

## Defining Differential Genetic Signatures in CXCR4- and the CCR5-Utilizing HIV-1 Co-Linear Sequences



Benjamas Aiamkitsumrit<sup>1,3</sup>, Will Dampier<sup>1,3</sup>, Julio Martin-Garcia<sup>1,3</sup>, Michael R. Nonnemacher<sup>1,3</sup>, Vanessa Pirrone<sup>1,3</sup>, Tatyana Ivanova<sup>1,3</sup>, Wen Zhong<sup>1,3</sup>, Evelyn Kilareski<sup>1,3</sup>, Hazeez Aldigun<sup>1,3</sup>, Brian Frantz<sup>1,3</sup>, Matthew Rimbey<sup>1,3</sup>, Adam Wojno<sup>1,3</sup>, Shendra Passic<sup>1,3</sup>, Jean W. Williams<sup>1,3</sup>, Sonia Shah<sup>1,3</sup>, Brandon Blakey<sup>1,3</sup>, Nirzari Parikh<sup>1,3</sup>, Jeffrey M. Jacobson<sup>1,2,4</sup>, Brian Moldover<sup>5</sup>, Brian Wigdahl<sup>1,3</sup>\*

1 Department of Microbiology and Immunology, Drexel University College of Medicine, Philadelphia, Pennsylvania, United States of America, 2 Department of Medicine, Division of Infectious Diseases and HIV Medicine, Drexel University College of Medicine, Philadelphia, Pennsylvania, United States of America, 3 Center for Molecular Virology and Translational Neuroscience, Institute for Molecular Medicine and Infectious Disease, Drexel University College of Medicine, Philadelphia, Pennsylvania, United States of America, 4 Center for Clinical and Translational Medicine, Institute for Molecular Medicine and Infectious Disease, Drexel University College of Medicine, Philadelphia, Pennsylvania, United States of America, 5 B Tech Consulting, Ltd., Philadelphia, Pennsylvania, United States of America

#### **Abstract**

The adaptation of human immunodeficiency virus type-1 (HIV-1) to an array of physiologic niches is advantaged by the plasticity of the viral genome, encoded proteins, and promoter. CXCR4-utilizing (X4) viruses preferentially, but not universally, infect CD4<sup>+</sup> T cells, generating high levels of virus within activated HIV-1-infected T cells that can be detected in regional lymph nodes and peripheral blood. By comparison, the CCR5-utilizing (R5) viruses have a greater preference for cells of the monocyte-macrophage lineage; however, while R5 viruses also display a propensity to enter and replicate in T cells, they infect a smaller percentage of CD4<sup>+</sup> T cells in comparison to X4 viruses. Additionally, R5 viruses have been associated with viral transmission and CNS disease and are also more prevalent during HIV-1 disease. Specific adaptive changes associated with X4 and R5 viruses were identified in co-linear viral sequences beyond the Env-V3. The in silico position-specific scoring matrix (PSSM) algorithm was used to define distinct groups of X4 and R5 sequences based solely on sequences in Env-V3. Bioinformatic tools were used to identify genetic signatures involving specific protein domains or long terminal repeat (LTR) transcription factor sites within co-linear viral protein R (Vpr), trans-activator of transcription (Tat), or LTR sequences that were preferentially associated with X4 or R5 Env-V3 sequences. A number of differential amino acid and nucleotide changes were identified across the co-linear Vpr, Tat, and LTR sequences, suggesting the presence of specific genetic signatures that preferentially associate with X4 or R5 viruses. Investigation of the genetic relatedness between X4 and R5 viruses utilizing phylogenetic analyses of complete sequences could not be used to definitively and uniquely identify groups of R5 or X4 sequences; in contrast, differences in the genetic diversities between X4 and R5 were readily identified within these co-linear sequences in HIV-1-infected patients.

Citation: Aiamkitsumrit B, Dampier W, Martin-Garcia J, Nonnemacher MR, Pirrone V, et al. (2014) Defining Differential Genetic Signatures in CXCR4- and the CCR5-Utilizing HIV-1 Co-Linear Sequences. PLoS ONE 9(9): e107389. doi:10.1371/journal.pone.0107389

Editor: Fatah Kashanchi, George Mason University, United States of America

Received April 15, 2014; Accepted May 7, 2014; Published September 29, 2014

**Copyright:** © 2014 Aiamkitsumrit et al. This is an open-access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

**Data Availability:** The authors confirm that all data underlying the findings are fully available without restriction. Sequence data are included within the Supporting Information files.

**Funding:** Research within this manuscript has been supported by the National Institute of Neurological Disorders and Stroke, grant number R01 NS32092, www. ninds.nih.gov; the National Institute on Drug Abuse, grant number R01 DA19807, www.drugabuse.gov; the National Institute of Mental Health, grant number P30 MH092177, www.nimh.nih.gov; and the National Institute of Mental Health, grant number T32 MH079785, www.nimh.nih.gov. The funders had no role in the study design, data collection and analysis, decision to publish, or preparation of the manuscript.

Competing Interests: Brian Moldover is President of B-tech consulting. He serves as a paid bioinformatics consultant to Dr. Brian Wigdahl at Drexel University College of Medicine. Other than Brian Moldover there are no paid or unpaid appointments with B-tech consulting. All authors agree to adhere to all the PLOS ONE policies on sharing data and materials.

\* Email: bwigdahl@drexelmed.edu

#### Introduction

The initial step of infection with human immunodeficiency virus type 1 (HIV-1) involves the interaction of the viral envelope glycoprotein, gp120, with the host cellular CD4 receptor, followed by the subsequent interaction with one of the chemokine coreceptors. The two most commonly used co-receptors for viral entry are CXCR4 and CCR5 [1–3]. These steps lead to the glycoprotein 41 (gp41)-mediated fusion process between the viral envelope and the host cell plasma membrane [4]. Current

nomenclature relating to co-receptor utilization during the viral entry process designates CXCR4-utilizing virus as X4 virus, CCR5-utilizing virus as R5 virus, and dual tropic virus that can utilize either co-receptor as X4R5 virus [5,6].

The HIV-1 gp120 V3 (Env-V3) region is the main, though not the sole, determinant of co-receptor usage selection [7–11]. Several studies have focused on the use of the Env-V3 sequence to predict viral tropism. These studies have also provided important information with regard to determining which thera-

peutic strategies would be most effective for treating HIV-1 infection [12]. Using the Env-V3 genotypic sequence in conjunction with computational analysis using *in silico* prediction paradigms has provided an alternative approach to the traditional *in vitro* phenotypic assay for co-receptor usage prediction [13–16]. The position-specific scoring matrix (PSSM) is a Web-based, sequence-based predictive algorithm that is highly accurate and widely used to predict co-receptor usage [17–20]. PSSM scores an Env-V3 sequence with respect to known X4 Env-V3 residues at each amino acid calculated such that the scoring distributions between X4 and R5 sequences are significantly different [17,21].

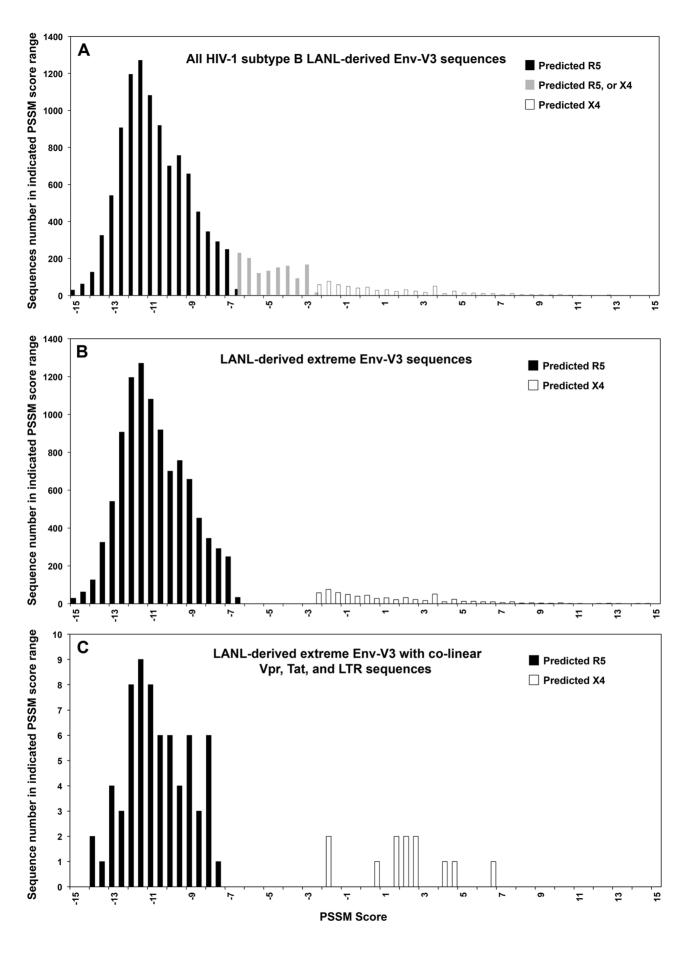
HIV-1 X4 and R5 gp120 engagement of receptor/co-receptors on CD4<sup>+</sup> T cells and cells of the monocyte-macrophage lineage has been shown to lead to very different patterns of viral replication and pathogenesis [22,23]. The X4 virus plays an important role in accelerating disease progression because it is able to efficiently infect T cells and produces a large amount of viral progeny, resulting in high viral load and death of the infected cell population, eventually leading to T-cell depletion [24,25]. Conversely, R5 viruses have a greater preference for cells of the monocyte-macrophage lineage; however, R5 viruses also display a propensity to enter and replicate in T cells, although they infect a smaller percentage of CD4+ T cells compared with X4 viruses [26]. The R5 virus is the most prevalent virus detected during transmission, the most abundant in the late stages of disease, and the most commonly encountered virus during the course of HIV-1-associated neurological impairment based on the subsequent trafficking of infected monocytes to the CNS [25-29]. Monocytic cells, including macrophages and brain microglial cells, may also represent an important reservoir for the HIV-1 R5 genotype; this infected cell compartment is less productive, with a lower level of cytopathic effect observed, and the infected cells have a long life span independent of antiretroviral therapy [25,26].

Following viral entry, the two most studied viral proteins involved in trans-activation of HIV-1 gene expression are viral protein R (Vpr) and Tat, which cooperate in a cell type-specific manner [30,31]. A small protein packaged within the virion, Vpr is involved in many aspects of the viral life cycle [32]. Vpr is essential for viral replication in macrophages, cell cycle arrest in multiple cell types, induction of apoptosis, and viral-induced immune suppression [32-37]. Vpr plays a direct role in immediate-early activation of transcription before the accumulation of Tat occurs and has also been shown to interact with cyclin T1, a necessary component of the positive transcription elongation factor-b (P-TEFb) [30]. Vpr proteins from different HIV-1 subtypes exhibit different levels of HIV-1 long terminal repeat (LTR) activation, apoptosis induction, and cell cycle arrest; these differences likely result from specific genetic characteristics within variant Vpr genes [38-40]. Naturally occurring polymorphisms within Vpr enhance the ability of the virus to evade the host immune response [37]. The diversity of Vpr has been reported in a study of patients with long-term, nonprogressing HIV-1 infection [41], and specific sequence alterations within Vpr occur in concert with changes in other genes, such as Vif [42]. Tat, a key viral protein that has been shown to play a role in promoting viral gene expression by cooperating with several cellular factors with respect to LTR activation [43], specifically forms a preinitiation complex with the P-TEFb, to facilitate the initiation and elongation process driven by RNA pol II [44-48]. In addition to its role in LTRdriven trans-activation during viral replication, Tat is involved in monocytic cell infiltration within the brain and causes HIV-1-associated neuropathology by both direct and indirect processes such as directly binding to cell surface receptor low-density lipoprotein receptor-related protein (LRP) [49,50]. Genotypic characteristics of Tat, especially at the dicysteine motif within exon I, are linked with neurocognitive outcome in infected individuals [51]. Similarly, changes in the genetic architecture of HIV-1 Tat correlate with changes in HIV-1 pathogenesis and disease progression, as demonstrated in a study of HIV-1 subtype B-infected twins [52–54]. Greater genetic diversity has been observed in Tat genes from viruses present in the brains of individuals who died with severe neurocognitive impairment as compared with individuals who died with virus present in the brain but without measureable neurocognitive impairment [55–57].

Regulation of HIV-1 gene expression centers on the activity of the LTR in conjunction with both host cell transcriptional machinery and several viral factors [31,58]. The LTR is composed of numerous transcription binding sites, and studies have shown that the prevalence of selected single-nucleotide polymorphisms (SNPs) within specific transcription factor binding sites of the HIV-1 LTR are commonly encountered during late-stage HIV-1 disease [59], invasion of the CNS [60], within specific tissues and compartments [61,62], and in selected cell types [63,64]. Therefore, genetic variation within Vpr, Tat, and LTR could play an important role in regulating viral replication in a cell- and tissue-specific manner and may correlate with changes in HIV-1 pathogenesis and disease severity.

Viral genetic variation, along with a spectrum of host selective pressures, contributes to the development of distinct viral genotypes and the unique viral "swarm," or spectrum of quasispecies, that develops during the course of disease in a given patient [65]. During viral transmission and very early infection, the R5 virus has been thought to be more prevalent in the peripheral blood in comparison with the X4 virus, partly because predominantly R5 infectious molecular clones are generated at this time [29,66-71]. The R5 founder clone(s) remain through the initial selective pressures in a vast majority of infected individuals, and the surviving viral swarms that evolve exhibit genotypic/ phenotypic properties representing varying levels of R5, X4, and dual tropic viral quasispecies; the predominant species depends on the stage and severity of HIV-1 disease [28,29,72-75]. Viral genetic diversity correlating with the duration of infection, host factors, and status of antiretroviral therapy [29,76-78] can be identified at any point during the course of disease. This is perhaps best documented in the envelope glycoprotein; diversity is most readily apparent in the variable domains of HIV-1 gp120, and additional variable and constant regions are present across the entire HIV-1 genome [78]. Greater viral genetic diversity can be observed during the first year of infection, which is characterized by high-level viremia in the absence of antiretroviral treatment, as compared with that observed during the chronic stage in patients undergoing therapy [77,78].

In this study, HIV-1 X4- and R5-specific Env-V3 genetic signatures were identified by characterizing HIV-1 sequences derived from the Los Alamos National Laboratory (LANL) database and the Drexel University College of Medicine HIV/AIDS Genetic Analysis Cohort in Philadelphia, PA, using the coreceptor prediction capabilities of the PSSM algorithm. Based on these results, bioinformatics tools were used to examine co-linear



**Figure 1. Quantitative PSSM score analysis of LANL-derived Env-V3 sequences. (A)** A total of 11,866 HIV-1 subtype B Env-V3 sequences with a complete 35-amino-acid sequence were retrieved from the LANL database. PSSM scores were obtained and results were plotted. Black columns represent predicted R5 viral sequences; white columns represent predicted X4 viral sequences; and gray columns represent an area of mixture of Env-V3 sequences, which were predicted as either X4 or R5. **(B)** A total of 10,600 Env-V3 sequences that contained 35-amino-acid residues with PSSM scores below -6.96 and therefore classified as R5 (black column) with scores above -2.88 classified as X4 (white column). The gray column area was eliminated from the subsequent analysis. **(C)** Only the final 79 LANL-derived Env-V3 sequences were included in this study. Of these, 67 sequences were predicted to utilize CRR5, while 12 sequences were predicted to be CXCR4 utilizing. The frequencies of PSSM scores were analyzed and the distributions were compared between the two groups.

Vpr and Tat amino acid residues, and LTR nucleic acid sequences to identify X4- and R5-specific signature sequences in the Vpr, Tat, and LTR. These studies demonstrated the presence of specific nucleotide and amino acid residues within Vpr, Tat, and LTR that differentially define regions consistent with CXCR4 and CCR5 co-receptor usage as defined by PSSM scoring of co-linear Env-V3 sequences. The findings suggest the presence of specific co-evolved X4 and R5 sequences beyond the Env-V3 region of the viral genome.

#### Results

### Use of PSSM to identify X4 and R5 Env-V3 sequence groups from the LANL database

HIV-1 subtype B Env-V3 sequences were retrieved from the Los Alamos National Laboratory (LANL) database deposited in the repository as of September 1, 2012. This returned a total of 83,479 sequences that were further filtered for those coming from independent patients (14,078 sequences) and those that had the entire 35-amino-acid residues of the V3 sequence (11,866 sequences).

Using the PSSM scoring algorithm, which includes consideration of the 11/15 rule, overall charge density, sequence relatedness, and functional properties compared with sequences from known X4 and R5 envelope genes, predicted tropism was determined using cutoffs of >-2.88 and <-6.96 for X4 and R5, respectively [21]. This approach resulted in the exclusion from the next phase of the analyses of 1266 Env-V3 sequences that had scores between these cutoffs or percentile scores >0.95 [21]. These cutoffs allowed for the genetic analysis to focus on sequences with the most extreme values of the PSSM-derived distribution. The Gaussian-like distribution of this LANL Env-V3 sequence subset with respect to PSSM scores is shown in Figure 1A and B.

To define the nature of the Vpr, Tat, and LTR sequences associated with X4 and R5 viruses as determined by the PSSM algorithm using the Env-V3 sequences, we proceeded to include in the analysis only those LANL Env-V3 sequences that also included a complete set of co-linear Vpr, Tat, and LTR sequences. These selection criteria allowed for inclusion of only 79 of the initial 83,479 LANL-derived Env-V3 sequences (67 R5 and 12 X4). The PSSM scoring results were then compared between these two groups (predicted-X4 and predicted-R5 sequences) (Figure 1C).

### Use of PSSM to establish DM groups of X4 and R5 Env-V3 sequences

To examine the prevalence of the X4 and R5 viruses across the DM cohort, we used the Web-based *in silico* PSSM prediction tools. Using the same PSSM scoring algorithm, the frequency distribution across the DM cohort with currently available Env-V3, Vpr, Tat, and LTR co-linear sequences was determined and subsequently compared between predicted-X4 and predicted-R5 viral sequences (Figure 2A) using the same cutoffs as described in the analysis of the LANL sequences (Figure 1). This analysis identified 20 Env-V3 sequences as R5 and four as X4 (Figure 2B),

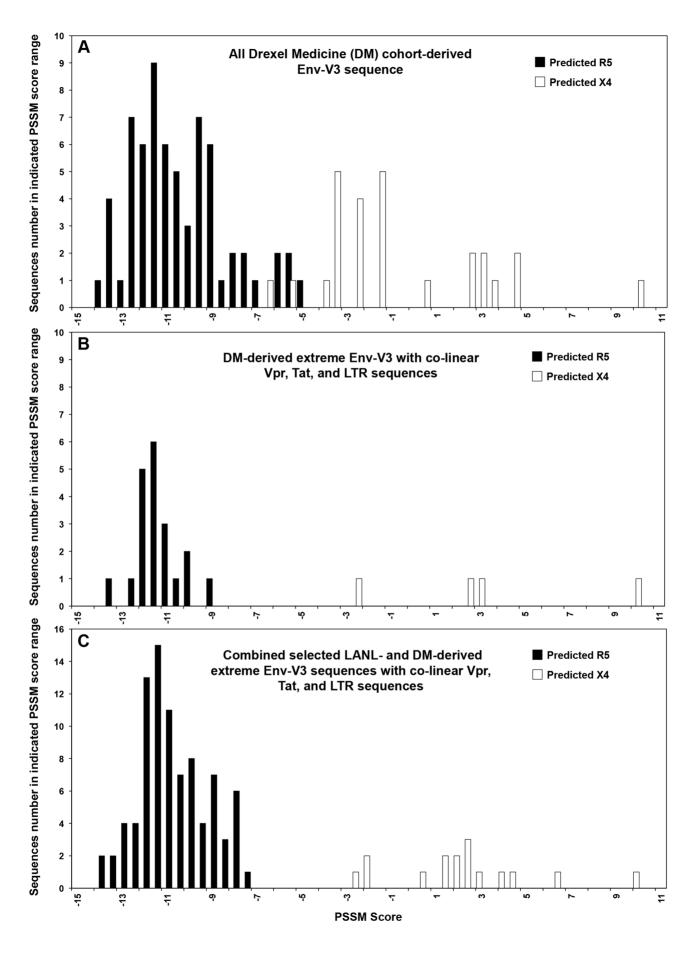
localized to the most negative and positive ends of the spectrums, respectively, as previously observed with the available co-linear LANL sequences (Figure 1C).

These sequences were subsequently combined with the 79 LANL sequences previously identified (Figure 1C) and the PSSM score distribution was reexamined to ensure the separation of the X4 and R5 score distribution. The resulting determination of Env-V3 X4 and R5 virus sequences (Figure 2C) was similar between the two databases. Within the combined LANL and DM PSSM analysis, 16 X4 sequences were separated from the 87 R5 sequences, indicating that two exclusive phenotypes could be identified from the genotypes obtained from the LANL and DM sequence sources. Given these results, only these selected 103 patient samples were utilized in all subsequent studies.

### Identification of differential residues by comparing colinear Vpr, Tat, and LTR sequences associated with distinct groups of X4 and R5 sequences classified by PSSM

Co-receptor switching is common in HIV-1 subtype B infection, and whether a virus is X4 or R5 correlates with differences in HIV-1-associated pathogenesis [6,79]. Selected genotypes have been investigated to determine the associated viral phenotype including the amino acid composition within Env-V3, which is widely used in co-receptor prediction [17,19,21,80,81]. Viral regulatory sequences and genes other than the envelope may also play a role in defining the distinctive viral phenotypes and their roles in pathogenesis and disease severity. A number of SNPs identified within patient peripheral blood mononuclear cell (PBMC)-derived HIV-1 LTRs are associated with disease severity [59,82], possibly as a result of alterations in LTR activity and subsequent viral replication, which could contribute to specific patterns of HIV-1-associated pathogenesis. Vpr plays an important role in infection of macrophages and in cell cycle arrest by interaction with other viral genes such as matrix (MA) or the LTR regulatory sequences [83,84]. Studies have also shown a correlation between Tat genotypes and HIV-1 pathogenesis [37,54,85]. Therefore, researchers have hypothesized that X4 and R5 viruses contain specific genetic variation(s) that accumulate within the viral quasispecies based on the combined effect of reverse transcription infidelity and different selective pressures that occur during the course of HIV-1 disease. Consequently, some workers have theorized that defined genetic changes exist across the viral genome during transition between the X4 and R5 genotypes, which may occur in a co-evolved manner based on physiologic, immunologic, therapeutic, and compartmentalized selective pressures. In order to investigate this hypothesis, the LTR and the viral genes Vpr and Tat derived from the same group of patients used to study the Env-V3 genotype/phenotype, were examined in greater

Using the sequence collection described above, a cross-sectional analysis of all combined LANL and DM sequences was performed. This analysis revealed differential amino acid residue changes within Vpr and Tat between X4 and R5 sequences, as defined by



**Figure 2. Quantitative PSSM score analysis of Drexel Medicine (DM)-derived Env-V3 sequences. (A)** A total of 92 PSSM scores were classified into two groups based on their co-receptor usage predictions, R5 (black column) or X4 (white column). **(B)** Twenty-four sequences were selected based on the predetermined PSSM score cut off values and elimination of redundant patient sequences. The frequency of each score value was analyzed and the distributions were compared between the X4- and the R5-predicted groups. **(C)** DM-derived sequences (24), along with LANL-derived sequences (79), were quantitated for the frequency distribution of PSSM score values. The analysis predicted 16 X4-utilizing sequences (white column), which exhibited high PSSM scores and were located separately from a group of 87 sequences predicted to be R5 (black column), according to their PSSM score values.

doi:10.1371/journal.pone.0107389.g002

PSSM analysis of the Env-V3 sequence, and differential nucleotide changes within the LTR sequences, as shown in Figure 3A. Considering all variants identified within Vpr, Tat, and the LTR, the overall percentages identified for each variant were exclusively higher in the R5 sequence group than in the X4 group (Figure 3B).

### Phylogenetic relationship between the X4 and R5 sequences

The genetic relationship of the predicted HIV-1 X4 and R5 viruses, as defined by the PSSM algorithm, was investigated by using phylogenetic tree construction evaluating the amino acid residues of the Env-V3 sequences (Figure 4). Ten X4 sequences exhibited a tight clustering displaying a high degree of relatedness within one subbranch, currently designated as X4-ML (maximum likelihood)<sup>HI</sup>. An additional three X4 sequences clustered with four R5 sequences within a closely related subbranch and exhibited a moderate degree of relatedness compared with the neighboring tightly clustered X4 branch (designated as X4-MLMED). These two groups of X4 sequences likely shared some common sequence elements of the X4 Env-V3 genetic structure, while being somewhat more distant in relatedness compared with the other three X4 sequences, which were distributed into other subbranches dominated by the presence of R5 sequences (designated as X4-ML<sup>LO</sup> and exhibiting a very low degree of relatedness in comparison with all other X4 sequences examined, and located on another major node of the phylogenetic tree). In contrast to the R5 sequences located on this major node, another large cluster of 28 R5 sequences was located on the same major branch as the X4-ML<sup>HI</sup> and X4-ML<sup>MED</sup> groups, indicating that this group of R5 sequences exhibited some level of similarity to the X4 Env-V3 genotype.

However, in contrast to the X4 and R5 segregation pattern observed within the Env-V3 phylogenetic tree, a similar pattern of segregation between X4 and R5 Vpr, Tat, and LTR sequences could not be identified (Figure 4). In this regard, phylogenetic tree analysis of Vpr, Tat, and LTR sequences indicated that the sequences within the X4-ML<sup>HI</sup>, X4-ML<sup>MED</sup>, and X4-ML<sup>LO</sup> Env-V3 groups did not remain clustered together or even grouped within closely connected branches as they did within the Env-V3 tree. Instead, they were generally dispersed across the tree, with X4 sequences present in almost every major Vpr, Tat, or LTR branch along with one or more R5 sequence(s). However, in each case at least one subbranch exclusively contained Vpr, Tat, or LTR R5 sequences (as determined by PSSM scoring of the Env-V3 sequence), suggesting that at least some of the Vpr, Tat, or LTR sequences retained some degree of structural difference between X4 and R5 sequences as originally defined by the Env-V3 sequence.

## Genetic characteristics of Env-V3, Vpr, Tat, and LTR of PSSM-categorized X4 and R5 groups can best be defined by genetic diversity

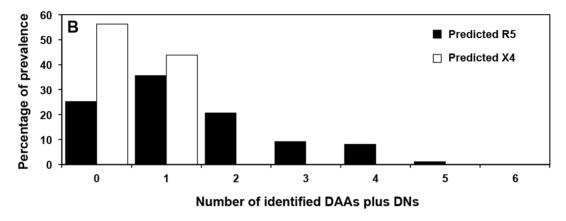
General inspection of the Env-V3 phylogenetic tree (Figure 4) indicated that the X4 sequences always exhibited the largest genetic distance in the sequence branch in which they resided, and the genetic distances of X4 sequences in a given branch were much larger than most but not all the R5 sequences in the branch. Furthermore, more than 80% of the R5 sequences exhibited genetic distances smaller than the smallest X4 genetic distance. Consequently, the level of genetic diversity, which has been determined by the mean genetic distance (MGD), was subsequently investigated to identify the development and/or maintenance of X4 and/or R5 sequence signatures in the Vpr, Tat, and/or LTR sequences.

A total of 103 Env-V3 sequences were classified into two groups, X4 and R5, and the MGD of the Env-V3 of each group was then identified. After visual inspection of the trees, it was not surprising that the Env-V3 MGD of the X4 group exhibited a greater value than that of the R5 group (0.452 vs 0.192, Table 1). A statistically significant difference was determined by either two-tailed student t-test (P=1.33e-45) or the corrected P value of 1.13e-21 (Table 2). We determined the MGDs of the Vpr, Tat, and LTR sequences in a similar manner; however, the corrected P values shown in Table 1 and 2 indicated no significant differences between the X4 and R5 groups of Vpr, Tat, or LTR sequences.

# Combined use of genetic relatedness and genetic distance in characterizing the X4- and R5-utilizing virus genetic patterns from the co-linear Vpr, Tat, and LTR sequences

In the next phase of investigation, it was of interest to determine whether a co-evolved genetic pattern could be identified across the Env-V3 sequence and the co-linear Vpr, Tat, and/or LTR sequences between the X4 and R5 sequences that were selected for the analyses based on the extreme nature of their quantitative score obtained using the PSSM algorithm. As a first step, the X4 sequences that were previously designated as X4-ML<sup>MED</sup> and X4-ML<sup>LO</sup>, were eliminated from further analyses, leaving only 10 X4-MLHI sequences and 87 R5 sequences (Figure 5, panel 1). Subsequently, stepwise elimination of any R5 sequences located on the same branch with the X4-ML<sup>HI</sup> on Env-V3 tree (Figure 4) was performed (Figure 5, panels 2 and 3), in order to achieve only two clearly distinctive branches of solely X4 and solely R5 Env-V3 sequences (Figure 5, panel 4). At each successive step (panels 1-4), phylogenetic trees of Vpr, Tat, and LTR were constructed simultaneously. Using this strategy, it was observed that, even though only 10 X4-MLHI sequences were included in the analyses, a clustering pattern of only X4 Vpr, Tat, or LTR sequences was not observed in any of the other trees, unlike the result obtained with the Env-V3 trees. Specifically, applying both the principles of relatedness and genetic distance in the elimination process, two distal segregated groups of X4 and R5 sequences were observed on the Env-V3 tree, showing a group of X4 containing nine

Α .			Perce	entage	P value
Gene	Position	Change to	Х4	R5	(Fisher's exact test)
Vpr	Q86	R	0	17.2	0.119
Tat	K19	R	6.3	35.6	0.020
	T15	С	6.3	25.3	0.112
LTR	T109	С	31.3	42.4	0.58
	G257	Α	0	18.4	0.07



**Figure 3. X4/R5 differential mutations observed across the HIV-1 sequences. (A)** Specific differential amino acids (DAAs) that were preferentially present in X4 vs R5 sequences within Vpr or Tat, as well as the differential nucleotides (DNs) found within X4 vs R5 LTR sequences were determined, and the percentage of differential residues present were calculated and compared between the X4 and the R5 groups, utilizing Fisher's exact test. For each comparison, the Z-score was determined with a 95% confidence interval. **(B)** The total observed variants, which included both DAAs and DNs from Vpr, Tat, and LTR, were determined and the frequency and their distributions are presented, comparing the X4 (white column) and the R5 (black column) sequences. The X4 group was composed of 16 sequences and the R5 group consisted of 87 sequences. doi:10.1371/journal.pone.0107389.q003

sequences displaying large genetic distances and a group of R5 containing nine sequences with very short genetic distances (Figure 5, panel 4). A clear distinction between these two groups was still not observed on any of the other trees (Vpr, Tat, or LTR), indicating that the properties of relatedness and genetic distance across entire sequences derived from Vpr, Tat, or LTR could not be applied to identify specific genetic signatures between X4 and R5 viruses identified by sequences within Env-V3.

Given that the size of the Env-V3 sequence is only 35 out of over 500 amino acid residues within gp120, yet the sequence serves as a major determinant for co-receptor usage [1,2,86] (Figure 4), it was of interest to determine whether the X4 and R5 Env-V3 groups would also be identifiable in a phylogenetic tree analysis of full-length gp120 (where Vpr, Tat, and LTR did not, as shown in Figure 5). To examine this possibility, it was shown that a phylogenetic tree constructed based on all full-length gp120 sequences (n = 11,010) derived from LANL, demonstrated a random distribution of R5 (n = 10,477) and X4 (n = 533)sequences (Figure 6), in contrast to the segregation pattern established by Env-V3 sequences (Figures 4 and 5). Based on this analysis, it is possible that only specific domains or regions such as the Env-V3, rather than the entire HIV-1 gp120, Vpr, Tat, and/ or LTR, play a major role in delineation of specific genotypic/ phenotypic characteristics associated with X4 and R5 viruses; this process is likely operational in Vpr, Tat, and LTR as well.

### Identification of specific X4 and R5 genetic signatures within small domains/regions of Vpr, Tat, and LTR

Based on the observation that a small segment of sequence (the Env-V3 domain and not the full-length gp120) could be used to genetically distinguish X4 from R5 sequences, we focused next on using previously characterized functional domains of Vpr, Tat, and the LTR to identify specific genetic signature(s) beyond the Env-V3 sequence that would be differential between X4 and R5 viral sequences (as defined by PSSM scoring).

Studies have demonstrated that Vpr can be subdivided into eight domains [83]; full-length Tat into six domains [85]; and the LTR into nine or more regions based on transcription factor binding sites [31]. All of these domains were identified within multiple alignments and processed through the same differential X4 vs R5 phylogenetic analysis that was previously used with the Env-V3 domain (Figures 4 and 5) in order to define similar differential X4 and R5 domains in Vpr, Tat, and/or LTR (Figures 7, 8, and 9, respectively).

We observed no clear segregation pattern between the X4 and R5 sequence groups with any of the Vpr domain trees (Figure 7); however, two of the eight regions of Vpr showed much lesser differences in genetic diversity between the two groups of sequences (Figure 7). Specifically, the X4 sequence group displayed significantly lower MGD values for both the G2 arrest and DNA binding domains in the C-terminal end of the protein. The overall difference in conservation suggests that these two regions of Vpr may be more critical to X4 than to R5 replication.

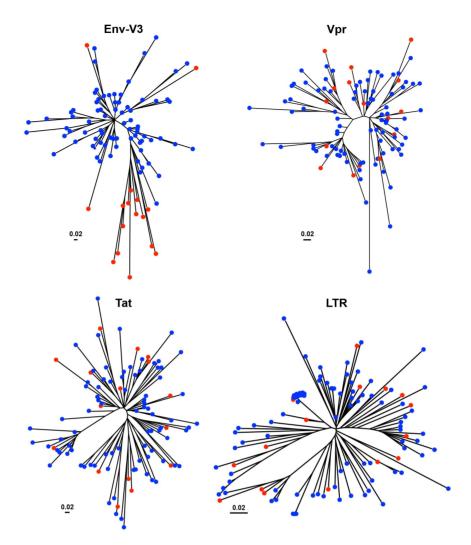


Figure 4. Inferred neighbor-joining phylogenetic tree of HIV-1 Env-V3 sequences derived from LANL and Drexel Medicine (DM). The phylogenetic trees of Env-V3, Vpr, Tat, and LTR sequences were inferred by utilizing the maximum-likelihood method using the JTT with frequency model. The trees with the highest log likelihood are shown. A total of LTR sequences were applied in an evolution tree construction, which was based on the maximum-likelihood accompanied with data-specific model, and the highest log likelihood is presented. Initial tree(s) for the heuristic search were obtained automatically as follows. The trees were drawn to scale, with branch lengths measured in the number of substitutions per site. Tree analysis was conducted in MEGA5 and based on a total of 103 sequences in each tree. The predicted X4 sequences are indicated with red circles, and the blue circles represent the predicted R5 sequence. doi:10.1371/journal.pone.0107389.q004

The Tat protein was subdivided into 15 structural regions. Of these 15 regions, the MGD of the six different Tat structural regions exhibited significant differences between X4 and R5 sequences (Figure 8). The three most significant P values derived from the comparative analyses of X4 and R5 sequences spanning the entire exon II, the nuclear factor of activated T-cell (NFAT) binding domain, and the core domain. The MGD of the R5 Tat sequences was significantly lower than that of X4 sequences with respect to analysis of the complete exon II. In contrast, the X4 sequences revealed lower MGD values for the NFAT binding domain and the core domain when compared with the R5 sequences (Figure 8). The other nine structural regions of Tat did not exhibit any significant difference between the MGD values of the X4 and the R5 viral sequences, suggesting a comparable level of conservation between these two viral phenotypes across a majority of the viral trans-activator protein. The R5 sequence group maintained a higher level of conservation in exon II, and

the X4 sequence group maintained a higher degree of conservation in the NFAT binding and core domains.

With respect to the HIV-1 LTR, four functional regions, identified as the U3, R, AP1-COUP (chicken ovalbumin upstream promoter), and TAR (trans-activation response) regions, showed significant MGD differences between the X4 and R5 sequences, while another five regions maintained comparable levels of conservation with similar MGD values between the two groups of viral sequences (Figure 9). Interestingly, all four regions that displayed significant differences between the X4 and R5 sequences had lower MGD values with respect to R5 as compared with X4 viral sequences, indicating more genetic conservation within the LTR of the R5 virus (Figure 9).

The LTR plays a critical role in driving HIV-1 gene expression during the course of viral infection, and much is known with respect to the functional domains of the viral promoter as compared to any of the nine viral genes. Thus it was of great interest to determine whether more discrete LTR binding sites or

**Table 1.** The mean genetic distance (MGD) of Env-V3, Vpr, LTR, and Tat of the X4 and R5 groups.

Group	No. of sample	No. of PSSM range sample (min-max)	PSSM median	Env-V3		Vpr		LTR		Tat	
				Internal MGD Internal SD	Internal SD	Internal MGD Internal SD	Internal SD	Internal MGD Internal SD	Internal SD	Internal MGD Internal SD	Internal SD
X4	16	-2.9 to 9.68	2	0.452	0.185	0.109	0.043	0.072	0.043	0.204	0.081
RS	87	-14.42 to -7.52 -11	-11	0.192	0.082	0.119	0.052	0.066	0.039	0.201	690'0
The MGD of Er	ac valv sva	The MGD of Env.//2 Var and Tat was determined from majorise dist	Majed most be	o o o o o o o o o o o o o o o o o o o	potor pago sosyleae	Pance analytics conducted using the IT matrix based model. The ITD diversance was determined using the maximum comments likelihood model. The	Li od Thou	ob sew opacopionib dr	torming the	waximim composito	Joan boodilovii

conducted in MEGA5. were and sednences 103 involved evolutionary analyses ₹ 6 П parameter variation among sites for both models was reproduced with a gamma distribution (shape doi:10.1371/journal.pone.0107389.t001 sequence regions also showed differential properties between X4 and R5 viral sequences as defined by PSSM scoring of the Env-V3 sequence. To this end, the LTR, were subdivided especially within the U3 region, into smaller domains based on the presence of known transcription binding sites, the presence of intervening sequences between other well-characterized binding sites, or combinations of adjacent well-characterized binding sites [31]. Twenty-one of the 38 smaller domains of the LTR explored in this analysis exhibited statistically significant MGD differences between the X4 and the R5 viral sequences (Figure 10A). The most significant differential X4 vs R5 P value was 2.8024e-5, identified for the sequence representing the Sp binding site I (Sp I), with the X4 Sp I displaying a much lower MGD as compared to that of the R5: 0.0000±0.0000 (this value indicates identical sequences) vs 0.2500±0.2958, respectively. Sp binding site II was also shown to be significantly different between the X4 and R5 groups. Given this, further analysis was performed to determine if the difference seen in sequence variation resulted in an altered binding phenotype. This was determined by utilizing the JASPER weight matrix score and comparing the results for each Sp binding between the X4 and R5 groups. This resulted in the observation that all three Sp binding sites exhibited an significantly altered predicted binding phenotype (Figure 10B). The R5 viral sequences, conversely, revealed less genetic diversity in the nuclear factor- $\kappa B \text{ (NF-}\kappa B) \text{ binding site I } (0.1111\pm0.2079 \text{ vs } 0.6575\pm1.2411),$ and NF- $\kappa$ B II sequences  $(0.0000\pm0.0000 \text{ vs } 0.3945\pm0.7446)$  as compared with the X4 sequence group (Figure 10A). A lower MGD was also identified within the X4 C/EBP binding site I (C/ EBP I) as compared with the R5 C/EBP I (P = 0.0024)(Figure 10A). Another LTR binding site of interest was C/EBP site II (C/EBP II), because reports have identified this site along with C/EBP I to be important for viral replication in cells of the monocyte-macrophage lineage [59,60,63,87,88]. The X4 C/EBP II had a lower MGD than that of the comparable R5 viral sequence  $(0.0624\pm0.0733 \text{ vs } 0.1386\pm0.0759); P = 0.0007. \text{ Other}$ specific X4 LTR binding sites examined that exhibited significantly lower MGDs than the corresponding R5 sequence included ATF/CREB (cAMP response element-binding protein/activating transcription factor) (0.0159 vs 0.0682, p = 0.0022), Lef-1 and ATF/CREB (0.0247 vs 0.0498, p = 0.0021), glucocorticoid response element (GRE) (0.0617 vs 0.0987, p = 0.0030), and AP-1 III (0.0016 vs 0.0479, p = 0.0071). In contrast, other specific R5 LTR binding sites examined that exhibited a significantly lower MGD than the corresponding X4 sequence included ETS-1 (0.0159 vs 0.0682 vs, p = 0.0022); the region between AP-1 and C/ EBP II (0.0692 vs 0.0827, p = 0.0144); AP-1 I (0.1231 vs 0.1795,p = 0.0048); the region between AP-1 II and GRE (0.0445 vs 0.0627, p = 0.0059; AP-1 II (0.0113 vs 0.0651, p = 0.0008); COUP III (0.0235 vs 0.0409, p = 0.0305); the COUP region (0.0142 vs 0.0199, p = 0.0275); and pre-COUP, upstream half (0.0308 vs 0.0445, p = 0.0048). These studies clearly demonstrate that a number of previously identified LTR transcription factor binding sites that have been specifically identified as important for driving gene expression in T cells (NF-κB) and cells of the monocyte-macrophage lineage (C/EBP) also exhibit strikingly different levels of genetic diversity between the same binding sites present in LTRs derived from X4 and R5 viruses. Some sites are more conserved in X4 viruses (pre-Sp I downstream half, pre-Sp I, Sp I, Sp II, C/EBP I, ATF/CREB, Lef-1 to ATF/CREB, C/EBP II, and ATF/CREB, GRE, and AP-1 III) and some are more conserved in R5 viruses (NF-κB I, NF-κB I and II, NF-κB II, ETS-1, region between AP-1 and C/EBP II, AP-1 I, between AP-1 II and GRE, AP-1 II, COUP III, COUP region, and pre-COUP upstream half). In contrast, a number of LTR binding sites

Table 2. Comparison of the Env-V3, Vpr, LTR, and Tat MGD between the X4 and R5 populations.

Group comparison	P value			
	Env-V3	Vpr	LTR	Tat
X4/R5 <sup>1</sup>	1.33E-45	0.0001401	0.083825	0.518572
Subset <sup>2</sup>	1.13E-21	0.255	0.398	0.519

MGD of each sequence from the two groups was compared by 2-tailed student t-test<sup>1</sup> and the corrected P value, which was determined by a two-tailed t-test using 1000 random iterations, selecting 8 of 16 X4 sequences and 8 of 87 R5 sequences.<sup>2</sup> The variances between two groups were tested with the F-test; P<0.05 was considered as unequal variance comparison.

doi:10.1371/journal.pone.0107389.t002

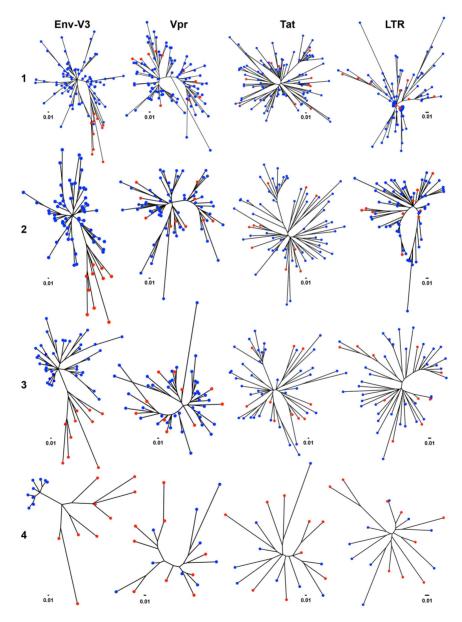
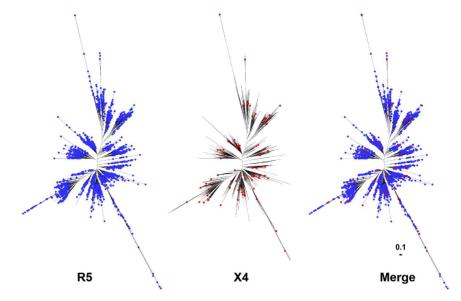


Figure 5. Serial phylogenetic tree constructions of HIV-1 Env-V3, Vpr, Tat, and LTR sequences. Sequences were derived from Drexel Medicine (DM) and LANL. The phylogenetic trees of Env-V3, Vpr, Tat, and LTR sequences were constructed based on a total of 103 combined sequences derived from both LANL and DM, utilizing MEGA5 software. Initially, all comparisons were determined with a total of 87 R5 and only 10 X4 that exhibited a high maximum likelihood (ML<sup>HI</sup>) (panel 1); subsequent trees were constructed based on a total of 10 ML<sup>HI</sup> X4 viruses, and numbers of R5 sequences available after certain criteria of elimination (panels 2–4). The blue circles represent the predicted R5 and the red circles the predicted X4 virus.

doi:10.1371/journal.pone.0107389.g005



**Figure 6. Comparative analysis of full-length X4 and R5 HIV-1 gp120 phylogenetic trees.** A total of 11,010 full-length gp120s derived from LANL and the co-receptor usage was analyzed using the PSSM algorithm, giving 10,477 of R5 (blue circles) and 533 of X4 sequences (red circles). The phylogenetic tree is subsequently constructed using the maximum-likelihood method. doi:10.1371/journal.pone.0107389.q006

displayed similar levels of diversity or conservation between X4 and R5 viruses (Figure 10A). Overall, these results are consistent with the results shown for Vpr and Tat in that specific domains/regions showed strikingly different levels of genetic diversity between Vpr and Tat sequences derived from X4 and R5 viruses.

#### **Discussion/Conclusions**

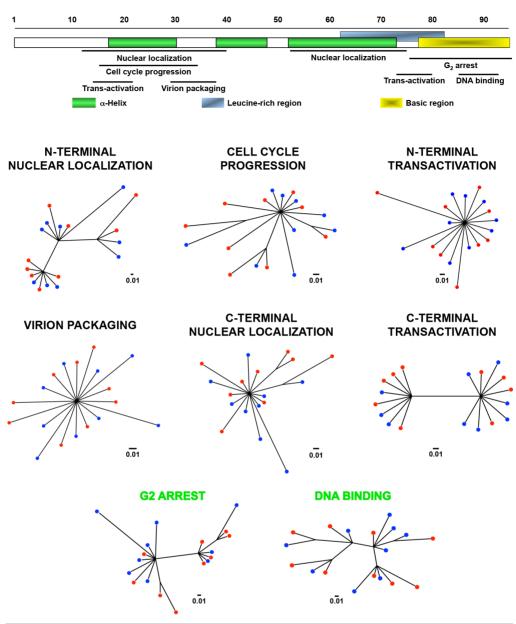
The evolution of HIV-1 is driven by the adaptation of the viral genotype and/or phenotype in response to selective pressures during the course of disease. A high degree of genetic diversity benefits the virus in many possible ways, enhancing viral persistence, immune evasion, drug resistance, replication potency, and the infectivity of a specific quasispecies [6,79,89–94]. We show here that the adaptation of virus to the human host, based on a specific set of changes, coordinated with the Env-V3 sequence and leads to alterations in patterns predictive of viral entry phenotype as well as other changes in select regions across the viral genome (Vpr, Tat, LTR, and likely other regions) that may result in other changes in the replication capability of the virus.

HIV-1 sequences containing the Env-V3 sequences were utilized from both the LANL and Drexel databases, representing subtype B genetic diversity from many areas of the United States and from the Philadelphia area, respectively. The two major viral genotypes/phenotypes, designated as X4 and R5, were identified using three different in silico prediction methods in order to validate the consistency in the co-receptor usage predictions. After performing comparative analyses (data not shown), the PSSM algorithm was chosen for use in these studies because it had the capability to define two distinct groups (X4 and R5) of Env-V3 sequences from both the LANL and Drexel databases (and yielded prediction profiles similar to Geno2Pheno and the 11/25 rule, as described in Materials and Methods). Furthermore, X4 and R5 Env-V3 sequence groups could be identified with corresponding co-linear Vpr, Tat, and LTR sequences (Figure 2C) in order to facilitate studies to determine whether viral sequences from areas of the genome outside of the Env-V3 (in this study Vpr, Tat, and LTR) would also maintain genetic architecture that would associate with co-linear sequences present in the X4 or R5 Env-V3

While it has been documented that the infidelity of HIV-1 reverse transcriptase induces a random distribution of genetic diversity, specific genetic changes persist in the viral quasispecies due to selective pressures placed on the virus during the course of disease. A steady-state environment within the host enables the best-adapted virus to dominate the quasispecies; subsequent random mutations become less prevalent over time. Conversely, an unstable host environment could result in viral adaptation in response to changing physiologic pressures that could ultimately lead to the emergence of new genotypes, one of which could become predominant given a continuation of the new physiological environment [89–92]. The interaction between the host and the virus involves several processes, including a dynamic host immune response and viral processes such as co-receptor usage switching [6,79,91,93,94].

In this study, specific genetic differences between the R5 and X4 viral genotypes beyond the Env-V3 sequence were identified with numerous specific differential amino acid changes between Vpr and Tat as well as differential nucleotide changes within the LTR that were observed primarily within the R5 sequences (Figure 3), and different patterns of genetic diversity within Vpr, Tat, and the LTR (Figure 7–10). This information represents the first extensive report defining the differences between X4 and R5 viral sequences, as defined by PSSM scoring of the Env-V3 sequence, across the Vpr, Tat, and LTR sequences. These studies pave the way for a detailed understanding of the X4 and R5 genotypes and their phenotypic properties required for efficient infection of CD4<sup>+</sup> T cells, cells of the monocyte-macrophage lineage, and other cells targeted by HIV-1.

HIV-1 Vpr acts as a *trans*-activator and plays an important role in macrophage infection [32,37,95,96]. Several natural polymorphisms of Vpr have been reported [37], with changes occurring across the entire Vpr amino acid sequence; however, no studies have reported changes that would correlate directly with the coreceptor utilization of virus. The studies reported here show that the specific amino acid change (Q86R) occurs within the C-



Vpr domain	Starting	Stop	P value	R	5	X	4
vpi domani	position	position	Value	MGD	SD	MGD	SD
N-terminal nuclear localization	11	40	0.2958	0.0691	0.0397	0.0800	0.0337
Cell cycle progression	15	35	0.4689	0.0662	0.0340	0.0720	0.0333
N-terminal transactivation	14	22	0.2909	0.0845	0.1092	0.1208	0.1259
Virion Packaging	29	40	0.2354	0.0954	0.0323	0.0840	0.0332
C-terminal nuclear localizations	54	75	0.5555	0.0723	0.0519	0.0671	0.0315
C-terminal transactivation	74	81	0.5937	1.4795	1.4999	1.6216	1.4951
G2 arrest	75	95	0.0033	0.1448	0.0652	0.0938	0.0524
DNA binding	85	93	0.0029	0.2148	0.1866	0.0983	0.0640

p-value < 0.05

**Figure 7. Phylogenetic trees and MGD comparisons of domains of Vpr between selected X4 and R5 sequences.** A total 8 domains of Vpr were selected based on the known functional property region. Phylogenetic trees were created from a total 18 sequences, which were included 9 sequence of X4 and 9 sequences of R5, based on maximum likelihood algorithm. A simply Python automated the process of generating the hundreds of trees, and each branch distance was calculated between all pairs of X4 and R5 sequences. These groups of distances were tested for a significant difference using a two-tailed student t-test. The MGD, SD and *P* value of each group are shown. The two most significant comparisons were shown in green while the two least significant ones revealed in purple. doi:10.1371/journal.pone.0107389.g007

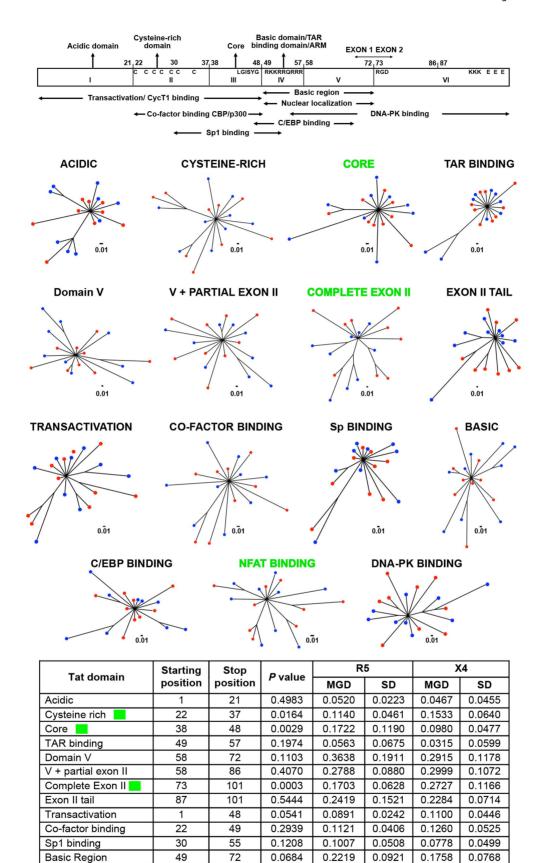
terminal region of Vpr associated with R5 virus as compared with X4 (Figure 3). The C-terminal domain is composed of multiple arginine and serine residues and plays a critical role in G<sub>2</sub> arrest and DNA binding. The Q86R change, which may affect protein structure and/or function of Vpr, could potentially be selected for within R5 Vpr to support viral infection within a specific cell type, such as cells of the monocyte-macrophage lineage. However, the overall level of conservation within the G<sub>2</sub> arrest and DNA binding domains was significantly greater in the X4 than in the R5 group, suggesting a greater importance of these domains to X4 replication in human host cell populations, such as activated CD4<sup>+</sup> T-cell populations.

Tat is a regulatory protein that can bind directly to the LTR TAR RNA, leading to activation of viral gene expression [82,85]. Because the X4 virus preferentially infects T cells, resulting in highly productive infection, Tat likely plays a significant role in this cellular phenotype with respect to a high level of gene expression. In this regard, Tat has been shown to be capable of direct binding to other cellular factors, such as NFAT, C/EBP (CCAAT/enhancer binding protein), and cyclin T1 (in association with the PTEF-b component), thus promoting efficient transcription by RNA pol II [85,97-99]. Tat domain MGD scanning analysis (Figure 8) demonstrated that C/EBP binding, NFAT binding, and core domains of the X4 viral sequences were more highly conserved than R5 sequences (Figure 8). This result suggests that these domains are more conserved because of their fundamental importance for X4 virus replication as they are involved in highly efficient Tat trans-activation activity. Conversely, different domains of Tat seem to play more important roles in R5 virus replication based on the fact that a different set of domains were significantly more conserved than those identified within the X4 sequence group; these included the cysteine-rich domain and complete Tat exon II (Figure 8). The cysteine-rich domain is involved in the formation of the disulfide bridge within Tat, which is required for efficient transactivation [100], and this might be important for replication of R5 virus in cellular phenotypes that promote more efficient viral gene expression (Figure 8). Likewise, Tat exon II may be more conserved in the R5 than in the X4 group because exon II enhances Tat-mediated trans-activation in cells of the monocyte-macrophage lineage [85]. Furthermore, differential amino acids identified within Tat at position 19 (K19R) appeared to be more prevalent in the R5 group (Figure 3). Whether the presence of this residue is associated with a functional change in the Tat protein or the interaction of Tat with other viral and/or cellular proteins is not yet known. Position 19 is mapped within the acidic domain of Tat, which contains a conserved tryptophan and other acidic amino acids [85]. Changing from K to R does not seem to change the overall charge property; however, it might affect the tertiary structure of this important viral trans-activator protein. MGD analysis of the acidic domain of Tat exhibited no significant difference between the X4 and R5 viruses (Figure 8), possibly indicating a similar level of conservation or comparable degree of adaptation of these two viruses in this domain. The functional importance of this change

will need further exploration. These results suggest that specific domains of the Tat protein are conserved to varying degrees between X4 and R5 viruses, implying that these regions may be more or less critical for X4 or R5 replication in different cellular targets in the absence or presence of specific extracellular activation stimuli.

The X4 virus can enter cells of the monocyte-macrophage lineage and as such are capable of utilizing the low level of CXCR4 expressed on the surface of this cellular phenotype. However, this virus failed to initiate replication because postentry steps were blocked [101]. One important postentry process involved in viral gene expression centers on LTR-directed gene transcription, and any adaptation of this region could play a critical role in viral gene expression and replication. Identification of three differential nucleotide changes was an interesting discovery because these changes, never previously reported, are located outside of well-characterized transcription factor binding sites (Figure 3). The HIV-1 LTR is comprised of a large number of cis-acting transcription factor binding sites that are critical for transcription in a number of cellular phenotypes and physiological environments. Position 109 lies within the COUP binding site located from position 94 to 132, or -364 to -367 with respect to the transcriptional start site, and forms part of the consensus B HIV-1 negative responsive element of the LTR which is located from position 102 to 204. Deletion of the negative responsive element sequence induced a threefold increase in HIV-1 LTRdriven chloramphenicol acetyltransferase activity in transient transfection assays performed in T cells and increased HIV-1 replication [105,106]. In addition, site-directed mutagenesis showed that a mutation within COUP binding sites had lower binding affinity for the COUP transcription factor. Position 257 of HIV-1 LTR was mapped to a region of GRE, and it has been previously reported that viral replication was increased in response to glucocorticoid treatment [107]. Meanwhile, position 15 in the LTR is not within any known functional region, although it may lie within a viral sequence that could be involved in integration based on its proximity to the end of the viral genome. Therefore, the variants we observed within the LTR in this study will need to be further characterized to ascertain whether the change in nucleotide sequence contributes to any change in the functional properties of the LTR and is therefore related to X4 or R5 adaptation within different cellular compartments with differing physiological conditions.

Analysis of the HIV-1 LTR demonstrated that different domains display lower MGD or a higher level of conservation between X4 and R5 LTR sequences (Figures 9 and 10), likely correlated with the MGD analyses of defined Vpr and Tat domains (Figure 7 and 8, respectively). The R5 virus exhibited a higher level of conservation in both NF-κB binding sites sequences than that of the X4 sequence group. We theorize that in a T-cell environment with excess NF-κB protein, the X4 viral sequences were more forgiving with respect to the relative changes in binding site affinities introduced by the infidelity of the reverse transcription process. The higher degree of R5 NF-κB binding site



p-value < 0.05

47

1

56

67

26

101

C/EBP binding

NFAT binding

DNA-PK binding

0.0811

0.0251

0.0829

0.0241

0.0007

0.5774

0.1723

0.0806

0.2619

0.0881

0.0232

0.0982

0.1161

0.0562

0.2668

**Figure 8. Phylogenetic trees and MGD comparisons of domains of Tat between selected X4 and R5 sequences.** The final nine selected X4 sequences and nine selected R5 sequences were utilized in different Tat domain analyses by phylogenetic construction as well as MGD analysis. The different 15 domains of Tat were selected based on both structural and functional properties. The phylogenetic trees were constructed using the maximum-likelihood method; a simple Python script was also written to automate the process of generating the hundreds of trees. The branch distance was calculated between all pairs of X4 and R5 sequences. These groups of distances were tested for a significant difference using a two-tailed student t-test. The MGD, SD, and *P* value of each group are shown. The three best *P* values are shown in green, and the least three significant comparisons in purple.

doi:10.1371/journal.pone.0107389.g008

conservation may be selected for during the course of disease by R5 replication in cells where the levels of activated NF-κB are much lower and would therefore represent a cellular environment that would select for a virus with an LTR that was optimized for operation in a low NF-κB environment and therefore highly conserved. This observation also correlated with results indicating that R5 sequences exhibited a lower level of genetic diversity and a higher degree of conservation in R5 Tat exon II. This is an interesting observation because studies have indicated that Tat exon II is required for optimal Tat-mediated trans-activation in cells of the monocyte-macrophage origin (Figure 8). Using similar logic, the X4 virus demonstrated less genetic diversity, hence a greater degree of conservation in Sp binding sites I and II, but comparable diversity of Sp binding site III as compared with the R5 sequence group (Figure 10). Interestingly, this altered variation correlated with a predicted difference in binding for the Sp family of transcription factors with the R5 virus sequences exhibiting a lower binding potential at Sp site I and III. Given, that the Sp binding sites have been reported to be critical for viral replication within both T cells and cells of monocyte-macrophage origin [108], this may provide yet another reason as to why HIV-1 does not replicate as efficiently in cells of the monocyte-macrophage lineage.

In summary, we used the co-receptor prediction capabilities of the in silico PSSM algorithm to define two populations of HIV-1 subtype B sequences categorized as either X4 or R5 based on sequence of the Env-V3 sequence in gp120 utilizing sequences derived from the LANL database and the Drexel Medicine HIV/ AIDS Genetic Analysis Cohort. Having defined two HIV-1 sequence populations based on the sequence of the Env-V3 region, overall charge, charge density, and gp120 functional properties with respect to viral entry, we used co-linear sequence information to define co-evolved genetic signatures within the X4 and R5 Vpr, Tat, and LTR. These studies have led to the identification of specific sequence domains in Vpr, Tat, and LTR that are highly significantly different between HIV-1 sequences defined as X4 and R5, based on differences in MGD and the relative level of conservation in each protein domain or LTR sequence examined. This represents the first report of defined sequence differences in specific regions of Vpr, Tat, and the LTR that associate with colinear Env genes encoding either an X4 or R5 Env V3 sequence to guide viral entry and to some extent cellular tropism. These studies have paved the way for the use of bioinformatic and functional studies to explore the genetic architecture and functional properties of X4- and R5-encoded gene products and their role in the pathogenesis of HIV/AIDS.

### **Materials and Methods**

### Patient enrollment, clinical data, and sample collection

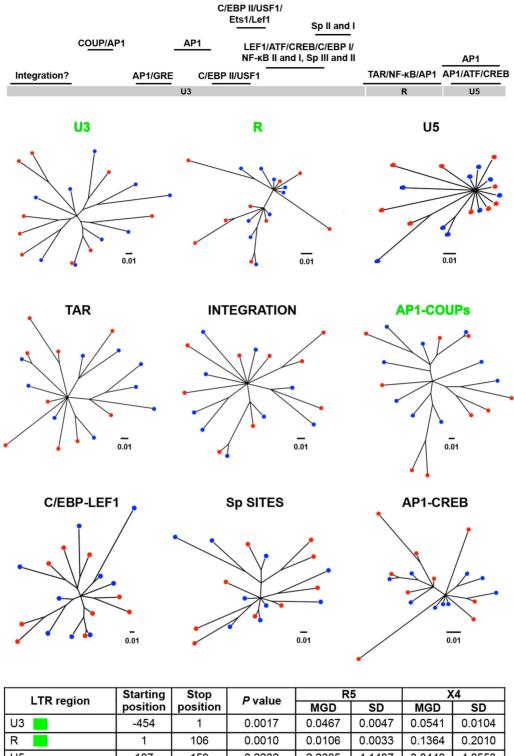
Patients enrolled in the Drexel Medicine HIV/AIDS Genetic Analysis Cohort were recruited from the Partnership Comprehensive Care Practice of the Division of Infectious Disease and HIV Medicine in the Department of Medicine at Drexel University College of Medicine (Philadelphia, Pennsylvania, USA). All clinical information was collected directly from patient interviews, patient charts, and clinical tests. The whole blood derived from each patient was assessed as previously described [82]. This procedure was performed at the initial visit and at each subsequent return visit. Peripheral blood samples were used for drug screening, serum analysis, viral load determination, CD4/CD8 cell measurements, and PBMC isolation as described below. Each patient has been examined approximately every 6 months, with at least one recall per year as part of an ongoing cross-sectional and longitudinal study.

#### Peripheral blood mononuclear cell isolation

The whole blood, which was collected in ethylenediaminetetraacetic acid—containing vacutainer tubes (BD Bioscience; Franklin Lakes, NJ) was subjected to an initial centrifugation procedure to isolate and collect plasma from each patient. Patient-derived PBMCs were then isolated from whole blood using Ficoll-hypaque (Amersham Biosciences; Amersham, UK) density gradient centrifugation as previously described [82]. Approximately  $5\times10^6$  PBMCs were used for genomic DNA extraction (Qiagen; Valencia, CA), which was subsequently used as the substrate for HIV-1 genome amplification.

### Amplification of 4.4-kb HIV-1 DNA fragment from PBMCs of HIV-1-infected patients

To generate a 4.4-kb fragment from the integrated proviral HIV-1 genome, including the vpr gene to the end of the 3'-LTR, from, approximately 100 ng of patient derived-PBMC genomic DNA was used for each PCR reaction as previously described [82]. Two rounds of PCR amplification were performed using PCR-specific primers BA15 and BA44 (Table 3). All position numbers referred to the positions within HIV-1 HXB2 strain. The PCR reaction was performed with Phusion Hot Start High-Fidelity Polymerase (1 U) (Thermo Scientific; Waltham, MA) with HF buffer, MgCl<sub>2</sub> (1.5 mM), deoxyribonucleoside triphosphates (dNTPs,  $200 \mu M$ ), primers (0.5  $\mu M$ ), and dimethlysulfoxide (DMSO) (3%). The first round of PCR was run on low melting SeaPlaque 0.7% agarose gel (Lonza Group, Basel, Switzerland). The corresponding 4.4-kb band was excised and used in the second round of PCR amplification. The first and the second rounds of PCR amplification used the same experimental conditions, with 5 µL of melted gel from the first round used as the template for the second round of PCR amplification. The second-round PCR amplification product was visualized on a 0.7% agarose gel and the corresponding 4.4-kb product was excised and purified using the QIAquick gel extraction procedure (Qiagen).



LTR region	Starting	Stop	P value	R	5	Х	(4
Likiegion	position	position	P value	MGD	SD	MGD	SD
U3 📉	-454	1	0.0017	0.0467	0.0047	0.0541	0.0104
R 📕	1	106	0.0010	0.0106	0.0033	0.1364	0.2010
U5	107	159	0.2232	2.2385	4.1487	3.8448	4.8553
TAR 📕	1	91	0.0002	0.0089	0.0052	0.0963	0.1224
Integration	-453	-383	0.3526	0.0461	0.0195	0.0502	0.0104
AP1-COUPs	-393	-203	9.7501e-06	0.0496	0.0062	0.0633	0.0121
C/EBP-LEF1	-173	-123	0.5856	0.0362	0.0192	0.0350	0.0208
Sp-sites	-77	-45	0.5262	0.0432	0.0178	0.0406	0.0200
AP1-CREB	86	163	0.2137	0.4600	0.8275	0.7908	0.9618

p-value < 0.05

**Figure 9. Phylogenetic trees and MGD comparisons of different LTR regions between selected X4 and R5 sequences.** A total of nine regions of LTR were chosen based on the known functions. Utilizing a maximum-likelihood algorithm, phylogenetic trees were created based upon a total of 18 sequences, which included nine sequences of X4 and nine sequences of R5. A simple Python script was generated to automate the process of creating the hundreds of trees; additionally, each branch distance was calculated between all pairs of X4 and R5 sequences. Each group of distances was tested for significant differences using a two-tailed student t-test [115]. The MGD, SD, and *P* value of each group are shown. The three most significant comparisons are shown in green and the three least significant ones in purple. doi:10.1371/journal.pone.0107389.q009

### Amplification of HIV-1 Env-V3 genes from HIV-1 4.4-kb proviral DNA

Each patient-derived HIV-1 4.4-kb proviral DNA sample was used as a template to amplify HIV-1 Env-V3 utilizing BA46 and BA77 primers (Table 3). The PCR reaction contained Phusion Hot Start High-Fidelity Polymerase (1 U), HF buffer, MgCl<sub>2</sub> (1.5 mM), dNTPs (200  $\mu$ M), and DMSO (3%). Amplification was subsequently performed at 98°C for 10 seconds, 52°C for 20 seconds, and 72°C for 30 seconds for 35 cycles. PCR amplification products were purified using the QIAquick gel extraction procedure and analyzed by agarose (0.7%) gel electrophoresis.

### Amplification of HIV-1 LTR from HIV-1 4.4-kb proviral DNA

HIV-1 LTR was amplified from each patient-derived HIV-1 4.4-kb proviral DNA sample. The PCR reaction containing Phusion Hot Start High-Fidelity Polymerase (1 U), HF buffer, MgCl<sub>2</sub> (1.5 mM), dNTPs (200 μM), and DMSO (3%),%), with primers BA40 and BA43 (Table 3), was performed at 98°C for 10 seconds, 58°C for 20 seconds, and 72°C for 1 minute for 35 cycles. PCR products were purified using the QIAquick gel extraction procedure and analyzed by agarose (0.7%) gel electrophoresis. Select sequences derived from PCR amplification directly from the 4.4-kb product were chosen for confirmatory analysis by cloning the PCR product and assessing the sequence of the clones (data not shown).

### Amplification of HIV-1 tat exon 1 and 2 from HIV-1 4.4-kb proviral DNA

Each patient-derived HIV-1 4.4-kb proviral DNA sample was used as a template to amplify both exons of tat. Primers BA08 and BA29 (Table 3) were used for tat exon 1 amplification, and in a separate reaction, primers BA33 and BA37 (Table 3) were used for tat exon 2 amplification. The PCR reactions containing Phusion Hot Start High-Fidelity Polymerase (1 U), HF buffer, MgCl<sub>2</sub> (1.5 mM), dNTPs (200 µM), and DMSO (3%), were performed at 98°C for 10 seconds, 47°C for 20 seconds, and 72°C for 1 minute for 35 cycles, additionally; a sequence of 98°C for 10 seconds, 58°C for 20 seconds, and 72°C for 1 minute for 35 cycles was used for the amplification of exon 2. PCR products were purified using the QIAquick gel extraction procedure and analyzed by agarose (0.7%) gel electrophoresis. Select sequences derived from PCR amplification directly from the 4.4-kb product were chosen for confirmatory analysis by cloning the PCR product and assessing the sequence of the clones (data not shown).

### Amplification of HIV-1 vpr from HIV-1 4.4-kb proviral DNA

HIV-1 vpr was amplified from each patient-derived HIV-1 4.4-kb proviral DNA sample by performing PCR in a reaction containing Phusion Hot Start High-Fidelity Polymerase (1 U), HF buffer, MgCl<sub>2</sub> (1.5 mM), dNTPs (200  $\mu$ M), and DMSO (3%) with primers BA56 and BA29 (Table 3). The reaction was performed at

98°C for 10 seconds, 54°C for 20 seconds, and 72°C for 1 minute for 35 cycles. PCR products were also purified utilizing the QIAquick gel extraction procedure and analyzed by agarose (0.7%) gel electrophoresis. Select sequences derived from PCR amplification directly from the 4.4-kb product were chosen for confirmatory analysis by cloning the PCR product and assessing the sequence of the clones (data not shown).

### DNA sequencing

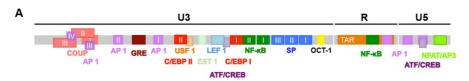
All purified PCR products were sequenced by Genewiz (South Plainfield, NJ). All sample preparations were processed as previously described (Genewiz). Each gene required different primer sets for sequencing as shown in Table 3.

### Analysis of HIV-1 sequences

The nucleic acid sequences of HIV-1 env-V3, tat exon 1 and 2, and vpr were translated into amino acid sequences using a translating tool from the ExPASy proteomic resource portal (Swiss Institute of Bioinformatics, Lausanne, Switzerland; www.expasy. org). All amino acid and nucleic acid sequences were formatted by Editseq Lasergene software (DNASTAR, Madison, WI). Sequence alignments and phylogenetic analyses were performed using the computer program Multiple Sequence Comparison by Log-Expectation (MUSCLE), version 5.05 [109]. Both nucleic acid and amino acid sequence alignments were executed using the UPGMA clustering method, and all sites were used. Phylogenetic trees of amino acid sequences were constructed by the maximumlikelihood method using JTT with frequency (+F) model [110,111]. A discrete gamma distribution category 6 with invariant sites (G+I) was used, and all gaps were treated as indifferences. The nearest-neighbor-interchange was applied for the phylogeny construction. Nucleic acid sequence phylogeny was constructed using the maximum-likelihood method employing the general time reversible and data-specific models [111,112]. The sequence alignments were compared to the consensus subtype B (conB) obtained from the LANL [86]. All HIV-1 reference strains were obtained from either LANL HIV-1 database or GenBank (www.ncbi.nlm.nih.gov/genbank).

### In silico HIV-1 co-receptor use prediction

All patient-derived HIV-1 Env-V3 sequences were subjected to three different *in silico* co-receptor usage prediction methods. First, the amino acid positions 11 and 25 were identified by amino acid sequences, which were translated using the translating tool and amino acid properties analyzed by ProtParam, respectively; both tools are available at ExPASy. Second, the Geno2Pheno (coreceptor) program (Max Planck Institut für Informatik, Saarbrücken Germany) [113] was used for analysis of all HIV-1 Env-V3 amino acid sequences by setting the false-positive rate at 5% and 10%. In addition, all available clinical information for each patient was used in the analyses. Third, the Web-based PSSM algorithm (X4/R5) was utilized for classification of all patient-



Binding site	Starting	Stop	p-value	R	5	Х	4
Billuling site	position	position	p-value	MGD	SD	MGD	SD
Pre-COUP	-454	-360	0.6150	0.0422	0.0145	0.0423	0.0064
Pre-COUP-upstream-half	-454	-408	0.0048*	0.0308	0.0124	0.0445	0.0200
Pre-COUP-downstream-half	-408	-360	0.5385	0.0354	0.0255	0.0327	0.0140
COUP region	-361	-324	0.0275*	0.0142	0.0056	0.0199	0.0107
COUP III	-361	-343	0.0305*	0.0235	0.0278	0.0409	0.0254
COUP II	-348	-330	0.4139	0.0448	0.0306	0.0509	0.0257
COUP I	-337	-324	0.4888	0.0011	0.0019	0.0008	0.0015
AP IV	-350	-342	0.0545	0.0959	0.0860	0.1390	0.0685
AP III	-335	-329	0.0071**	0.0479	0.0896	0.0016	0.0031
Between COUP I & AP II	-323	-299	0.6073	0.0337	0.0210	0.0329	0.0209
AP II	-300	-293	0.0008**	0.0113	0.0196	0.0651	0.0772
Between AP II to GRE	-292	-264	0.0059**	0.0445	0.0143	0.0627	0.0282
GRE	-263	-248	0.0030**	0.0987	0.0544	0.0617	0.0214
API	-241	-234	0.0048**	0.1231	0.0733	0.1795	0.0644
Between AP I & CEBP II	-233	-173	0.0144**	0.0692	0.0174	0.0827	0.0197
AP I promixal half	-233	-203	0.0629	0.0716	0.0316	0.0883	0.0290
C/EBP II promixal half	-203	-173	0.4734	0.0392	0.0065	0.0423	0.0262
C/EBP II	-174	-164	0.0007**	0.1386	0.0759	0.0624	0.0733
C/EBP II to USF 1	-174	-161	0.5021	0.0938	0.0589	0.0854	0.0526
ETS 1	-150	-142	0.0004**	0.0268	0.0501	0.0849	0.0594
LEF1 to CREB	-137	-118	0.0021**	0.0498	0.0224	0.0247	0.0279
LEF 1	-137	-125	0.5858	0.0205	0.0346	0.0186	0.0350
ATF-CREB-C/EBP I	-124	-106	0.4619	0.0312	0.0295	0.0368	0.0312
ATF to CREB	-125	-118	0.0022**	0.0682	0.0807	0.0159	0.0223
C/EBP I	-117	-106	0.0024**	0.0682	0.0807	0.0159	0.0223
C/EBP I to NF-кВ II	-117	-96	0.0725	0.0122	0.0229	0.0249	0.0250
NF-ĸB II	-105	-96	0.0052**	0.0000	0.0000	0.3945	0.7446
NF-κΒ I and II	-105	-82	0.0056**	0.0000	0.0000	0.0094	0.0178
NF-ĸB I	-92	-82	0.0243*	0.1111	0.2079	0.6575	1.2411
NF-кВ II-Sp III	-105	-69	0.0589	0.0263	0.0108	0.0341	0.0176
NF-κB I to Sp III	-92	-69	0.3552	0.0381	0.0153	0.0425	0.0164
GC Box	-78	-47	0.5416	0.0432	0.0178	0.0406	0.0200
Sp III	-78	-69	0.5076	0.0957	0.0385	0.1007	0.0381
Sp II	-67	-57	0.0036**	0.7083	0.7205	0.2740	0.2488
Sp I	-56	-47	2.8024 e-05**	0.2500	0.2958	0.0000	0.0000
Pre-Sp I	-47	-1	0.0206*	0.0183	0.0128	0.0100	0.0115
Pre-Sp I upstream half	-47	-22	0.6036	0.0100	0.0187	0.0099	0.0186
Pre-Sp I downstream half	-22	-1	0.0164*	0.0256	0.0228	0.0106	0.0191

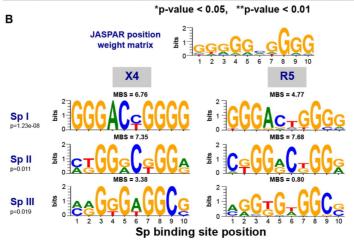


Figure 10. HIV-1 LTR regions and binding sites have differential X4/R5 MGD with Sp binding sites demonstrating altered predicted binding phenotype. (A) Phylogenetic trees were created based on identified transcription factor binding sites within HIV-1 LTR from a total of 18 final selected samples: nine X4 and nine R5 sequences, using a maximum-likelihood method. A simple Python script was written to automate the process of generating the hundreds of trees. The branch distance was calculated between all pairs of X4 and R5 sequences. These groups of distances were tested for significant differences using a two-tailed student t-test. (B) The JASPAR position weight matrix was utilized to examine the predicted binding scores of the sequences in the X4 and R5 groups for each of the three Sp binding sites. The sequence logos for the JASPAR matrix and each Sp binding site in the X4 and R5 groups are shown. Mean binding scores (MBS) are also presented. p values were calculated using a student t-test with p<0.05 being considered statistically significant. doi:10.1371/journal.pone.0107389.q010

derived Env-V3 samples [114]. We excluded all results with a percentile >0.95 or V3 lengths other than 35 amino acid residues.

### In silico transcription factor binding site analysis

The JASPAR position weight matrix [115] for vertebrate Sp (matrix MA0079.3) was utilized to examine the predicted binding scores of the sequences in the X4 and R5 groups for each of the three Sp binding sites using a custom python script. The sequence

Table 3. Primers used for amplification and sequencing.

Amplification primers	Primer position
Vpr-3'LTR	
BA 15 (5'-GAATGGAGGAGAAAGAGATATAGCACAA-3')	5302 to 5332, +
BA44 (5'-TTACCAGAGTCACACAGAC-3')	9649 to 9672, -
env-V3	
BA46 (5'-AACACCTCAGTCATTACACAGGCC- 3')	6813 to 6836, +
BA77 (5'-GGGAGGGCATACATTGCTTTT-3')	7516 to 7838, -
tat exon I	
BA08 (5'-ATATCTATGAAACTTATGGGGATAC-3')	5692 to 5716, +
BA29 (5'-AATAGAGTGGTTGCTTCCTTCC-3')	6368 to 6382, -
tat exon II	
BA 33 (5'-AACCATTAGGAGTAGCACCCACCAAGGC-3')	7698 to 7726, +
BA 37 (5'-TGCGTCCCAGAAGTTCCACAATCCTCG-3')	8569 to 8586, -
Vpr	
BA56 (5'-GGAGGAAAAAGAGATATAGCACACAAGTAGACCC-3')	5306 to 5339, +
BA29 (5'-AATAGAGTGGTTGCTTCCTTCC-3')	6368 to 6382, -
LTR	
BA40 (5'-TAAGACAGGGCTTGGAAAGGATTTTGC-3')	8764 to 8790, +
BA43 (5'-AACAGACGGGCACACTACTTGAAGC-3')	9640 to 9657, -
Sequencing primers	Primer position
env-V3	
BA31 (5'-AAGACGTTCAATGGAACAGGACC-3')	6915 to 6937, +
BA76 (5'-GGGTGATTGTGTCACTTCCTT-3')	7449 to 7470, -
LTR	
BA40 (5'-TAAGACAGGGCTTGGAAAGGATTTTGC-3')	8764 to 8790, +
BA83 (5'-TCCACTGACCTTTGGATGGTGC-3')	9201 to 9222, +
BA43 (5'-AACAGACGGGCACACTACTTGAAGC-3')	9631 to 9657, -
Tat exon I	
BA29 (5'-AATAGAGTGGTTGCTTCCTTCC-3')	6368 to 6382, -
BA81 (5'-CGACATAGCAGAATAGGCG-3')	5787 to 5816, +
BA86 (5'-CCATTTTCAGAATTGGG-3')	5768 to 5884, +
Tat exon II	
BA82 (5'-ATAGAGTTAGGCAGGGATTTCACC-3')	8341 to 8365, +
BA87 (5'-CATAATGATAGTAGGAGGC-3')	8278 to 8297, +
Vpr	
BA88 (5'-GCCCTAGGTGTGAATATCAAGCAGG-3')	5429 to 5453, +

The position of each primer is indicated according to the HXB2 sequence and the direction of the primer is designated as sense (+) or antisense (-). doi:10.1371/journal.pone.0107389.t003

logos for the JASPAR matrix and each Sp binding site in the X4 and R5 groups were generated using the same script. A Student's t-test was used to calculate p values with p<0.05 being considered statistically significant.

#### Statistical analysis

The quantitative two-tailed student t-test was utilized and P < 0.05 was considered significant. The corrected P value was determined by two-tailed t-test using 1000 random iterations selecting 8 of 16 X4 sequences and 8 of 87 R5 sequences, and this was conducted using software developed at the Drexel University College of Medicine. A Fisher's Exact Test was utilized to determine the likelihood that the distribution of mutations from the conB sequence would be different between the two groupings. Using multiple sequence alignments of the proteins, we developed a program to examine each column of the multiple alignments [116].

#### Ethics statement

The Drexel University College of Medicine Institutional Review Board (IRB) has approved this work under protocol 16311. All

#### References

- Sattentau QJ, Moore JP (1991) Conformational changes induced in the human immunodeficiency virus envelope glycoprotein by soluble CD4 binding. J Exp Med 174: 407–415.
- Salzwedel K, Smith ED, Dey B, Berger EA (2000) Sequential CD4-coreceptor interactions in human immunodeficiency virus type 1 Env function: soluble CD4 activates Env for coreceptor-dependent fusion and reveals blocking activities of antibodies against cryptic conserved epitopes on gp120. J Virol 74: 376–333.
- Sattentau QJ, Moore JP, Vignaux F, Traincard F, Poignard P (1993) Conformational changes induced in the envelope glycoproteins of the human and simian immunodeficiency viruses by soluble receptor binding. J Virol 67: 7383–7393.
- Eckert DM, Kim PS (2001) Mechanisms of viral membrane fusion and its inhibition. Annu Rev Biochem 70: 777–810.
- Deng H, Liu R, Ellmeier W, Choe S, Unutmaz D, et al. (1996) Identification of a major co-receptor for primary isolates of HIV-1. Nature 381: 661–666.
- Moore JP, Kitchen SG, Pugach P, Zack JA (2004) The CCR5 and CXCR4 coreceptors–central to understanding the transmission and pathogenesis of human immunodeficiency virus type 1 infection. AIDS Res Hum Retroviruses 20: 111–126.
- Dimonte S, Babakir-Mina M, Mercurio F, Di Pinto D, Ceccherini-Silberstein F, et al. (2012) Selected amino acid changes in HIV-1 subtype-C gp41 are associated with specific gp120(V3) signatures in the regulation of co-receptor usage. Virus Res 168: 73–83.
- Rossi F, Querido B, Nimmagadda M, Cocklin S, Navas-Martin S, et al. (2008)
  The V1-V3 region of a brain-derived HIV-1 envelope glycoprotein determines
  macrophage tropism, low CD4 dependence, increased fusogenicity and altered
  sensitivity to entry inhibitors. Retrovirology 5: 89.
- Masciotra S, Owen SM, Rudolph D, Yang C, Wang B, et al. (2002) Temporal relationship between V1V2 variation, macrophage replication, and coreceptor adaptation during HIV-1 disease progression. AIDS 16: 1887–1898.
- Carrillo A, Ratner L (1996) Human immunodeficiency virus type 1 tropism for T-lymphoid cell lines: role of the V3 loop and C4 envelope determinants. J Virol 70: 1301–1309.
- Monno L, Saracino A, Scudeller L, Punzi G, Brindicci G, et al. (2011) Impact of mutations outside the V3 region on coreceptor tropism phenotypically assessed in patients infected with HIV-1 subtype B. Antimicrob Agents Chemother 55: 5078–5084.
- Sharon M, Kessler N, Levy R, Zolla-Pazner S, Gorlach M, et al. (2003) Alternative conformations of HIV-1 V3 loops mimic beta hairpins in chemokines, suggesting a mechanism for coreceptor selectivity. Structure 11: 295–2936
- Whitcomb JM, Huang W, Fransen S, Limoli K, Toma J, et al. (2007) Development and characterization of a novel single-cycle recombinant-virus assay to determine human immunodeficiency virus type 1 coreceptor tropism. Antimicrob Agents Chemother 51: 566–575.
- Trouplin V, Salvatori F, Cappello F, Obry V, Brelot A, et al. (2001) Determination of coreceptor usage of human immunodeficiency virus type 1 from patient plasma samples by using a recombinant phenotypic assay. J Virol 75: 251–259.
- Sierra S, Kaiser R, Thielen A, Lengauer T (2007) Genotypic coreceptor analysis. Eur J Med Res 12: 453–462.

patient samples were collected under the auspices of protocol 16311 through written consent.

### **Acknowledgments**

We would like to thank all patients who are part of the Drexel Medicine HIV/AIDS Genetic Analysis Cohort. We would also like to thank the clinical staff within the Division of Infectious Diseases and HIV Medicine at the Drexel University College of Medicine who are involved in the recruitment, enrollment, obtaining consent, obtaining clinical history, venipuncture, and delivery of peripheral blood to the research laboratories in the Center for Molecular Virology and Translational Neuroscience in the Institute for Molecular Medicine and Infectious Disease.

### **Author Contributions**

Conceived and designed the experiments: BA WD MRN VP SP SS NP BW JM-G. Performed the experiments: BA WD TI WZ EK HA BF MR AW SP JWW SS BB NP. Analyzed the data: BA WD MRN VP EK SS NP BM JMJ BW. Contributed reagents/materials/analysis tools: WD JMJ BM. Wrote the paper: BA WD MRN VP BW.

- Verhofstede C, Brudney D, Reynaerts J, Vaira D, Fransen K, et al. (2011) Concordance between HIV-1 genotypic coreceptor tropism predictions based on plasma RNA and proviral DNA. HIV Med 12: 544–552.
- Jensen MA, van 't Wout AB (2003) Predicting HIV-1 coreceptor usage with sequence analysis. AIDS Rev 5: 104–112.
- Prosperi MC, Fanti I, Ulivi G, Micarelli A, De Luca A, et al. (2009) Robust supervised and unsupervised statistical learning for HIV type 1 coreceptor usage analysis. AIDS Res Hum Retroviruses 25: 305–314.
- Sing T, Low AJ, Beerenwinkel N, Sander O, Cheung PK, et al. (2007) Predicting HIV coreceptor usage on the basis of genetic and clinical covariates. Antivir Ther 12: 1097–1106.
- Soulie C, Derache A, Aime C, Marcelin AG, Carcelain G, et al. (2008) Comparison of two genotypic algorithms to determine HIV-1 tropism. HIV Med 9: 1–5.
- Jensen MA, Li FS, van 't Wout AB, Nickle DC, Shriner D, et al. (2003) Improved coreceptor usage prediction and genotypic monitoring of R5-to-X4 transition by motif analysis of human immunodeficiency virus type 1 env V3 loop sequences. J Virol 77: 13376–13388.
- Fassati A, Goff SP (2001) Characterization of intracellular reverse transcription complexes of human immunodeficiency virus type 1. J Virol 75: 3626–3635.
- Meltzer MS, Skillman DR, Hoover DL, Hanson BD, Turpin JA, et al. (1990) Macrophages and the human immunodeficiency virus. Immunol Today 11: 217–223.
- 24. Duncan CJ, Sattentau QJ (2011) Viral determinants of HIV-1 macrophage tropism. Viruses 3: 2255–2279.
- Mefford ME, Gorry PR, Kunstman K, Wolinsky SM, Gabuzda D (2008) Bioinformatic prediction programs underestimate the frequency of CXCR4 usage by R5X4 HIV type 1 in brain and other tissues. AIDS Res Hum Retroviruses 24: 1215–1220.
- Schweighardt B, Roy AM, Meiklejohn DA, Grace EJ 2nd, Moretto WJ, Heymann JJ, Nixon DF (2004) R5 human immunodeficiency virus type 1 (HIV-1) replicates more efficiently in primary CD4+ T-cell cultures than X4 HIV-1. J Virol 78(17): 9164–9173.
- Ochsenbauer C, Edmonds TG, Ding H, Keele BF, Decker J, et al. (2012) Generation of transmitted/founder HIV-1 infectious molecular clones and characterization of their replication capacity in CD4 T lymphocytes and monocyte-derived macrophages. J Virol 86: 2715–2728.
- Wilen CB, Parrish NF, Pfaff JM, Decker JM, Henning EA, et al. (2011) Phenotypic and immunologic comparison of clade B transmitted/founder and chronic HIV-1 envelope glycoproteins. J Virol 85: 8514–8527.
- Keele BF, Giorgi EE, Salazar-Gonzalez JF, Decker JM, Pham KT, et al. (2008) Identification and characterization of transmitted and early founder virus envelopes in primary HIV-1 infection. Proc Natl Acad Sci U S A 105: 7552–
- Sawaya BE, Khalili K, Gordon J, Taube R, Amini S (2000) Cooperative interaction between HIV-1 regulatory proteins Tat and Vpr modulates transcription of the viral genome. J Biol Chem 275: 35209–35214.
- Kilareski EM, Shah S, Nonnemacher MR, Wigdahl B (2009) Regulation of HIV-1 transcription in cells of the monocyte-macrophage lineage. Retrovirology 6: 118.
- 32. Bukrinsky M, Adzhubei A (1999) Viral protein R of HIV-1. Rev Med Virol 9: 39–49.

- Azad AA (2000) Could Nef and Vpr proteins contribute to disease progression by promoting depletion of bystander cells and prolonged survival of HIVinfected cells? Biochem Biophys Res Commun 267: 677–685.
- Emerman M, Malim MH (1998) HIV-1 regulatory/accessory genes: keys to unraveling viral and host cell biology. Science 280: 1880–1884.
- unraveling viral and host cell biology. Science 280: 1880–1884.

  35. Emerman M (1996) HIV-1, Vpr and the cell cycle. Curr Biol 6: 1096–1103.
- Tungaturthi PK, Sawaya BE, Ayyavoo V, Murali R, Srinivasan A (2004) HIV-1 Vpr: genetic diversity and functional features from the perspective of structure. DNA Cell Biol 23: 207–222.
- Srinivasan A, Ayyavoo V, Mahalingam S, Kannan A, Boyd A, et al. (2008) A
  comprehensive analysis of the naturally occurring polymorphisms in HIV-1
  Vpr: potential impact on CTL epitopes. Virol J 5: 99.
- Bano AS, Gupta N, Sharma Y, Sood V, Banerjea AG (2007) HIV-1 VprB and C RNA cleavage by potent 10-23 DNAzymes that also cause reversal of G2 cell cycle arrest mediated by Vpr genes. Oligonucleotides 17: 465–472.
- Bano AS, Gupta N, Sood V, Banerjea AC (2007) Vpr from HIV-1 subtypes B and C exhibit significant differences in their ability to transactivate LTRmediated gene expression and also in their ability to promote apoptotic DNA ladder formation. AIDS 21: 1832–1834.
- Bano AS, Sood V, Neogi U, Goel N, Kuttiat VS, et al. (2009) Genetic and functional characterization of human immunodeficiency virus type 1 VprC variants from north India: presence of unique recombinants with mosaic genomes from B, C and D subtypes within the open reading frame of Vpr. J Gen Virol 90: 2768–2776.
- Mologni D, Citterio P, Menzaghi B, Zanone Poma B, Riva C, et al. (2006) Vpr and HIV-1 disease progression: R77Q mutation is associated with long-term control of HIV-1 infection in different groups of patients. AIDS 20: 567–574.
- Yedavalli VR, Ahmad N (2001) Low conservation of functional domains of HIV type 1 vif and vpr genes in infected mothers correlates with lack of vertical transmission. AIDS Res Hum Retroviruses 17: 911–923.
- Garcia-Blanco MA, Cullen BR (1991) Molecular basis of latency in pathogenic human viruses. Science 254: 815–820.
- Cullen BR (1991) Regulation of HIV-1 gene expression. FASEB J 5: 2361– 2368.
- Mancebo HS, Lee G, Flygare J, Tomassini J, Luu P, et al. (1997) P-TEFb kinase is required for HIV Tat transcriptional activation in vivo and in vitro. Genes Dev 11: 2633–2644.
- Conaway JW, Shilatifard A, Dvir A, Conaway RC (2000) Control of elongation by RNA polymerase II. Trends Biochem Sci 25: 375–380.
- Zhu Y, Pe'ery T, Peng J, Ramanathan Y, Marshall N, et al. (1997) Transcription elongation factor P-TEFb is required for HIV-1 tat transactivation in vitro. Genes Dev 11: 2622–2632.
- Wei P, Garber ME, Fang SM, Fischer WH, Jones KA (1998) A novel CDK9associated C-type cyclin interacts directly with HIV-1 Tat and mediates its high-affinity, loop-specific binding to TAR RNA. Cell 92: 451–462.
- Eugenin EA, King JE, Nath A, Calderon TM, Zukin RS, et al. (2007) HIV-tat induces formation of an LRP-PSD-95- NMDAR-nNOS complex that promotes apoptosis in neurons and astrocytes. Proc Natl Acad Sci U S A 104: 3438-3443.
- Tyor W, Fritz-French C, Nath A (2013) Effect of HIV clade differences on the onset and severity of HIV-associated neurocognitive disorders. J Neurovirol 19:515–522.
- Rao VR, Neogi U, Talboom JS, Padilla L, Rahman M, et al. (2013) Clade C HIV-1 isolates circulating in Southern Africa exhibit a greater frequency of dicysteine motif-containing Tat variants than those in Southeast Asia and cause increased neurovirulence. Retrovirology 10: 61.
- Butto S, Fiorelli V, Tripiciano A, Ruiz-Alvarez MJ, Scoglio A, et al. (2003) Sequence conservation and antibody cross-recognition of clade B human immunodeficiency virus (HIV) type 1 Tat protein in HIV-1-infected Italians, Ugandans, and South Africans. J Infect Dis 188: 1171–1180.
- Neogi U, Gupta S, Sahoo PN, Shet A, Rao SD, et al. (2012) Genetic characterization of HIV-1 Tat exon 1 from a southern Indian clinical cohort: identification of unique epidemiological signature residues. AIDS Res Hum Retroviruses 28:1152–1156.
- 54. Hutto C, Zhou Y, He J, Geffin R, Hill M, et al. (1996) Longitudinal studies of viral sequence, viral phenotype, and immunologic parameters of human immunodeficiency virus type 1 infection in perinatally infected twins with discordant disease courses. J Virol 70: 3589–3598.
- Cowley D, Gray LR, Wesselingh SL, Gorry PR, Churchill MJ (2011) Genetic and functional heterogeneity of CNS-derived tat alleles from patients with HIV-associated dementia. J Neurovirol 17: 70–81.
- King JE, Eugenin EA, Buckner CM, Berman JW (2006) HIV tat and neurotoxicity. Microbes Infect 8: 1347–1357.
- Mayne M, Bratanich AC, Chen P, Rana F, Nath A, et al. (1998) HIV-1 tat molecular diversity and induction of TNF-alpha: implications for HIV-induced neurological disease. Neuroimmunomodulation 5: 184–192.
- Fields BN, Knipe DM, Howley PM (2007) Fields' virology. Philadelphia: Wolters Kluwer Health/Lippincott Williams & Wilkins. 5<sup>th</sup> edition: 2664.
- Nonnemacher MR, Irish BP, Liu Y, Mauger D, Wigdahl B (2004) Specific sequence configurations of HIV-1 LTR G/C box array result in altered recruitment of Sp isoforms and correlate with disease progression. J Neuroimmunol 157: 39–47.
- Hogan TH, Stauff DL, Krebs FC, Gartner S, Quiterio SJ, et al. (2003) Structural and functional evolution of human immunodeficiency virus type 1

- long terminal repeat CCAAT/enhancer binding protein sites and their use as molecular markers for central nervous system disease progression. J Neurovirol 9: 55–68.
- Ross HL, Gartner S, McArthur JC, Corboy JR, McAllister JJ, et al. (2001) HIV-1 LTR C/EBP binding site sequence configurations preferentially encountered in brain lead to enhanced C/EBP factor binding and increased LTR-specific activity. J Neurovirol 7: 235–249.
- 62. Burdo TH, Gartner S, Mauger D, Wigdahl B (2004) Region-specific distribution of human immunodeficiency virus type 1 long terminal repeats containing specific configurations of CCAAT/enhancer-binding protein site II in brains derived from demented and nondemented patients. J Neurovirol 10 Suppl 1: 7–14.
- Henderson AJ, Connor RI, Calame KL (1996) C/EBP activators are required for HIV-1 replication and proviral induction in monocytic cell lines. Immunity 5: 91–101.
- Henderson AJ, Calame KL (1997) CCAAT/enhancer binding protein (C/ EBP) sites are required for HIV-1 replication in primary macrophages but not CD4(+) T cells. Proc Natl Acad Sci U S A 94: 8714–8719.
- Fu YX (2001) Estimating mutation rate and generation time from longitudinal samples of DNA sequences. Mol Biol Evol 18: 620–626.
- Derdeyn CA, Decker JM, Bibollet-Ruche F, Mokili JL, Muldoon M, et al. (2004) Envelope-constrained neutralization-sensitive HIV-1 after heterosexual transmission. Science 303: 2019–2022.
- 67. Chohan B, Lang D, Sagar M, Korber B, Lavreys L, et al. (2005) Selection for human immunodeficiency virus type 1 envelope glycosylation variants with shorter V1-V2 loop sequences occurs during transmission of certain genetic subtypes and may impact viral RNA levels. J Virol 79: 6528–6531.
- Liu Y, Curlin ME, Diem K, Zhao H, Ghosh AK, et al. (2008) Env length and N-linked glycosylation following transmission of human immunodeficiency virus Type 1 subtype B viruses. Virology 374: 229–233.
- Gnanakaran S, Bhattacharya T, Daniels M, Keele BF, Hraber PT, et al. (2011)
   Recurrent signature patterns in HIV-1 B clade envelope glycoproteins associated with either early or chronic infections. PLoS Pathog 7: e1002209.
- Parker ZF, Iyer SS, Wilen CB, Parrish NF, Chikere KC, et al. (2013) Transmitted/founder and chronic HIV-1 envelope proteins are distinguished by differential utilization of CCR5. J Virol 87: 2401–2411.
- Parrish NF, Gao F, Li H, Giorgi EE, Barbian HJ, et al. (2013) Phenotypic properties of transmitted founder HIV-1. Proc Natl Acad Sci U S A 110: 6626–6633.
- Schuitemaker H, Fouchier RA, Broersen S, Groenink M, Koot M, et al. (1995) Envelope V2 configuration and HIV-1 phenotype: clarification. Science 268: 115
- Poss M, Martin HL, Kreiss JK, Granville L, Chohan B, et al. (1995) Diversity in virus populations from genital secretions and peripheral blood from women recently infected with human immunodeficiency virus type 1. J Virol 69: 8118– 8129.
- Doranz BJ, Orsini MJ, Turner JD, Hoffman TL, Berson JF, et al. (1999) Identification of CXCR4 domains that support coreceptor and chemokine receptor functions. J Virol 73: 2752–2761.
- Schuitemaker H, Koot M, Kootstra NA, Dercksen MW, de Goede RE, et al. (1992) Biological phenotype of human immunodeficiency virus type 1 clones at different stages of infection: progression of disease is associated with a shift from monocytotropic to T-cell-tropic virus population. J Virol 66: 1354–1360.
- Nora T, Bouchonnet F, Labrosse B, Charpentier C, Mammano F, et al. (2008) Functional diversity of HIV-1 envelope proteins expressed by contemporaneous plasma viruses. Retrovirology 5: 23.
- Joos B, Trkola A, Fischer M, Kuster H, Rusert P, et al. (2005) Low human immunodeficiency virus envelope diversity correlates with low in vitro replication capacity and predicts spontaneous control of plasma viremia after treatment interruptions. J Virol 79: 9026–9037.
- Sagar M, Kirkegaard E, Lavreys L, Overbaugh J (2006) Diversity in HIV-1 envelope V1-V3 sequences early in infection reflects sequence diversity throughout the HIV-1 genome but does not predict the extent of sequence diversity during chronic infection. AIDS Res Hum Retroviruses 22: 430–437.
- Connor RI, Sheridan KE, Ceradini D, Choe S, Landau NR (1997) Change in coreceptor use correlates with disease progression in HIV-1-infected individuals. J Exp Med 185: 621–628.
- De Jong JJ, De Ronde A, Keulen W, Tersmette M, Goudsmit J (1992) Minimal requirements for the human immunodeficiency virus type 1 V3 domain to support the syncytium-inducing phenotype: analysis by single amino acid substitution. J Virol 66: 6777–6780.
- Pillai S, Good B, Richman D, Corbeil J (2003) A new perspective on V3 phenotype prediction. AIDS Res Hum Retroviruses 19: 145–149.
- Li L, Aiamkitsumrit B, Pirrone V, Nonnemacher MR, Wojno A, et al. (2011) Development of co-selected single nucleotide polymorphisms in the viral promoter precedes the onset of human immunodeficiency virus type 1associated neurocognitive impairment. J Neurovirol 17: 92–109.
- Kogan M, Rappaport J (2011) HIV-1 accessory protein Vpr: relevance in the pathogenesis of HIV and potential for therapeutic intervention. Retrovirology 8: 25.
- Ferrucci A, Nonnemacher MR, Wigdahl B (2011) Human immunodeficiency virus viral protein R as an extracellular protein in neuropathogenesis. Adv Virus Res 31: 165–199.

- Li L, Dahiya S, Kortagere S, Aiamkitsumrit B, Cunningham D, et al. (2012) Impact of Tat genetic variation on HIV-1 disease. Adv Virol 2012: 123605.
- Los Alamos National Laboratory. http://www.hiv.lanl.gov. Accessed 2014 August 27.
- Hogan TH, Krebs FC, Wigdahl B (2002) Regulation of human immunodeficiency virus type 1 gene expression and pathogenesis by CCAAT/enhancer binding proteins in cells of the monocyte/macrophage lineage. J Neurovirol 8 Suppl 2: 21–26.
- Henderson AJ, Zou X, Calame KL (1995) C/EBP proteins activate transcription from the human immunodeficiency virus type 1 long terminal repeat in macrophages/monocytes. J Virol 69: 5337–5344.
- Gallo RC, Sarngadharan MG, Popovic M, Shaw GM, Hahn B, et al. (1986)
   HTLV-III and the etiology of AIDS. Prog Allergy 37: 1–45.
- Hahn BH, Shaw GM, Taylor ME, Redfield RR, Markham PD, et al. (1986) Genetic variation in HTLV-III/LAV over time in patients with AIDS or at risk for AIDS. Science 232: 1548–1553.
- Markham RB, Schwartz DH, Templeton A, Margolick JB, Farzadegan H, et al. (1996) Selective transmission of human immunodeficiency virus type 1 variants to SCID mice reconstituted with human peripheral blood monoclonal cells. J Virol 70: 6947–6954.
- Markham RB, Wang WC, Weisstein AE, Wang Z, Munoz A, et al. (1998)
   Patterns of HIV-1 evolution in individuals with differing rates of CD4 T cell decline. Proc Natl Acad Sci U S A 95: 12568–12573.
- Alkhatib G, Combadiere C, Broder CC, Feng Y, Kennedy PE, et al. (1996) CC CKR5: a RANTES, MIP-1alpha, MIP-1beta receptor as a fusion cofactor for macrophage-tropic HIV-1. Science 272: 1955–1958.
- Huang Y, Paxton WA, Wolinsky SM, Neumann AU, Zhang L, et al. (1996)
   The role of a mutant CCR5 allele in HIV-1 transmission and disease progression. Nat Med 2: 1240–1243.
- Kitayama H, Miura Y, Ando Y, Hoshino S, Ishizaka Y, et al. (2008) Human immunodeficiency virus type 1 Vpr inhibits axonal outgrowth through induction of mitochondrial dysfunction. J Virol 82: 2528–2542.
- Zhou Y, Ratner L (2001) A novel inducible expression system to study transdominant mutants of HIV-1 Vpr. Virology 287: 133–142.
- Macian F, Rao A (1999) Reciprocal modulatory interaction between human immunodeficiency virus type 1 Tat and transcription factor NFAT1. Mol Cell Biol 19: 3645–3653.
- 98. Ambrosino C, Ruocco MR, Chen X, Mallardo M, Baudi F, et al. (1997) HIV-1 Tat induces the expression of the interleukin-6 (IL6) gene by binding to the IL6 leader RNA and by interacting with CAAT enhancer-binding protein beta (NF-IL6) transcription factors. J Biol Chem 272: 14883–14892.
- Mbonye U, Karn J (2011) Control of HIV latency by epigenetic and nonepigenetic mechanisms. Curr HIV Res 9: 554–567.
- Kalantari P, Narayan V, Natarajan SK, Muralidhar K, Gandhi UH, et al. (2008) Thioredoxin reductase-1 negatively regulates HIV-1 transactivating protein Tat-dependent transcription in human macrophages. J Biol Chem 283: 33183–33190.

- Schmidtmayerova H, Alfano M, Nuovo G, Bukrinsky M (1998) Human immunodeficiency virus type 1 T-lymphotropic strains enter macrophages via a CD4- and CXCR4-mediated pathway: replication is restricted at a postentry level. J Virol 72: 4633–4642.
- 102. Holzmeister J, Ludewig B, Pauli G, Simon D (1993) Sequence specific binding of the transcription factor c-Ets1 to the human immunodeficiency virus type I long terminal repeat. Biochem Biophys Res Commun 197: 1229–1233.
- Roebuck KA, Saifuddin M (1999) Regulation of HIV-1 transcription. Gene Expr 8: 67–84.
- 104. Canonne-Hergaux F, Aunis D, Schaeffer E (1995) Interactions of the transcription factor AP-1 with the long terminal repeat of different human immunodeficiency virus type 1 strains in Jurkat, glial, and neuronal cells. J Virol 69: 6634–6642.
- Lu Y, Stenzel M, Sodroski JG, Haseltine WA (1989) Effects of long terminal repeat mutations on human immunodeficiency virus type 1 replication. J Virol 63: 4115–4119.
- 106. Cooney AJ, Tsai SY, O'Malley BW, Tsai MJ (1991) Chicken ovalbumin upstream promoter transcription factor binds to a negative regulatory region in the human immunodeficiency virus type 1 long terminal repeat. J Virol 65: 2853–2860.
- 107. Bruland T, Lavik LA, Dai HY, Dalen A (2003) A glucocorticoid response element in the LTR U3 region of Friend murine leukaemia virus variant FIS-2 enhances virus production in vitro and is a major determinant for sex differences in susceptibility to FIS-2 infection in vivo. J Gen Virol 84: 907–916.
- 108. McAllister JJ, Phillips D, Millhouse S, Conner J, Hogan T, et al. (2000) Analysis of the HIV-1 LTR NF-kappaB-proximal Sp site III: evidence for cell type-specific gene regulation and viral replication. Virology 274: 262–277.
- 109. Tamura K, Peterson N, Stecher G, Nei M, Kumar S (April 2011) MEGA. 5.05 ed. Molecular evolutionary genetics analysis using Maximum Likelihood, Evolutionary Distance, and Maximum Parsimony Methods. Molecular Biology and Evolution 28: 2731–2739. Available: http://www.megasoftware.net. Accessed 2014 August 27
- Jones DT, Taylor WR, Thornton JM (1992) The rapid generation of mutation data matrices from protein sequences. Comput Appl Biosci 8: 275–282.
- Tamura K, Peterson D, Peterson N, Stecher G, Nei M, et al. (2011) MEGA5: molecular evolutionary genetics analysis using maximum likelihood, evolutionary distance, and maximum parsimony methods. Mol Biol Evol 28: 2731–2739.
- S. Nei M, Kumar S (2000) Molecular evolution and phylogenetics. New York: Oxford University Press. 333 p.
- 113. Max Planck Institut für Informatik (2011) Geno2Pheno. Available: http://www.mpi-inf.mpg.de/. Accessed 2014 August 27
- Jensen M (2007–2009) PSSM. Available: http://indra.mullins.microbiol. washington.edu/webpssm/. Accessed 2014 August 27
- 115. Mathelier A, Zhao X, Zhang A, Parcy F, Worsley-Hunt R, et al. (2014) JASPAR 2014: an extensively expanded and updated open-access database of transcription factor binding profiles. Nucl Acids Res 42(D1): D142–D147.
- Jones E, Oliphant T, Peterson P, et al. (2001) SciPy: Open source scientific tools for Python. Available: http://www.scipy.org/. Accessed 2014 August 27