
- 122 Table 2. Rate shifting sites identified independently in parallel in HIV-1 groups M and O or
- 123 their immediate ancestor.

Protein	Rate Shifting site	Rate shift type	Branches	Consensus Amino Acids
Pol	349	Deceleration	M, Pre O	M: E, Pre O: P
Pol	406	Deceleration	,	Pre M: S, O: V
Pol	926	Deceleration	-	M: K, Pre O: T
Env	61	Deceleration	M, 0	M: Y, O: T
Env	772	Deceleration	M, 0	M: R, O: S
Rev	71	Deceleration	Pre M, O	Pre M: V, O: N
Nef	8	Acceleration	M, 0	NA

124 NA- Not applicable

125 Rate shift events are often parallel to known macromolecular adaptation events. Intense 126 research into the origins of the HIV-1 pandemic and its sources identified several major 127 adaptation events of HIV-1 to its human host. These events include adapting to cellular variations such as differences in host receptor CD4; overcoming host innate immune restriction 128 129 factors such as Tetherin (BST-2) and APOBEC3G; and of course, evasion from the adaptive 130 immune system [16, 20-25]. We therefore sought to evaluate whether the proposed rate shifts 131 agree with the known adaptation events. 132 Anti Tetherin/BST-2 adaptations. Tetherin/BST-2 is a trans-membrane antiviral 133 restriction factor that disrupts the budding phase of the retroviral lifecycle, thus preventing the 134 infection from spreading [26, 27]. SIVcpz and many more SIV's antagonize Tetherin through 135 interactions of their nef protein with the cytoplasmic tail of Tetherin [28, 29]. Tetherin is a fast evolving protein, and differs between chimpanzee, gorilla and human [30, 31]. In humans, a 136 137 significant deletion in the cytoplasmic tail of Tetherin rendered it invulnerable to the SIV's Nef-138 based counteraction [29]. Therefore, in order to regain infectivity HIV-1 developed an

139 alternative way to antagonize Tetherin. In groups M and N, Vpu protein adapted to antagonize 140 Tetherin through its transmembrane domain [32]. In group O the virus adapted its Nef protein 141 to counteract the human Tetherin, albeit with less efficiency than in group M [33, 34]. Notably, a single O strain that uses its Vpu protein to encounter human Tetherin has been described [35]. 142 143 No anti-Tetherin adaptation event is known to have occurred in the rare group P [36]. In gorilla, 144 the Nef protein adapted to encounter its host's Tetherin but also maintained its ability to 145 encounter the chimpanzee tetherin [37, 38]. 146 Our results support the described anti-Tetherin adaptation events: a dramatically high 147 proportion (14% of all identified group M rate decelerations) were found in the Vpu protein, 148 most of them in the Tetherin-binding domain (Supplementary Table 1 and Figure 3). In addition, 149 in HIV-1 group M the Nef protein was identified with three rate accelerations, supporting the 150 loss of function of its anti-Tetherin activity. This is also supported by a reintroduction 151 experiment of HIV-1 group M strain into chimpanzee in which M-Nef readapted to chimpanzee 152 host, as the mutations required for M-Nef to regain anti-Tetherin activity in chimpanzees (Nef₁₆₃ and Nef₁₆₉) [39] were located proximally to Nef₁₅₇, one of the rate accelerating sites of M-Nef 153 154 identified in our study. Numerous O-Nef rate acceleration events were found as well, supporting 155 the loss of chimpanzee/gorilla anti-Tetherin function. A preponderance of acceleration and 156 deceleration events were also found in the lineages leading to the ancestor of SIVgor and O and 157 to SIVcpzpts; one of those rate deceleration events is at Nef₁₇₇, which is proximal to the C-loop 158 region which has been shown to be related to O-Nef anti-Tetherin activity [40]. Thus, our 159 analysis pinpoints the sites that are likely responsible for the dramatic changes in function of 160 Vpu and Nef throughout SIVcpz and HIV evolution.

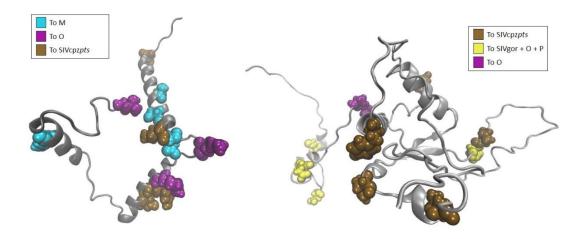


Figure 3. Projection of the identified rate decelerations onto the tertiary structure of Vpu
protein (left, PDB ID: 2N28) and Nef protein (right, obtained from [41]) in the major lineages
where it was identified.

161

165 Anti APOBEC3G adaptations. APOBEC3G (A3G) is a broad-range antiviral protein that is 166 packaged into HIV-1 virions, and upon reverse transcription adds $C \rightarrow U$ mutations to the 167 synthesized DNA strand, thus potentially creating nonviable genomes [42]. Lentiviruses use their 168 Vif protein to overcome this factor by degrading it as well as other antiviral proteins from the 169 APOBEC3 family (such as A3F, A3D) [43]. A3G variants of human, chimpanzee and gorilla have 170 been studied and the Vif recognition domain has been identified at A3G residues 126-132 [44]. Of those species, gorilla has a different residue at A3G position 129 as compared to that of 171 human and chimpanzee A3Gs and indeed the SIVgor adaptation event to the different host A3G 172 173 has been demonstrated by [45, 46]. It has been shown that SIVgor can replicate in the presence 174 of human-, gorilla- and chimpanzee-A3G, but HIV-1 group M or SIVcpz cannot replicate in the 175 presence of gorilla-A3G, indicative of a gain-of-function in the adaptation process of SIVgor to 176 gorilla [46].

177 In line with these findings, our analysis shows that the branch leading to SIVgor and HIV178 1 groups O and P experienced 14% of its rate decelerations in the Vif protein, particularly in

positions Vif₇₃ and Vif₁₆₇. In HIV-1, Vif₇₃ is in close proximity to the A3G-binding motif Vif₆₉₋₇₂ that
is also responsible in-part for interaction with APOBEC3F (which in itself contains differences in
the Vif interacting loop between chimpanzee and human/gorilla) [47-49]. O-Vif experienced a
single rate deceleration in position Vif₁₂₇, which is located in the Cullin-5 interacting domain [48].
Lack of rate deceleration events in M-Vif suggest no adaptation of this protein in this strain to
the human host; this is supported by the observation that SIVcpz-Vif can encounter human A3G
[46].

186 **Env adaptations.** Another major barrier for host jumps lies at the cell entry level. CD4 is 187 the target receptor of SIV and HIV, while CCR5 or CXCR4 act as co-receptors, recognized by the 188 viral Env protein which is exposed to the virus external surface. Previous studies mapped the 189 genetic diversity between different chimpanzees' CD4 and revealed that there are several 190 differences between chimpanzee subspecies as well as differences between chimpanzee versus 191 gorilla and human, especially in the regions that are in close contact with Env subunit gp120 [50, 192 51]. Some of those changes affect the glycosylation patterns of CD4, making these differences 193 even more distinguishable [50, 51]. It is therefore likely that HIV-1 had to adapt to recognize 194 these differences in CD4.

Our analysis overall supports a high level of deceleration and acceleration events found in Env, possibly reflecting the changes that occurred in the host CD4. For instance, many of the changes in M-Env occurred in CD4 interacting residues of Env₃₇₄, Env₄₅₅, Env₄₅₆ and Env₄₅₈ [52]. However, we cannot rule out that the very high rate of evolution in Env, driven by the adaptive immune system [53], have led to changes that "mimic" a rate shift. Indeed when accounting for the size of the Env protein, it seems that this protein is less pronounced in its rate shift distribution (Table 1).

202 **Gag₃₀ human adaptation marker.** Position 30 of Gag polyprotein has been previously

- 203 suggested to be an adaptation event of HIV-1 to its human host, as it diversified from
- 204 Methionine in SIVcpzptt and SIVgor strains into Lysine or Arginine in many HIV-1 strains [54].
- 205 Reintroduction of HIV-1 to chimpanzees resulted in reversion of this position back to the
- 206 conserved Met of SIVcpz*ptt* and therefore it was suggested as an adaptation event to the human
- host [54]. Notably, subtype C of group M is conserved for Methionine at Gag₃₀, suggesting that
- 208 adaptation occurred only in some subtypes.
- 209 Our results indeed suggest an evolutionary rate shift event in Gag₃₀ yet are not
- conclusive about the branches in which the rate shift happened. This is likely since this site
- displays a "content shift" rather than a strong "rate shift" (elaborated in the discussion).

	Rate	Rate deceleration(s)		
	decelerating	related to the		 -

Table 3. Summary of HIV rate deceleration events related to known antiviral activity.

Viral Lineage	Viral Protein	decelerating positions identified	related to the following restriction factor	Function of the restriction factor
Group M	Vpu	18, 23, 28, 66	Tetherin	Prevents virus release from infected cells
SIVgor and Group (D Nef	20, 28, 38, 49, 50, 177	Tetherin	Prevents virus release from infected cells
SIVgor and group C) Vif	73, 127, 167	APOBEC3G	Induces hypermutation of viral genomes

213 Discussion

- 214 Understanding the molecular changes in a pathogen when adapting to infect a new host species
- 215 is of high importance. To the best of our knowledge, our study represents the first large-scale
- approach to detect adaptation events in the transition from non-human primates to humans,
- and relies on a robust phylogenetic modeling approach. We discovered many lineage-specific
- adaptation-like events in many proteins of HIV-1, SIVgor and SIVcpzpts, and have reported sites
- in where groups M and O suggested to undergone parallel rate shifts. The majority of sites

220 undergoing rate deceleration were found in the Env protein; when correcting for protein size, 221 the relatively highest number of rate decelerating were found in proteins that adapted to host 222 restriction factors. Accordingly, we suggest that the major common barrier for a host species jump is composed of both the entry stage and the stage where the virus must overcome the first 223 224 barrier of cellular defenses. Our results further support a differential model of adaptation: 225 groups M and O underwent adaptation in different proteins, and when adaptation occurred at 226 similar sites, the amino-acid was different in both groups. This model is supported by the fact 227 that activity of group M and O proteins are indeed different (e.g., Vpu), and by the fact that each 228 group originated from an SIV from a different primate. 229 Since group M is the pandemic strain of HIV-1, we initially expected that it would experience the 230 highest number of rate shift events among all HIV-1 groups, indicating more efficient adaptation 231 to its human host. Surprisingly, our analysis revealed that group O had almost twice the amount 232 of rate shift events, despite being a non-pandemic strain that remained localized mainly to 233 infections in west-central Africa [55, 56]. We suggest that the number of rate shift events is not 234 the determinant of a pandemic strain; it may rather reflect the relative height of the species 235 barrier a strain had to overcome, as chimpanzee from which group M originated is genetically 236 closer to human than gorilla from which group O originated [57, 58]. 237 We further noted a large number of rate shifts that occurred in the lineage separating the two 238 subspecies of SIVcpz (SIVcpzptt and SIVcpzpts). Presumably these events correspond to 239 adaptations of the virus to the two chimpanzee subspecies, which are genetically divergent. 240 Further research will be required to understand if and how this has affected the adaptation of

the virus to the human host.

242 Limitations. This study has several limitations. First, the availability of full coverage of SIVcpz 243 and the SIVgor genomes is still low, reducing the statistical power of the analysis. Indeed, we 244 noted that increasing the sample size of group M sequences that are much more available, led to detection of more rate shifting sites (Supplementary File 1). We expect that the availability of 245 246 additional SIVgor sequences will increase the number of rate shift events that are unique in that 247 clade, possibly revealing more important sites for this lineage. Second, the method that we 248 utilized to identify rate shifts is calibrated to identify dramatic changes in the evolutionary rate 249 along a lineage. Accordingly, it cannot detect sites where a "content shift" occurred, i.e. the 250 amino acid changed and remained conserved in two complementary lineages, since this entails 251 only a minor change in evolutionary rate. This is partially demonstrated in Gag_{30} , where the rate 252 of evolution changed mildly, while the content of this site changed between chimpanzee and 253 human viruses. 254 Implications. The compiled list of the positions suggested as rate decelerating can now serve as 255 a guide for future functional studies that aim to understand the differences among HIV-1 and 256 SIV proteins. Furthermore, the ability to track adaptation events by utilizing sequence data 257 highlights the power of the method when studying emerging pandemics, strengthening the 258 need to sequence full genomes of pathogens broadly. 259 **Conclusions.** Genetic sequences of viruses and specifically HIV-1 and SIV viruses can be 260 harnessed to identify adaptation events of emerging pathogens to their new host species. Our 261 results suggest that innate immunity serves as a strong barrier for cross-species transmission 262 events, and that this barrier imposed a strong selective pressure for viruses to adapt as they 263 crossed these barriers with increasing efficiency.

264 Methods

265 In order to collect sequences for this study, the Los Alamos HIV sequence database (available 266 online at http://www.hiv.lanl.gov [19]) was queried for HIV-1 sequences from the same strain 267 that spanned all nine HIV-1 open reading frames (ORFs: gag, pol, vif, vpr, tat, rev, vpu, env and 268 nef) and for SIVcpz and SIVgor strains that spanned the corresponding ORFs (with the exception 269 of vpx). This led to 2004 sequences of HIV-1 group M, 45 sequences of HIV-1 group O, 9 270 sequences of HIV-1 group N, 2 sequences of HIV-1 group P, 4 sequences of SIVgor and 29 271 sequences of SIVcpz. Two different datasets were constructed: (i) with a very large number of 272 group M sequences compared to the amount of group O sequences, and (ii) with an equal 273 number of group M and group O sequences. Due to computational reasons, dataset (i) included 274 200 HIV-1 sequences, most of them group M. In both datasets, the sequences were sampled so 275 that the n most distant strains (in terms of genetic distance) were sampled. Due to extremely 276 high similarity. HIV-1 groups N and P sequences were reduced to a single representative strain 277 from each. The IIIB LAI strain was added manually as a reference sequence. The results in this 278 study are reported mainly with datasets (ii), chosen since it allows comparing the result from 279 group M and group O. Additional sites found with datasets (i) are reported in Supplementary 280 File 1. 281 Initial multiple sequence alignments of the nine proteins were performed using PRANK and

iteratively improved until convergence [59]. In order to reconstruct of the phylogenetic
relationship between the sequences, we concatenated the alignments of Gag, Pol, Vif, Vpr, Tat
and Env and provided this as input for PhyML [60]. We next used the reconstructed phylogeny
as a guide tree to realign each protein with PRANK. JpHMM was used to validate that the strains
used in the analysis are not inter-group recombinants [61].

287	In order to identify evolutionary rate shifts, we used RASER [18] to analyze each of the nine
288	proteins separately, with the proteome-based phylogeny as input. RASER is a likelihood-based
289	phylogenetic method for detecting a change in site-specific evolutionary rates. First, a likelihood
290	ratio test against a null model of no rate shifts is performed in order to assess if a model
291	enabling rate shifts better fits the data. Next, the posterior probability of rate-shift is calculated
292	at each site and sites with a probability higher than 0.6 are considered here as significant.
293	Finally, for each such site, the method lists the lineages where the rate shift occurred with the
294	highest probability, and further categorizes each sites as undergoing either a rate-deceleration
295	or a rate-acceleration.
296	In order to test for sequence sampling effects on the identified rate shift patterns, we repeated
296 297	In order to test for sequence sampling effects on the identified rate shift patterns, we repeated the analysis with increased amount of group M sequences (n=183), reduced amount of group O
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297 298	the analysis with increased amount of group M sequences (n=183), reduced amount of group O sequences (n=13) and no SIVgor sequences, denoted as dataset (i). Analysis revealed more rate
297 298 299	the analysis with increased amount of group M sequences (n=183), reduced amount of group O sequences (n=13) and no SIVgor sequences, denoted as dataset (i). Analysis revealed more rate decelerations in the branch leading to group M than in dataset (ii) analysis (48 compared to 28,
297 298 299 300	the analysis with increased amount of group M sequences (n=183), reduced amount of group O sequences (n=13) and no SIVgor sequences, denoted as dataset (i). Analysis revealed more rate decelerations in the branch leading to group M than in dataset (ii) analysis (48 compared to 28, Supplementary File 1). 54% of the positions identified as rate-decelerating in group M in dataset
297 298 299 300 301	the analysis with increased amount of group M sequences (n=183), reduced amount of group O sequences (n=13) and no SIVgor sequences, denoted as dataset (i). Analysis revealed more rate decelerations in the branch leading to group M than in dataset (ii) analysis (48 compared to 28, Supplementary File 1). 54% of the positions identified as rate-decelerating in group M in dataset (ii) (n=15) were also identified in dataset (i). Chi-squared tests for differences in group M rate

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310 Competing Interests

311 The authors declare that they have no competing interests involved with this study.

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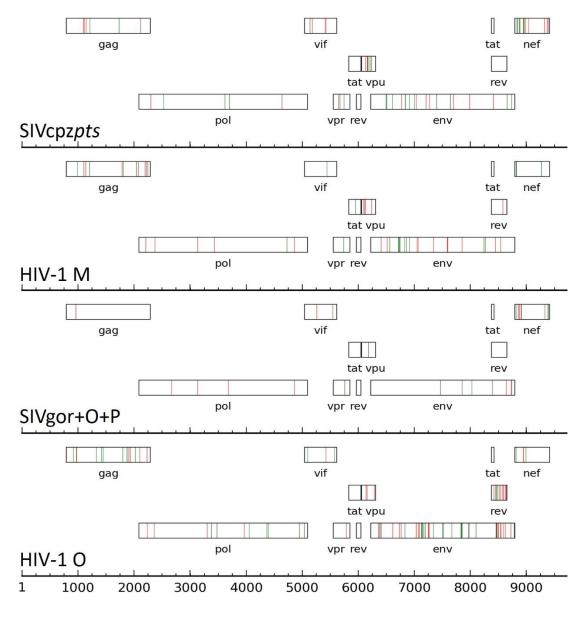
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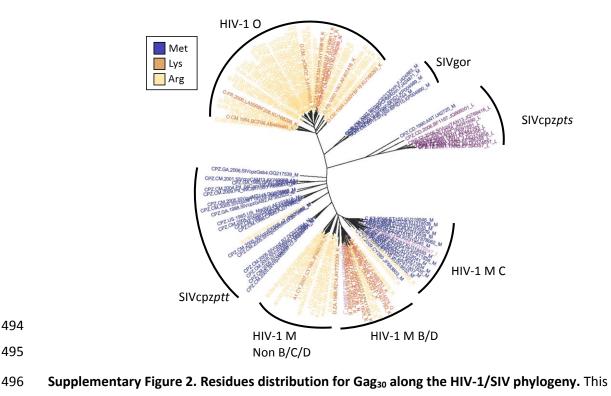
488 Supplementary Figures and Tables





490

491 Supplementary Figure 1. Proposed rate deceleration patterns in prominent branches shown
 492 along the genome. Data shown in HXB2 coordinates.



497 position exhibits a pattern more similar to "content shift" than to "rate shift".

- 499 Supplementary Table 1. Rate shifts as *percentage from total rate shifts for prominent*
- 500 *branches*, for rate decelerating sites (upper) and rate accelerating sites (lower), colored by
- 501 intensity.

DEC									
Branch/protein	Env	Gag	Pol	Rev	Tat	Nef	Vif	Vpr	Vpu
Group M	39%	21%	21%	4%	0%	0%	0%	0%	14%
Group O	43%	11%	11%	20%	0%	4%	2%	2%	7%
SIVgor+P+O	21%	7%	29%	0%	0%	29%	14%	0%	0%
SIVcpz <i>pts</i>	26%	15%	7%	0%	0%	22%	11%	4%	15%
ACC									
Branch/protein	Env	Gag	Pol	Rev	Tat	Nef	Vif	Vpr	Vpu
Group M	43%	22%	4%	0%	4%	13%	4%	4%	4%
Group O	55%	18%	12%	6%	0%	4%	4%	0%	2%
SIVgor+P+O	40%	0%	0%	0%	0%	40%	0%	10%	10%
SIVcpz <i>pts</i>	35%	10%	10%	0%	0%	23%	3%	6%	13%

502

503 Supplementary Table 2. Maximum log-likelihood (LL) values for the analysis of the nine HIV-

504 **1/SIVcpz/SIVgor** proteins under the rate shift and null models.

Protein	Rate Shift Model LL	Null Model LL	2∆LL	P-value (χ^2_3)
Gag	-29,478.3	-29,671.4	386	<10 ⁻⁵⁰
Pol	-40,813.1	-41,097.2	568	<10 ⁻¹⁰⁰
Vif	-12,677.6	-12,756.3	157	<10 ⁻³⁰
Vpr	-5,328.1	-5,355.76	55	<10 ⁻¹⁰
Tat	-8,918.23	-8,947.61	59	<10 ⁻¹⁰
Rev	-12,662	-12,733.6	143	<10 ⁻³⁰
Vpu	-10,548.7	-10,664.1	231	<10 ⁻⁵⁰
Env	-92,347.6	-93,028.8	1362	<10 ⁻¹⁰⁰
Nef	-15,611.4	-15,804.1	385	<10 ⁻⁵⁰

505

507 Supplementary and Source Files

- 508
- 509 Supplementary File 1.
- 510 HIV/SIV sites identified as rate shifting for dataset (i). Positions are provided in HXB2 reference
- 511 sequence coordinates. Branch number field refer to the branch number outputted by RASER
- 512 [18]; for ease of reading we provide branch labels for most branches.

513 Supplementary File 2.

- 514 HIV/SIV sites identified as rate shifting for dataset (ii). Positions are provided in HXB2 reference
- 515 sequence coordinates. Branch number field refer to the branch number outputted by RASER
- 516 [18]; for ease of reading we provide branch labels for most branches.