

# CRF01\_AE-Specific Neutralizing Activity Observed in Plasma Derived from HIV-1-Infected Thai Patients Residing in Northern Thailand: Comparison of Neutralizing Breadth and Potency between Plasma Derived from Rapid and Slow Progressors

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## Abstract

**Background:** Development of a protective vaccine against human immunodeficiency virus type 1 (HIV-1) is an important subject in the field of medical sciences; however, it has not yet been achieved. Potent and broadly neutralizing antibodies are found in the plasma of some HIV-1-infected patients, whereas such antibody responses have failed to be induced by currently used vaccine antigens. In order to develop effective vaccine antigens, it is important to reveal the molecular mechanism of how strong humoral immune responses are induced in infected patients. As part of such studies, we examined the correlation between the anti-HIV-1 neutralizing antibody response and disease progression.

**Methodology/Principal Findings:** We evaluated the anti-HIV-1 neutralizing activity of plasma derived from 33 rapid and 34 slow progressors residing in northern Thailand. The level of neutralizing activity varied considerably among plasmas, and no statistically significant differences in the potency and breadth of neutralizing activities were observed overall between plasma derived from rapid and slow progressors; however, plasma of 4 slow progressors showed neutralizing activity against all target viruses, whereas none of the plasma of rapid progressors showed such neutralizing activity. In addition, 21% and 9% of plasmas derived from slow and rapid progressors inhibited the replication of more than 80% of CRF01\_AE Env-recombinant viruses tested, respectively. Neutralization of subtype B and C Env-recombinant viruses by the selected plasma was also examined; however, these plasma samples inhibited the replication of only a few viruses tested.

**Conclusions/Significance:** Although no statistically significant differences were observed in the potency and breadth of anti-HIV-1 neutralizing activities between plasma derived from rapid and slow progressors, several plasma samples derived from slow progressors neutralized CRF01\_AE Env-recombinant viruses more frequently than those from rapid progressors. In addition, plasma derived from HIV-1-infected Thai patients showed CRF01\_AE-specific neutralizing activity.

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## Introduction

More than 30 million individuals are infected with human immunodeficiency virus type 1 (HIV-1) worldwide, and 2.5 million new infections have been estimated to occur yearly; therefore, an HIV-1 vaccine is urgently required. Neutralizing antibodies are a critical component of the protective immunity required for

developing an effective HIV-1 vaccine [1]. In addition, it is necessary to design vaccine antigens which induce a potent and broadly neutralizing antibody response against various HIV-1 strains [1,2]. Plasma of some HIV-1-infected patients contains potent and broadly reactive neutralizing antibodies, and human monoclonal antibodies with broad and potent neutralizing activity have been established [3,4,5,6,7,8]. It is believed that understand-

| ID                           | Dual-tropic |           | CXCR4-tropic |           | CCR5-tropic |           |          | mean ID50 (% neutralization) |           |
|------------------------------|-------------|-----------|--------------|-----------|-------------|-----------|----------|------------------------------|-----------|
|                              | 29CC1       | 41CC1     | 98CC2        | 107CC2    | 47CC11      | 55PL1     | 102CC2   |                              | 105PL3    |
| R1                           | 89          |           |              |           |             | 291       | 27       | 136 (38%)                    |           |
| R2                           | 198         |           |              | 154       |             | 297       | 637      | 322 (50%)                    |           |
| R3                           | 319         |           |              | 21        |             | 175       | 151      | 167 (50%)                    |           |
| R4                           | 127         |           |              |           |             |           |          | 127 (13%)                    |           |
| R5                           | 56          |           |              |           |             |           |          | 56 (13%)                     |           |
| R6                           | 180         | 104       | 36           | 153       |             | 325       | 54       | 142 (75%)                    |           |
| R7                           |             | 228       |              | 93        |             | 35        | 33       | 97 (50%)                     |           |
| R8                           |             |           |              |           |             |           |          | 0 (0%)                       |           |
| R9                           | 35          | 50        |              | 141       |             | 632       | 60       | 224 (63%)                    |           |
| R10                          | 83          | 57        |              | 58        |             |           |          | 66 (38%)                     |           |
| R11                          | 60          |           |              |           |             |           |          | 60 (13%)                     |           |
| R12                          |             |           |              |           |             |           |          | 0 (0%)                       |           |
| R13                          | 63          | 132       |              | 325       |             | 70        | 90       | 125 (75%)                    |           |
| R14                          |             |           |              |           |             | 63        |          | 63 (13%)                     |           |
| R15                          |             |           |              |           |             | 73        |          | 73 (13%)                     |           |
| R16                          | 326         |           | 26           | 145       |             | 768       | 51       | 237 (75%)                    |           |
| R17                          | 25          |           |              |           |             | 1065      |          | 545 (25%)                    |           |
| R18                          | 184         |           |              | 60        |             | 61        |          | 102 (38%)                    |           |
| R19                          | 69          |           |              | 197       |             | 178       |          | 148 (38%)                    |           |
| R20                          |             |           |              |           |             | 59        | 28       | 44 (25%)                     |           |
| R21                          | 572         |           |              | 244       |             |           |          | 408 (25%)                    |           |
| R22                          | 114         |           |              | 48        |             |           |          | 81 (25%)                     |           |
| R23                          | 496         | 52        |              | 1332      | 27          | 1413      | 34       | 488 (88%)                    |           |
| R24                          | 309         | 488       | 44           | 795       |             |           | 295      | 163                          | 349 (75%) |
| R25                          | 542         |           |              | 29        |             | 2317      | 140      | 757 (50%)                    |           |
| R26                          | 308         | 54        | 82           | 190       |             | 1220      | 178      | 90                           | 303 (88%) |
| R27                          | 56          |           |              | 76        |             |           |          |                              | 66 (25%)  |
| R28                          | 218         |           |              | 904       | 74          | 64        |          |                              | 315 (50%) |
| R29                          | 118         |           |              | 77        |             |           |          | 21                           | 72 (38%)  |
| R30                          | 153         | 38        |              |           | 154         | 585       | 78       | 198                          | 197 (88%) |
| R31                          |             |           |              |           |             | 60        |          | 25                           | 43 (25%)  |
| R32                          | 169         |           |              | 246       |             |           |          | 55                           | 157 (38%) |
| R33                          | 40          |           |              | 52        |             | 63        |          | 32                           | 47 (50%)  |
| mean ID50 (% neutralization) | 189 (79%)   | 134 (27%) | 47 (12%)     | 251 (67%) | 85 (9%)     | 477 (64%) | 99 (30%) | 121 (42%)                    |           |

ID50 > 500  
 500 > ID50 > 100  
 100 > ID50 > 20  
 no neutralization

**Figure 1. Anti-HIV-1 neutralizing activity of plasma derived from 33 rapid progressors against AE-Env-recombinant viruses.** Neutralizing activity of plasma samples against 8 AE-Env-recombinant viruses was evaluated and reciprocal plasma dilution at which viral replication was suppressed by 50% (50% inhibitory dilution, ID50) was calculated, as described in Methods. Data are presented as the means of at least three independent experiments. Plasma IDs and AE-Env-recombinant viruses tested are denoted on the left side and above the panel, respectively. In addition, mean ID50 values and the percentages of virus/plasma combinations (% neutralization) in which viral neutralization was observed among the data sets in horizontal and vertical directions are shown on the right side and bottom of the panel, respectively. ID50 values >500, values 100–500, and values 20–100 are highlighted in red, orange and yellow, respectively. In addition, no neutralization (ID50 values <20) of a recombinant virus is denoted by a gray background.

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ing how such neutralizing antibodies are elicited in infected patients may provide valuable insights into developing an effective HIV-1 vaccine.

HIV-1 is characterized by extensive genetic heterogeneity and is divided into four groups: M (major), O (outlying), N (new or non-M, non-O) and P (pending). The viruses in group M, which are responsible for the worldwide HIV-1 pandemic, are further classified into many subtypes and circulating recombinant forms (CRFs) [9]. While subtype B of HIV-1 is the predominant subtype in the Americas, Europe and Australia, there is a growing epidemic of non-B subtypes and CRFs in Africa and Asia. CRF01\_AE is prevalent throughout Southeast Asia [9] and is responsible for more than 80% of infection cases in Thailand [10].

In this report, as part of studies to reveal the molecular mechanism of how strong humoral immune responses are elicited in HIV-1-infected patients, we performed a comparative study on the neutralizing activity of plasma derived from rapid and slow progressors residing in northern Thailand, using previously established high throughput neutralization tests with CRF01\_AE Env-recombinant, luciferase reporter viruses [11,12].

## Methods

### Ethics statement

This study was conducted with approval from the ethics committee of the Ministry of Public Health of Thailand and with written informed consent from the patients.

### Study participants and sample collection

We studied plasma samples of drug-naive, HIV-1-infected patients who visited the day care center of Lampang Hospital in the early to middle 2000 s, and who were enrolled in a HIV-1 cohort study. Thirty-four plasma samples were derived from slow progressors (CD4 count >100 cells/cm<sup>3</sup> at the time of enrollment, healthy for at least 8 years without antiretroviral treatment), whereas 33 plasma samples were derived from rapid progressors (CD4 count >100 cells/cm<sup>3</sup> at the time of enrollment, died with AIDS symptoms within 5 years). Plasma samples were heat-inactivated for 1 hr at 56°C and subjected to neutralization tests.

### Cells

293T cells were maintained in Dulbecco's modified Eagle's medium supplemented with 10% fetal bovine serum (10% FBS-

| ID                           | Dual-tropic |          | CXCR4-tropic |           | CCR5-tropic |           |          |           | mean ID50 (% neutralization) |
|------------------------------|-------------|----------|--------------|-----------|-------------|-----------|----------|-----------|------------------------------|
|                              | 29CC1       | 41CC1    | 98CC2        | 107CC2    | 47CC11      | 55PL1     | 102CC2   | 105PL3    |                              |
| S1                           | 204         |          |              |           |             | 492       |          |           | 348 (25%)                    |
| S2                           | 44          | 53       |              | 21        |             | 175       | 151      |           | 89 (63%)                     |
| S3                           | 55          |          |              |           |             |           |          |           | 55 (13%)                     |
| S4                           | 42          |          |              |           |             |           |          |           | 42 (13%)                     |
| S5                           | 46          | 22       |              |           |             |           |          |           | 34 (25%)                     |
| S6                           | 60          |          |              |           |             | 776       |          |           | 418 (25%)                    |
| S7                           | 122         | 52       | 49           | 572       | 27          | 1411      | 78       | 272       | 323 (100%)                   |
| S8                           | 69          |          |              |           |             |           |          |           | 69 (13%)                     |
| S9                           | 29          |          |              |           |             |           |          |           | 29 (13%)                     |
| S10                          | 147         |          |              |           |             |           |          |           | 147 (13%)                    |
| S11                          | 151         |          |              |           |             | 34        |          |           | 93 (25%)                     |
| S12                          | 34          |          |              | 32        |             |           |          |           | 33 (25%)                     |
| S13                          | 203         |          | 29           | 61        |             | 66        |          | 101       | 92 (63%)                     |
| S14                          |             |          |              |           |             |           |          |           | 0 (0%)                       |
| S15                          | 63          |          | 62           | 205       | 37          | 511       | 116      | 41        | 148 (88%)                    |
| S16                          |             |          |              |           |             |           |          |           | 0 (0%)                       |
| S17                          |             |          |              |           |             | 255       |          |           | 255 (13%)                    |
| S18                          |             |          |              |           |             |           |          |           | 0 (0%)                       |
| S19                          | 191         |          |              |           |             | 108       | 43       | 32        | 94 (50%)                     |
| S20                          |             |          |              |           |             |           |          |           | 0 (0%)                       |
| S21                          | 217         |          |              |           |             |           |          | 108       | 163 (25%)                    |
| S22                          | 157         |          | 112          |           |             | 137       |          |           | 135 (38%)                    |
| S23                          | 34          | 57       | 28           | 988       | 23          | 898       | 57       | 252       | 292 (100%)                   |
| S24                          |             |          |              |           |             |           |          |           | 0 (0%)                       |
| S25                          |             |          |              |           |             | 52        |          |           | 52 (13%)                     |
| S26                          |             |          |              | 66        |             | 45        |          |           | 56 (25%)                     |
| S27                          |             |          |              | 31        |             | 22        |          |           | 27 (25%)                     |
| S28                          | 113         | 53       |              | 246       | 70          | 496       | 112      | 45        | 162 (88%)                    |
| S29                          | 221         |          |              | 83        |             |           |          | 43        | 116 (38%)                    |
| S30                          | 419         | 45       | 65           | 186       |             | 55        | 40       | 302       | 159 (88%)                    |
| S31                          | 168         | 257      | 293          | 524       | 100         | 278       | 100      | 355       | 259 (100%)                   |
| S32                          | 717         |          |              | 36        |             |           |          | 71        | 275 (38%)                    |
| S33                          | 340         |          |              |           |             |           |          | 72        | 206 (25%)                    |
| S34                          | 1281        | 72       | 27           | 1518      | 35          | 116       | 23       | 448       | 440 (100%)                   |
| mean ID50 (% neutralization) | 205 (74%)   | 76 (24%) | 83 (24%)     | 326 (41%) | 49 (18%)    | 329 (53%) | 80 (26%) | 165 (38%) |                              |



**Figure 2. Anti-HIV-1 neutralizing activity of plasma derived from 34 slow progressors against AE-Env-recombinant viruses.** Neutralizing activity of plasma samples against 8 AE-Env-recombinant viruses was evaluated as described in the legend to Figure 1. Data are presented as the means of at least three independent experiments. Plasma IDs and AE-Env-recombinant viruses tested are denoted on the left side and above the panel, respectively. In addition, mean ID50 values and the percentages of virus/plasma combinations (% neutralization) in which viral neutralization was observed among the data sets in horizontal and vertical directions are shown on the right side and bottom of the panel, respectively. ID50 values >500, values 100–500 and values 20–100 are highlighted in red, orange and yellow, respectively. No neutralization (ID50 values <20) of a recombinant virus is denoted by a gray background. Plasma samples that neutralized all recombinant viruses tested are highlighted in green.

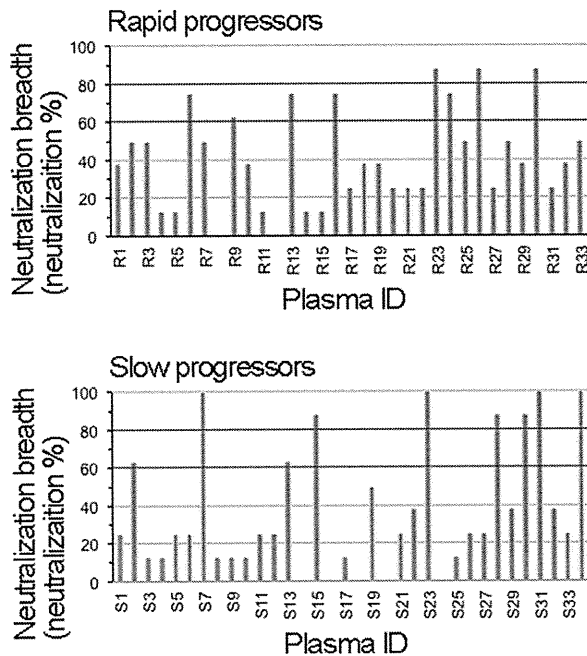
doi:10.1371/journal.pone.0053920.g002

DMEM). U87.CD4.CCR5 and U87.CD4.CXCR4 cells [13] were obtained from Dr. HongKui Deng and Dr. Dan R. Littman through the AIDS Research and Reference Reagent Program (ARRRP), Division of AIDS, NIAID, NIH, and were maintained in 10% FBS-DMEM with puromycin (1 µg/ml) and G418 (300 µg/ml) (complete medium).

#### Viral constructs

CRF01\_AE-Env (AE-Env)-recombinant, luciferase reporter proviral constructs containing the CRF01\_AE *env* genes, 29CC1, 41CC1, 47CC1, 55PL1, 98CC2, 102CC2 and 105PL3, were generated as described previously [12]. The expression vectors for 5 subtype B Env (B-Env), QH0692.42, TRO.11, pWITO4160.33, pREJO4541.67 and SC422661.8 [14,15,16], and the vectors for 6

subtype C Env (C-Env), ZM214M.PL15, ZM249MPL1, ZM53M.PB12, ZM109F.PB4, ZM135M.PL10a and CAP210.2.00.E8 [17], were obtained from Drs. Cynthia A. Derdeyn, Feng Gao, Beatrice H. Hahn, Eric Hunter, Ming Li, Yingying Li, Koleka Milsana, David C. Montefiori, Lynn Morris and Jesus F. Salazar-Gonzalez through the ARRRP. Subtype B and C *env* genes were amplified from these expression vectors by polymerase chain reaction and inserted into pNL4-3-derived luciferase reporter viral DNA, pNL-envCT to generate B-Env- and C-Env-recombinant, luciferase reporter proviral constructs, essentially as described [12,18].



**Figure 3. Comparison of the neutralization breadth between plasma derived from rapid and slow progressors.** The proportion of AE-Env-recombinant viruses in which replication was inhibited by a plasma sample was calculated and plotted. The levels of plasma-mediated neutralization against 60% and 80% of recombinant viruses tested are highlighted by horizontal blue and red grid lines, respectively. Plasma IDs are denoted below the panels. doi:10.1371/journal.pone.0053920.g003

**Preparation of Env-recombinant viruses**

293T cells ( $2 \times 10^5$  cells/2 ml) were seeded onto a collagen-coated 6-well plate (Iwaki, Tokyo, Japan) 24 h prior to transfection. Env-recombinant viruses were prepared by transfecting 293T cells with a proviral construct (2 µg) using FuGENE HD transfection reagent (Roche, Basel, Switzerland). Forty-eight hours after transfection, viral supernatants were cleared by centrifugation for 5 min at 8,000 rpm and stored as aliquots at  $-85^\circ\text{C}$ . The viral titer was determined by measuring the concentration of HIV-

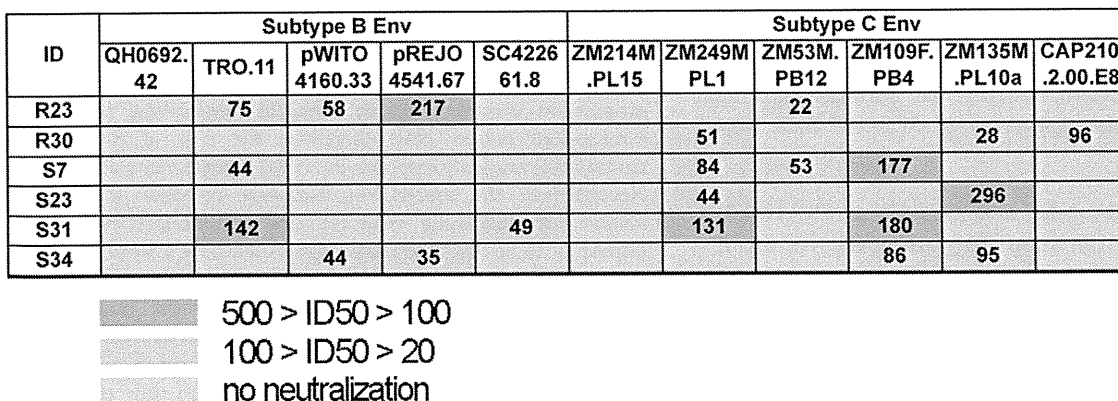
1 Gag p24 antigen in viral supernatants by enzyme-linked immunosorbent assay (ELISA) (HIV-1 p24 ELISA Kit; BioAcademia, Inc., Osaka, Japan).

**Neutralization tests**

The neutralization susceptibility of Env-recombinant viruses to plasma samples was examined, essentially as described previously [11]. Briefly, U87.CD4.CXCR4 or U87.CD4.CCR5 cells were incubated with 2-fold serially diluted plasma in 100 µl complete medium for 1 hr at  $37^\circ\text{C}$ . U87.CD4.CXCR4 cells were used as target cells for recombinant viruses containing CXCR4-tropic AE-Env, 98CC2 and 107CC2, and dual-tropic AE-Env, 29CC1 and 41CC1. In addition, U87.CD4.CCR5 cells were used as target cells for recombinant viruses containing CCR5-tropic AE-Env, 47CC11, 55PL1, 102CC2 and 105PL3, 2 dual-tropic AE-Env, 5 B-Env and 6 C-Env. The cells were then incubated with viral supernatants (2 ng of p24 antigen) for 48 hrs. Luciferase activity in infected cells was measured using the Steady Glo Luciferase assay kit (Promega) with an LB960 microplate luminometer (Berthold, Bad Wildbad, Germany). The inhibitory effect of the plasma on viral replication was evaluated as a reduction in luciferase activity in infected cells. The reciprocal plasma dilution, at which viral replication was suppressed by 50% (50% inhibitory dilution, ID50), was calculated by the dose-response curve using a standard function of GraphPad Prism 5 software (GraphPad Software, San Diego, CA).

**Statistical analyses**

Fisher’s exact test was performed to compare the breadth of neutralizing activity in plasma derived from rapid and slow progressors. Briefly, a  $2 \times 2$  contingency table, consisting of the numbers of plasma/virus combinations in which viral neutralization was observed and total plasma/virus combinations on both groups, was constructed, and the 2-tailed p-value was calculated using QuickCalcs (GraphPad software; <http://www.graphpad.com/quickcalcs/>). In addition, Student’ t-test was performed to compare the potency of neutralizing plasmas derived from rapid and slow progressors, using the standard function of Microsoft Excel (Microsoft Office for Mac 2011; Microsoft, Redmond, WA).



**Figure 4. Anti-HIV-1 neutralizing activity of 6 selected plasma samples against B-Env- and C-Env-recombinant viruses.** Neutralizing activity of 6 plasma samples against 5 B-Env- and 6 C-Env-recombinant viruses was evaluated as described in the legend to Figure 1. Data are presented as the means of at least three independent experiments. Plasma IDs and Env-recombinant viruses tested are denoted on the left side and above the panel, respectively. ID50 values 100–500 and 20–100 are highlighted in orange and yellow, respectively. No neutralization (ID50 values <20) of a recombinant virus is denoted by a gray background. doi:10.1371/journal.pone.0053920.g004

## Results

### Neutralizing activity of plasma derived from rapid progressors

We evaluated the anti-HIV-1 neutralizing activity of plasma derived from 33 rapid progressors by measuring the inhibitory effect of plasma on a single round replication of previously established AE-Env-recombinant viruses [11,12]. The 8 AE-Env-recombinant viruses used in this study consisted of the recombinant viruses containing 2 dual-tropic AE-Env, 29CC1 and 41CC1, 2 CXCR4-tropic AE-Env, 98CC2 and 107CC2, and 4 CCR5-tropic AE-Env, 47CC11, 55PL1, 102CC2 and 105PL3 [12]. Plasma samples derived from 33 rapid progressors showed various levels of neutralizing activities against 8 AE-Env-recombinant viruses (Fig. 1). The replication of recombinant viruses containing AE-Env, 29CC1, 55PL1 and 107CC2, was inhibited by many plasma samples, whereas that of recombinant viruses, containing AE-Env, 47CC11 and 98CC2, was inhibited only by 3 and 4 plasma samples, respectively (Fig. 1). The inhibitory effect of plasma on the replication of 2 recombinant viruses containing dual-tropic AE-Env, 29CC1 and 41CC1, in U87.CD4.CCR5 was somewhat, but not significantly higher than that in U87.CD4.CXCR4 cells (data not shown), suggesting that viral entry through the CCR5 molecule is more susceptible to plasma-mediated neutralization than entry through CXCR4. Finally, plasma samples R23 and R30 inhibited the replication of most AE-Env-recombinant viruses tested, but failed to inhibit the replication of a recombinant virus containing AE-Env, 98CC2 (Fig. 1).

### Neutralizing activity of plasma derived from slow progressors

We next evaluated the neutralizing activity of plasma derived from 34 slow progressors. The plasma samples showed various levels of neutralizing activity against AE-Env-recombinant viruses tested (Fig. 2). Plasma derived from slow progressors inhibited the replication of 8 AE-Env-recombinant viruses with a similar tendency to plasma derived from rapid progressors; however, the replication of 2 recombinant viruses containing AE-Env, 47CC11 and 98CC2 was inhibited more frequently by plasma derived from slow progressors than from rapid progressors (Figs. 1 and 2). In contrast, the replication of a recombinant virus containing AE-Env, 107CC2 was inhibited less frequently by plasma derived from slow progressors than from rapid progressors (Figs. 1 and 2). It is noteworthy that 4 plasma samples, S7, S23, S31 and S34, derived from slow progressors, inhibited the replication of all AE-Env-recombinant viruses tested, whereas no plasma from rapid progressors inhibited the replication of all recombinant viruses (Figs. 1 and 2).

### Comparison of the breadth and potency of anti-HIV-1 neutralizing activity between the plasma derived from rapid and slow progressors

We next performed statistical analyses to compare the breadth and potency of neutralizing activity between the plasma derived from rapid and slow progressors. Viral neutralization was observed in 109 virus/plasma combinations among 264 virus/plasma combinations by the plasma derived from rapid progressors (Fig. 1), whereas it was observed in 101 virus/plasma combinations among 277 virus/plasma combinations by the plasma derived from slow progressors (Fig. 2). Fisher's exact test for a 2×2 contingency table revealed no statistical significance ( $P>0.5$ ) in the breadth of viral neutralization between plasma derived from both

groups. In addition, the mean ID50 values of plasma derived from rapid and slow progressors on viral neutralization were 227 and 200, respectively. Student's t-test revealed no statistical significance ( $P>0.5$ ) in the potency of viral neutralization between plasma derived from both groups; therefore, we concluded that no clear differences were observed overall in the potency and breadth of anti-HIV-1 neutralizing activity in plasma derived from rapid and slow progressors. We next compared the proportion of AE-Env-recombinant viruses neutralized by a plasma sample and evaluated the neutralization breadth of plasma derived from rapid and slow progressors in more detail. The results showed that the replication of more than 60% (5 of 8) of AE-Env-recombinant viruses was inhibited by 24% (8 of 33) and 26% (9 of 34) of plasma derived from rapid and slow progressors, respectively (Fig. 3, bars above blue lines), suggesting no clear difference between the groups. In contrast, the replication of more than 80% (7 of 8) of AE-Env-recombinant viruses was inhibited by 21% (7 of 34) of plasma derived from slow progressors, whereas that was inhibited by 9% (3 of 33) of plasma derived from rapid progressors (Fig. 3, bars above red lines). These results showed that several plasma samples derived from slow progressors neutralized AE-Env-recombinant viruses more frequently than those from rapid progressors.

### Plasma derived from Thai patients possessed CRF01\_AE-specific neutralizing activity

We next studied the neutralizing activity of plasma, R23, R30, S7, S23, S31 and S34, which efficiently inhibited the replication of AE-Env-recombinant viruses, against 5 B-Env- and 6 C-Env-recombinant viruses. The results showed that these plasma samples were able to inhibit the replication of less than half of B-Env- and C-Env-recombinant viruses tested.

## Discussion

In this report, we performed a comparative study on the anti-HIV-1 neutralizing activity of plasma samples derived from rapid and slow progressors residing in northern Thailand. Previous reports showed that broadly neutralizing activity against heterologous HIV-1 clinical isolates was more frequently detected in plasma or serum samples derived from long-term non-progressors (LTNP) than from progressors [19,20,21], suggesting the involvement of a broadly reactive neutralizing antibody response in regulating disease progression. In contrast, recent reports have shown that broadly neutralizing activity was more frequently detected in serum samples derived from slow and rapid progressors than from LTNP [22,23]. In addition, no correlation between the neutralization breadth of plasma and disease progression was observed in a recent longitudinal study of a seroincident cohort [24]; therefore, the role of the broadly neutralizing antibody response in HIV-1 disease control is unclear. Nevertheless, the anti-HIV-1 antibody response is a factor involved in regulating viral replication; therefore, it may be important to accumulate knowledge about how a strong humoral immune response is induced in some patients.

No statistically significant differences in the potency and breadth of neutralizing activities were observed overall in plasma derived from two groups of patients in this report (Figs. 1 and 2); however, several plasma samples derived from slow progressors were capable of neutralizing AE-Env-recombinant viruses more frequently than those from rapid progressors (Fig. 3), indicating the possible involvement of the anti-HIV-1 broadly reactive antibody response, at least in part, in controlling disease progression. In addition, broadly neutralizing human monoclonal antibodies, VRC01 and PG9, were recently established from



samples derived from a slow progressor and an elite neutralizer, respectively [7,8,25], indicating the possible correlation between the induction of potent and broadly neutralizing antibodies and slow disease progression. Broadly neutralizing antibodies are reported to be elicited in the early phase of HIV-1 infection [26]. In addition, such broadly reactive antibodies were elicited in an elite neutralizer within a year after viral infection [27]. Another report showed a correlation between viral load and the broadly neutralizing antibody response, as well as an inverse correlation between CD4 count and such an antibody response, in the early phase of HIV-1 infection [28]. Considering these reports, the induction mechanism of broadly neutralizing antibodies has been elucidated in part, but more information needs to be accumulated. The understanding of broadly neutralizing antibody responses induced by natural HIV-1 infection may provide valuable insights into the design of an effective HIV vaccine antigen using a reverse engineering approach. We studied the epitopes of anti-HIV-1 neutralizing antibodies in selected plasma samples that neutralized AE-Env-recombinant viruses efficiently; however, they were not revealed in this study. We consider that epitope analysis of broadly reactive plasma, as well as evaluation of the immunogenicity of Env gp120 and gp41 molecules derived from viruses isolated from patients with broadly neutralizing plasma, may be important in future studies.

The replication of B-Env- and C-Env-recombinant viruses was not efficiently inhibited by selected plasma that showed broadly neutralizing activity against AE-Env-recombinant viruses (Fig. 4). These results suggest that the antigenicity of Env gp120 and gp41

differs among CRF01\_AE, subtype B and C viruses. Our results were consistent with the results described in a previous report that serum samples derived from subtype B and E (CRF01\_AE) -infected Thai individuals showed subtype-specific neutralizing activity [29]. Env gp120 and gp41 are the most variable HIV-1 proteins, with typical intersubtype and intrasubtype differences reaching 35% and 20%, respectively [30]. In addition, structural differences between subtype B and C Env molecules have recently been reported [31]. Moreover, our recent observations suggested that different Env regions were affected by host immune pressure between CRF01\_AE and subtype B viruses [32]. Taken together with the results in this report, we believe that it is important to take into account the antigenic and immunogenic diversity among different subtypes and CRFs of HIV-1 in developing HIV-1 vaccine antigens to elicit a broadly neutralizing antibody response.

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## Author Contributions

Conceived and designed the experiments: N. Tsuchiya KA PI MK. Performed the experiments: SS. Analyzed the data: SS MK. Contributed reagents/materials/analysis tools: PP PS N. Takeda. Wrote the paper: SS MK.

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# Development of a Novel *In Silico* Docking Simulation Model for the Fine HIV-1 Cytotoxic T Lymphocyte Epitope Mapping

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## Abstract

**Introduction:** Class I HLA's polymorphism has hampered CTL epitope mapping with laborious experiments. Objectives are 1) to evaluate the novel *in silico* model in predicting previously reported epitopes in comparison with existing program, and 2) to apply the model to predict optimal epitopes with HLA using experimental results.

**Materials and Methods:** We have developed a novel *in silico* epitope prediction method, based on HLA crystal structure and a peptide docking simulation model, calculating the peptide-HLA binding affinity at four amino acid residues in each terminal. It was applied to predict 52 HIV best-defined CTL epitopes from 15-mer overlapping peptides, and its predictive ability was compared with the HLA binding motif-based program of HLArestrictor. It was then used to predict HIV-1 Gag optimal epitopes from previous ELISpot results.

**Results:** 43/52 (82.7%) epitopes were detected by the novel model, whereas 37 (71.2%) by HLArestrictor. We also found a significant reduction in epitope detection rates for longer epitopes in HLArestrictor ( $p=0.027$ ), but not in the novel model. Improved epitope prediction was also found by introducing both models, especially in specificity ( $p<0.001$ ). Eight peptides were predicted as novel, immunodominant epitopes in both models.

**Discussion:** This novel model can predict optimal CTL epitopes, which were not detected by an existing program. This model is potentially useful not only for narrowing down optimal epitopes, but predicting rare HLA alleles with less information. By introducing different principal models, epitope prediction will be more precise.

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## Introduction

Cytotoxic T lymphocytes (CTLs) play a crucial role in HIV replication control by eliminating virus-infected cells by recognizing class I Human Leukocyte Antigen (HLA) molecule-viral peptides (= epitope) complex. This response is thought to be a major determinant of the viral set point, and consequent disease progression [1]. However the efficacy of the CTL response is affected by the extent of polymorphisms in HLA loci and viral sequences. The HLA region is found on chromosome 6 and is the most polymorphic loci in the human genome [2]; each individual expresses up to six different class I alleles out of a vast pool of allelic variants, the reported number of which reaches 5,399 for class I HLA molecules (1,757 of HLA-A, 2,338 of HLA-B, and 1,304 of HLA-C alleles) [3]. In addition, the extensive diversity of HIV-1 owing to its extreme capacity to mutate has led to a reported 13 prototype clades and 43 circulating recombinant

forms (CRFs) [4]. Despite such HLA polymorphism and HIV viral diversity environment, recent genome wide association study (GWAS) reported the best contribution of class I HLA for viral control, suggesting the importance of CTL epitope mapping with responsible HLA information [5]. Several major HIV-1 epitopes and their restricting HLA alleles have been defined through fine epitope mapping; 1,344 epitopes and their restricting HLA alleles have been reported as of February 2012 (CTL Epitopes. Los Alamos National Lab. <http://www.hiv.lanl.gov/>). The limitation of the dataset currently available however, is that the majority of these epitope/HLA combinations are derived from subtype B-infected Caucasians or C-infected Africans, and epitope information from other subtypes or ethnicities is rare.

The traditional, *in vitro* method of epitope detection involves using a matrix of overlapping peptides (OLPs) encoding viral proteins in Enzyme-Linked Immunospot (ELISpot) assays to



identify a single candidate peptide, from which the 8-11mer epitope is mapped down. This is typically followed by the confirmation of the restricting HLA alleles using tetramers or in a  $^{51}\text{Cr}$  release assay using peptide-specific lines [6,7]. It is a difficult and labor-intensive process, particularly time-consuming in the case of epitopes restricted by rare HLA alleles because of the limited number of samples available.

Recently, alternative, *in silico* models for epitope prediction have been developed [8]. These can broadly be divided into two models; the first is an algorithm based on the peptide-binding motif, and the second is a structural algorithm model based on the crystal structure of HLA molecules. The former is characterized by the use of motif matrices deduced from refined motifs based on the pool sequence, enlisting optimal amino acid sequences at anchor positions in specific HLA alleles. An example of such an algorithm is the SYFPEITHI [9] database, which predicts the HLA-binding affinities of peptides by ranking them according to the presence of primary and secondary anchor amino acids. However these models are based on reported epitopes and their restricting HLA alleles, so their predictions are powerful in the context of well-published HLA alleles but not suitable against rare or novel alleles with little previous information. Another model of epitope prediction is the binding affinity model, which calculates the peptides' binding affinity and scores it using quantitative matrices (QMs), a well-known example being the NetMHC [10,11] or the HLArestrictor [12]. This model scores binding strength as binding affinity with thresholds to differentiate strong binding peptides and weak ones in each calculation.

On the other hand, the structural algorithm model does not require binding motif information, which is advantageous for the definition of epitopes restricted by HLA alleles with less published epitope information. Recently, a docking simulation model (DSM) which takes into consideration binding energy such as electrostatic interactions and van der Waals (vdw) interactions, together with the crystal structure of HLA alleles, has been developed [13–17].

Our objectives here are 1) to evaluate the novel *in silico* DSM in predicting previously reported best-defined epitopes in comparison with existing binding motif-based program, and 2) to apply the model to predict optimal size of the epitopes and restricting HLA alleles using results obtained from our previous study in a HIV-1 CRF01\_AE-infected Thai cohort.

## Materials and Methods

### Ethical Statement

This study was approved by Thai Ministry of Public Health Ethics Committee. Written informed consent was obtained from all patients after explaining the purpose and expected consequences of the study.

### Computational program and calculation

We used the commercial softwares Molecular Operating Environment<sup>®</sup> (MOE) (CCG Inc., Montreal, Canada) and MOE-ASDock<sup>®</sup> (Ryoka System Inc., Tokyo, Japan) for the molecular binding affinity calculation [18]. HLA's 3D models were obtained from the X-ray crystallography database in MOE's library (1OGA for HLA-A\*02:01, IQ94 for HLA-A\*11:01, 2BCK for HLA-A\*24:02, 1XR9 for HLA-B\*15:01, 1JGE for HLA-B\*27:05, 2CIK for HLA-B\*35:01, 1E27 for HLA-B\*52:01, 2RFX for HLA-B\*57:01, and 1EFX for HLA-C\*03:04). In cases where the original X-ray crystallography information was unavailable, we generated a 3D structural model using highly homologous HLA alleles as template, using rotamer explorer or homology modeling to reconstruct their structures by changing sequential

difference sites, a method originally used in the point mutation program attached in MOE AMBER99 [19] for force field, calculations. For solvent effect energy calculation, a generalized Born model [20], were introduced. As an indicator of the affinity between epitope candidate peptides and the class I HLA allele, we measured the  $U_{\text{dock}}$  score [ $U_{\text{ele}}$  (electric energy)+ $U_{\text{vdw}}$  (van der Waals energy)+ $U_{\text{solv}}$  (Solvation energy)+ $U_{\text{strain}}$  (Strain energy)] (kcal/mol) [18]. We calculated the  $U_{\text{dock}}$  score of four residues at each N- and C-terminal, spanning the anchor position at each of the terminals, and scored the sum of them as binding affinity. A lower score indicates a higher affinity between the HLA molecule and peptides.

### Evaluation of the novel DSM through an analysis of best-defined HIV CTL epitopes and their restricting HLA alleles

For the quality evaluation of this novel program, we first calculated the  $U_{\text{dock}}$  score for 52 best-defined HIV epitopes restricted by the alleles HLA-A\*02:01, HLA-A\*11:01, HLA-A\*24:02, HLA-B\*15:01, HLA-B\*27:05, HLA-B\*35:01 and HLA-B\*57:01 as enlisted in Los Alamos database (CTL Epitopes, Los Alamos National Lab. <http://www.hiv.lanl.gov/>). We calculated the  $U_{\text{dock}}$  score between the restricting HLA alleles and the 8 to 11-mer peptides within 15-mer peptides of the viral strain HXB2, in which best-defined epitopes were included. 26 variants of 8 to 11-mer peptides were calculated in one HLA and 15-mer peptide combination, then the lowest  $U_{\text{dock}}$  score was ranked as the 1st and the highest score as the 26th in each calculation (Figure 1). Combinations that ranked within the top five were regarded as positive. In parallel with our DSM, we also performed epitope prediction using the latest artificial neural network (ANN) model, the HLArestrictor [12], using the affinity thresholds of Strong Binder (SB), Weak Binder (WB), Combined Binder (CB) and Non-binder (NB), according to their definitions.

We evaluated the sensitivity, specificity, positive predictive value (PPV), and negative predictive value (NPV) for each best-defined epitope prediction using the DSM, HLArestrictor, as well as those defined as dual positive by both models.

### Analysis of *in vitro* HIV-1 CRF01\_AE Gag epitope candidates by using both *in silico* epitope prediction models

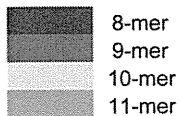
We then applied both the DSM and the HLArestrictor to predict the optimal size of epitopes, based on results obtained from our previous study [21], in which 31 candidate epitopes were detected by ELISpot assays using Gag 15-mer OLPs and their HLA associations detected by Fisher's exact test in a cohort of 137 (107 female and 30 male) HIV-1 CRF01\_AE-infected Thais. All were chronically infected and treatment naïve, with median 461/ul CD4+T cell count (range 204–1,191) and 4.2 log copies/ml viral load (2.6–5.9).

### Epitope prediction for the immunogenic Gag OLP p24<sub>276–285</sub> MYSPVSILDI using a $^{51}\text{Cr}$ release assay and both *in silico* models

In our previous study [21], the 15-mer peptides Gag p24<sub>271–285</sub> NKIVRMYSVPSILDI (NI15) and p24<sub>276–290</sub> MYSPVSILDIRQGPK (MK15) induced the largest responses in terms of both breadth and magnitude, and were statistically associated with the alleles HLA-A\*02:07, HLA-B\*46:01, and HLA-C\*01:02, which were under linkage disequilibrium (LD) association [21]. Presuming that the optimal epitope resides in the overlapping amino acid sequence between NI15 and MK15, that is, p24<sub>276–285</sub>

HLA B\*27:05  
 Seq. Gag p24 258-272: VGEIYKRWILGLNK  
 EpitopeGag p24 263-272: KRWILGLNK (KK10)  
 Rank 1

|    |        |        | C1     | C2     | C3     | C4     | C5      | C6     | C7      | C8      |
|----|--------|--------|--------|--------|--------|--------|---------|--------|---------|---------|
|    |        |        | YKRW   | KRWI   | RWII   | WIL    | IILG    | ILGL   | LGLN    | GLNK    |
|    | U_dock |        | -35.54 | -46.44 | -26.89 | -34.30 | -35.47  | -16.34 | -49.04  | -56.04  |
| N1 | VGEI   | -19.61 | -55.15 | -66.04 | -46.50 | -53.91 |         |        |         |         |
| N2 | GEIY   | -49.94 |        | -96.38 | -76.83 | -84.24 | -85.41  |        |         |         |
| N3 | EIYK   | -57.36 |        |        | -84.25 | -91.66 | -92.83  | -73.71 |         |         |
| N4 | IYKR   | -62.12 |        |        |        | -96.42 | -97.59  | -78.47 | -111.17 |         |
| N5 | YKRW   | -69.69 |        |        |        |        | -105.16 | -86.03 | -118.74 | -125.73 |
| N6 | KRWI   | -81.07 |        |        |        |        |         | -97.41 | -130.11 | -137.11 |
| N7 | RWII   | -57.68 |        |        |        |        |         |        | -106.73 | -113.72 |
| N8 | WIL    | -55.05 |        |        |        |        |         |        |         | -111.09 |



KRWILGLNK = -137.11kcal/mol and the 1st rank (the lowest score among 26 variations)

**Figure 1. Example of epitope prediction using the novel *in silico* docking simulation model.** U\_dock scores of the N-terminal (Row N1–N8) and C-terminal (Column C1–C8) was calculated and their sum was scored as the U\_dock score (kcal/mol) of each 8 to 11-mer peptide's. The lower score indicated stronger binding between the peptide and HLA. In this example, Gag p24<sub>263–272</sub> KRWILGLNK (KK10), well-known as one of the best-defined epitopes, scored -137.11 kcal/mol against HLA-B\*27:05 and was the lowest (ranked as the 1st) among 26 variants in 15-mer peptide of Gag p24<sub>258–272</sub> VGEIYKRWILGLNK. doi:10.1371/journal.pone.0041703.g001

MYPVPSILDI (MI10), we conducted a <sup>51</sup>Cr release assay as previously described [22].

**Results**

**Prediction of best-defined epitopes by the DSM and the peptide binding motif model**

We have evaluated the predictive power of our DSM by testing its ability to predict epitopes within 52 15-mer peptides spanning the epitopes for seven HLA alleles enlisted in the Los Alamos database as best-defined epitopes. Overall, DSM ranked 43/52 (82.7%) of the best-defined epitopes correctly within the top five candidates, within which 14 epitopes ranked as the 1st, 11 as the 2nd, 7 as the 3rd, 3 as the 4th, then 8 as the 5th (Table S1). This was comparable to the HLArestrictor, where 37/52 (71.2%, 43/52 vs 37/52, p=0.24 by Fisher's exact test) best-defined epitopes scored within the threshold of binding affinity without having 4 or more other candidate epitopes: 20 as SB, 10 as WB and 7 as CB. Table 1 summarizes the performance on epitope prediction by each model and dual positives by both models, according to their sensitivity, specificity, PPV and NPV. The performance of the DSM is similar to that of HLArestrictor. Interestingly, by introducing both models, specificity increased with significance (p<0.001), and an additive effect was seen in the PPV. We believe this is the first study to report a structure-based epitope prediction model with comparable or greater predictive power than a peptide-binding motif based model.

32/52 (61.5%) epitopes were detected as a significant epitope candidate by both models. 11/52 (21.2%) epitopes were detected only by the DSM, while 5/52 (9.6%) were detected only by HLArestrictor. 4/52 (7.7%) epitopes were not detected by either methods. Within the 14 epitopes not correctly predicted by HLArestrictor, incorrect epitopes were predicted in 7 epitopes. It is noteworthy that two epitopes, Nef<sub>75–82</sub> PLRPMTYK (PK8)

restricted by HLA-A\*11:01 and Nef<sub>117–127</sub> TQGYFPDWQNY (TY11) restricted by HLA-B\*15:01 were detected as a NB by HLArestrictor, whereas they were ranked as the 2nd in PK8 and the 1st in TY11 in the DSM. Integrase<sub>179–188</sub> AVFIHNFKRK (AK10) restricted by HLA-A\*11:01 was predicted as a SB, but because there were 5 other SB candidates, 3 WB candidates and 1 CB candidate, this prediction was regarded as failure.

A striking feature of the DSM was that it had a high detection rate of best-defined epitopes independent of the peptide's length. The prediction rate of shorter epitopes (8 and 9-mer) was 27/31 (87.1%) while the rate for longer epitopes (10 and 11-mer) was 16/21 (76.2%), between which we found no significant difference by Fisher's exact test (p=0.46). In contrast, the ability of HLArestrictor to accurately predict best-defined epitopes was highly dependent on epitope length, as the prediction rate of longer

**Table 1. Evaluation of best-defined epitope prediction among docking simulation model, HLArestrictor, and positives in dual models.**

|             | DSM  | HLArestrictor | Dual positives | p (mxn Fisher's exact test) |
|-------------|------|---------------|----------------|-----------------------------|
| Sensitivity | 0.83 | 0.71          | 0.62           | 0.056                       |
| Specificity | 0.83 | 0.94          | 0.97           | <0.001                      |
| PPV         | 0.17 | 0.31          | 0.43           | 0.095                       |
| NPV         | 0.99 | 0.99          | 0.98           | 0.46                        |

Evaluation of best-defined epitope prediction among each model and positives in dual models were statistically evaluated, according to their sensitivity, specificity, positive prediction value (PPV) and negative prediction value (NPV) by maximum Fisher's exact test. DSM: Docking simulation model. doi:10.1371/journal.pone.0041703.t001

epitopes (11/21, 52.3%) was significantly lower than that of shorter ones (26/31, 83.9%) ( $p = 0.027$ ).

Successful prediction with the DSM was dependent on the HLA allele and its peptides: in HLA-B\*15:01, HLA-B\*27:05 and HLA-B\*35:01, all of the best-defined epitopes were ranked within the top 5th. However, four best-defined epitopes restricted by HLA-B\*57:01 and HLA-A\*02:01 scored within the worst 5th candidates: Nef<sub>120-128</sub> YFPDWQNYT, p15<sub>433-442</sub> FLGKIWPSYK, RT<sub>33-41</sub> ALVEICTEM, and p24<sub>161-172</sub> KAFSPEVIPMF.

### Optimal epitope prediction to analyze HIV-1 CRF01\_AE Gag ELISpot assay data using two *in silico* models

We next applied the model to predict optimal epitopes against HIV-1 CRF01\_AE Gag based on our previously obtained results in a Thai HIV cohort study [21]. In total, 31 peptide-HLA associations were analyzed: 5 in HLA-A, 13 in HLA-B, and 13 in HLA-C (Table S2). Among these, 10 overlapping peptides spanned previously reported epitopes (6 were best-defined epitopes and 4 were published but not enlisted as best-defined epitopes). In the DSM, 9/10 (90%) reported epitopes were successfully ranked within the 5th as significant epitope candidates, and all of the six best-defined epitopes ranked either the 1st or 2nd. In HLArestriCTOR, 8/10 (80%) epitopes were predicted as significant binders; 3 as SB, 4 as WB, and 1 as CB, but 2 epitopes (best-defined epitopes HLA-A\*02:07-restricted YL9, and HLA-B15-restricted KL9) were not predicted as significant binders. HLArestriCTOR also predicted another 16 sequences as potential epitope candidates: 1 as SB, 12 as WB, and 2 as CB. Intriguingly only one WB candidate was ranked within the top five by the DSM, reflecting a considerable degree of discrepancy between the two prediction methods.

8 previously unreported peptides were predicted by both models: HLA-B\*38:02-restricted p24<sub>198-205</sub> MQMLKETI (rank 1st in DSM and WB in HLArestriCTOR), HLA-B\*40:01-restricted p24<sub>311-321</sub> QEVKNWMTETL (2nd and SB), HLA-B\*46:01-restricted p24<sub>275-283</sub> RMYSPVVSIL (5th and SB), HLA-B\*58:01-restricted p17<sub>79-86</sub> YNTVVTLW (1st and WB), HLA-B\*58:01-restricted p17<sub>77-86</sub> SLYNTVVTLW (4th and WB), HLA-C\*01:02-restricted p24<sub>277-285</sub> YSPVSILDI (2nd and WB in p24<sub>271-285</sub> and 3rd and WB in p24<sub>276-290</sub>), HLA-C\*01:02-restricted p24<sub>276-285</sub> MYSPVSILDI (4th and WB both in p24<sub>271-285</sub> and p24<sub>276-290</sub>), and HLA-C\*01:02-restricted p24<sub>296-304</sub> YVDRFYKTL (1st and WB).

### Application of the *in silico* DSM to define the restricting HLA molecule

We conducted a <sup>51</sup>Cr release assay with a truncated peptide titration spanning the overlapping region between Gag p24<sub>271-285</sub> NKIVRMYSVPSILDI (NI15) and p24<sub>276-290</sub> MYSPVSILDIRQGPK (MK15). These induced the largest responses both in breadth and magnitude in our previous study, and were statistically associated with HLA-A\*02:07, HLA-B\*46:01, and HLA-C\*01:02, which we calculated to be under LD association [21]. We found strong killing against HLA-B\*46:01 and HLA-C\*01:02-matched p24<sub>276-285</sub> MYSPVSILDI (MI10)- and p24<sub>277-285</sub> YSPVSILDI (YI9)-pulsed target cells but not in any other condition (Figure S1). However, we could not further specify the restricting HLA molecule because a single HLA-matched target cell was not available due to the strong LD between them. Therefore, we conducted *in silico* analysis in order to identify the responsible HLA. Table 2 shows the results of the DSM between these two peptides (MI10 and YI9) and three candidate HLA alleles (HLA-A\*02:07, HLA-B\*46:01 and HLA-C\*01:02). Firstly,

with the DSM, none of these two peptides were predicted within the top five candidate epitopes when binding to HLA-A\*02:07 or HLA-B\*46:01, and neither scored significant binding using the HLArestriCTOR, eliminating these as the restricting HLA molecules. However in the model with HLA-C\*01:02, both two peptides ranked within the 5th; MI10 ranked as the 3rd in NI15 and the 4th in MK15, while YI9 was ranked as the 2nd in NI15 and the 3rd in MK15. Significant binding affinity of MI10 and YI9 to HLA-C\*01:02 was also predicted by HLArestriCTOR. Secondly, in the binding motif of HLA-C\*01:02 (x[AL][P]xxxxx[L]), both MI10 and YI9 encoded compatible or similar hydrophobic amino acids with the binding motif x[Y]xxxxxxx[I] in MI10 and xx[P]xxxxx[I] in YI9. Together, these results indicate that the optimal epitopes MI10 and YI9 are equally likely candidates recognized by HLA-C\*01:02, with YI9 ranking slightly higher in the DSM.

## Discussion

In this study, we demonstrated that the structure-based DSM can predict the peptide binding affinity with various HLA molecules, independently of peptide binding motif information. To our knowledge, this novel DSM is the first model of its kind that succeeded in predicting HIV-1 CTL best-defined epitopes, with better or at least equivalent accuracy to the latest binding motif-based program. We also found a high detection rate of best-defined epitopes independent of peptide size in the DSM, while the detection rate significantly decreased with longer epitopes in the other model.

Historically, comparisons of epitope prediction methods has generally shown that peptide-binding motif based methods outperform structure-based methods [23]. However, the increased availability of crystal structures of MHC-peptide complexes is enabling the development of prediction methods using such structural models and the calculation of free energy of binding [23,24]. In the review by Liao *et al* [23], their comprehensive comparison of structure-based models and peptide-binding motif models in epitope prediction showed that the structure-based model was able to outperform all other methods except the ANN model, which performed equally well. In our novel program, we use a measure of the binding affinity between the HLA molecule and the peptides at four residues spanning the N- and C-terminal.

**Table 2.** Prediction of the HLA restriction of Gag p24<sub>276-285</sub> MYSPVSILDI (MI10) and p24<sub>277-285</sub> YSPVSILDI (YI9) using *in silico* methods.

| HLA     | Binding motif    | Peptide | U_dock rank |      |               |
|---------|------------------|---------|-------------|------|---------------|
|         |                  |         | NI15        | MK15 | HLArestriCTOR |
| A*02:07 | x[L][D]xxxxx[L]  | MI10    | 13          | 13   |               |
|         |                  | YI9     | 14          | 16   |               |
| B*46:01 | x[M(I)]xxxxx[YF] | MI10    | 15          | 20   |               |
|         |                  | YI9     | 19          | 21   |               |
| C*01:02 | x[AL][P]xxxxx[L] | MI10    | 3           | 4    | WB            |
|         |                  | YI9     | 2           | 3    | SB            |

HLA restriction prediction against two reactive Gag peptides, Gag p24<sub>276-285</sub> MYSPVSILDI (MI10) and p24<sub>277-285</sub> YSPVSILDI (YI9) was performed by the docking simulation model, and the binding motif HLArestriCTOR 1.2. The U\_dock rank by the docking simulation model against MI10 and YI9 was analyzed in the original 15-mer peptides of Gag p24<sub>271-285</sub> NKIVRMYSVPSILDI (NI15) and p24<sub>276-290</sub> MYSPVSILDIRQGPK (MK15). SB: Strong Binder, WB: Weak Binder. doi:10.1371/journal.pone.0041703.t002

This covers not only the anchor position sites but also their flanking sites, which have a considerable effect on peptide-HLA binding; this may also have led to the high detection rate of best-defined epitopes independent of epitope size. Together with precise HLA crystal structure information, we have also incorporated a fine calculation model for binding affinity [18], giving the DSM a high detection rate of best-defined epitopes equivalent to that of the latest binding motif-based program.

Intriguingly there was a considerable degree of discrepancy between the two methods: 21.2% of the 52 best-defined epitopes were detected as significant epitope candidates only by the DSM, while 9.6% was detected only by the HLArestrictor. Furthermore, two epitopes which ranked within the bottom five by DSM were successfully predicted as a single candidate by HLArestrictor, whereas five epitopes which were not detected by HLArestrictor, were successfully predicted as the best candidates by the DSM. This result highlights the importance of combining programs with different approaches, for example those based on peptide binding motif information and those that do not require peptide binding motif information, consistent with previous report in class II HLA peptide binding prediction model [25].

We therefore applied both models to predict optimal epitopes in HIV-1 CRF01\_AE Gag and found 8 previously unreported optimal epitopes supported by both models. These potential epitopes need to be further confirmed *ex vivo* that they are true epitopes capable of stimulating T cell responses with either a <sup>51</sup>Cr release assay or tetramer assay. However, since the DSM alone predicted 11 other candidates that were not predicted by the HLArestrictor, combining both models would be important to reduce the cost of such experiments. Furthermore a substantial number of OLPs were recognized using an ELISpot assay but within the peptides that induced a response, no epitope was predicted by the HLArestrictor. This DSM would save the cost of experiments by reducing 26 potential candidate peptides to five.

The ability of the DSM model to accurately predict peptides was dependent on the HLA molecule in question, and our results suggest that this is due to variations in the C-terminal binding groove. Four best-defined epitopes restricted by the alleles HLA-A\*02:01 and HLA-B\*57:01 ranked among the worst from the 22nd up to the 26th in our program. In HLA-A\*02:01, both FK10 and AM9 coded Leucine (L) at the 2nd position of sequence, compatible with the HLA-A\*02:01 binding motif at the B pocket and scored a low and therefore strongly binding U<sub>dock</sub> score at the N-terminal site [−47.8 kcal/mol in FK10 (5th in N1-N8 terminal) and −54.4 kcal/mol in AM9 (2nd)]. However, the sequences did not match with the HLA-A\*02:01 binding motif at the C-terminal which contains a Valine (V) at the F pocket, and they scored the worst U<sub>dock</sub> scores [−14.1 kcal/mol in KF10 (8th) and −48.5 kcal/mol in AM9 (8th)]. A similarly low score at the C-terminal was also found in HLA-B\*57:01-restricted KF11 [−24.5 kcal/mol (8th)] and YT9 [−23.8 kcal/mol (8th)]. The importance of the C-terminal for peptide-binding stability has been previously reported [26], and with respect to structural differences between the B and F pockets, it is generally known that the B pocket has a rather round shape while the F pocket has a deep cleft-like shape, suggesting stricter peptide binding restriction at the F pocket compared to the B pocket among HLA-A\*02:01 and HLA-B\*57:01. In contrast, HLA-B\*27:05 and HLA-B\*35:01 had none or only one variant of their binding motif at C-terminal: x[R(K)]xxxxxxxx or x[R]xxxxxx[LFYRHK(MI)] in HLA-B\*27:05 and x[P(AV)]xxxxxxxx or x[P(AVYRD)]xxxxxx[YFMLI] in HLA-B\*35:01. In these two alleles, all of the best-defined epitopes ranked within the 5th. These results strongly suggest that the

diversity of peptide binding at the F pocket defines the accuracy or difficulty of epitope prediction by DSM.

Recent studies have highlighted the importance of HLA-C alleles for HIV viral control, for instance in the population-based study from Africa [27], existence of dominant HLA-C\*04-restricted epitopes [28], stimulation of NK cells through HLA-C and Killer-cell Immunoglobulin-like receptors (KIRs) [29,30], and HLA-C expression control by 35 kb upstream genotype of HLA-C allele and HIV viral control [31]. However, epitope mapping of HLA-C antigens has been held back for several reasons. Firstly, in *in vitro* studies it has been difficult to find target and effector cell combinations with singly matched HLA alleles which are not under LD association, as we found in our <sup>51</sup>Cr release assay. *In silico*, in contrast to HLA-A or B alleles, epitope prediction programs against HLA-C alleles have been sparse [9–11]. This can be attributed to the lack of reported epitopes information from HLA-C alleles, since binding motif-based models were originally programmed based on such reported data. Furthermore, LD of HLA-C alleles, especially with HLA-B alleles, hinders the confirmation of HLA-C alleles as the restricting alleles in statistical analyses. In our previous study, among 13 HLA-C-associated epitope candidates, nine were reported with HLA-A or B alleles which were under LD association [21]. Novel DSM could contribute to epitope detection by bypassing such obstacles to epitope prediction against HLA-C alleles.

This study had several limitations. First, we could not define the threshold of the U<sub>dock</sub> score degree itself in novel program as defined in HLArestrictor. Related with this limitation, considering the HLA polymorphism, reported epitope number, and comparison between alleles with/without original crystal structure information, further calculations will be warranted for the quality evaluation of DSM. Second, this is a computational epitope prediction model whose algorithm is solely based on the binding between the peptide and the HLA molecule. Although peptide-HLA binding is the most selective event for epitope determination [32], CTL activation is a multi-step process involving the processing of viral peptides by proteasome [22,33,34] and the recognition of the peptide-HLA complex by T cell receptors (TCRs) [35], both of which are not accounted for in the model.

In conclusion, we have shown here a novel *in silico* DSM which can be used for epitope mapping, and combined with a binding motif-based model, this will significantly reduce the required experimental burden for epitope identification in the development of a CTL-based vaccine for HIV.

## Supporting Information

**Figure S1 Identification of HLA-B\*46:01/C\*01:02-restricted Gag p24<sub>276–285</sub> MI10 and p24<sub>277–285</sub> YI9 by a <sup>51</sup>Cr release assay.** <sup>51</sup>Cr release assays under HLA-B\*46:01/C\*01:02-matched conditions were performed for each peptide. Significant % lysis was found in target cells pulsed with Gag p24<sub>276–285</sub> MI10: MYSPVSILDI and p24<sub>277–285</sub> YI9: YSPVSILDI. (PPTX)

**Table S1 Predicted best-defined epitopes using the docking simulation model and a comparison with HLArestrictor.** The docking simulation model was applied to predict epitopes within 15-mer peptides spanning best-defined epitopes and compared with those predicted with the HLArestrictor. The U<sub>dock</sub> score and their rank were calculated for each peptide in the docking simulation model, while with HLArestrictor the affinity thresholds of SB: Strong Binder, WB: Weak Binder, and CB: Combined Binder, and Non-binder were given, according to their definitions. (XLS)

**Table S2 Epitope prediction using the docking simulation model and HLArestrictor against *in vitro* HLA-restricted HIV-1 CRF01\_AE Gag epitope candidates.** Using previously reported HIV-1 CRF01\_AE Gag epitope candidates detected by ELISpot assays and statistical analysis, epitope prediction was performed by our novel docking simulation model and HLArestrictor. Among 31 15-mer peptide and HLA associations, six best-defined epitopes and four non-best defined epitopes were included. Bold, underlined sequences indicate positive candidates in dual models. SB: Strong Binder, WB: Weak Binder, and CB: Combined Binder. (XLSX)

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## Author Contributions

Conceived and designed the experiments: TM MY KA. Performed the experiments: MM KM TM MT BS. Analyzed the data: MM KM TM. Contributed reagents/materials/analysis tools: TM MY KA. Wrote the paper: MM KA.



# The Effect of HLA Polymorphisms on the Recognition of Gag Epitopes in HIV-1 CRF01\_AE Infection

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## Abstract

**Introduction:** The design of a globally effective vaccine rests on the identification of epitopes capable of eliciting effective cytotoxic T lymphocyte (CTL) responses across multiple HIV clades in different populations. This study aims to discern the effect of HLA polymorphisms and the cross-clade reactivity or clade-specificity of epitopes in Thailand where HIV-1 CRF01\_AE is circulating.

**Materials and Methods:** 14 peptides based on consensus HIV-1 CRF01\_AE amino acid sequences were designed for use in IFN- $\gamma$  ELISpot assays and <sup>51</sup>Cr release assays among 66 HIV-1 CRF01\_AE-infected Thai patients. For ELISpot responders carrying HLA alleles currently unknown to restrict CRF01\_AE epitopes, *in silico* epitope-HLA prediction was performed.

**Results:** 29/66 (43.9%) patients recognized at least one peptide. In total 79 responses were seen against all 14 peptides. 28/79 (35.4%) of the responses were in patients with HLA alleles previously reported to restrict CRF01\_AE epitopes, 24/79 (30.4%) responses were in individuals with HLA alleles previously reported to restrict epitopes of HIV clades other than CRF01\_AE, and the remaining 27/79 (34.2%) responses were not associated with HLA alleles previously known to restrict HIV epitopes. *In silico* epitope prediction detected 19 novel, epitope-HLA combinations, and 11/19 (57.9%) were associated with HLA-C alleles. We further confirmed a novel HLA restriction of a previously identified HIV-1 Gag epitope [p24<sub>122–130</sub>: PPIPVGDIY (PY9)] by HLA-B\*40:01 with a standard <sup>51</sup>Cr release assay.

**Discussion:** CTL recognition sites in HIV-1 Gag were similar among different clades but the HLA restriction differed in Thai patients. This disparity in HLA restriction along different populations illustrated the importance of clade- and population-specific HLA analysis prior to CTL vaccine design.

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## Introduction

The control of the Human Immunodeficiency Virus type 1 (HIV-1) epidemic requires the design of a globally effective HIV vaccine. However, the sequence diversity of HIV across clades and the host's human leukocyte antigen (HLA) polymorphism poses a major challenge in the development of a globally effective HIV-1 vaccine capable of inducing cross-clade reactivity [1–3]. The design of polyvalent vaccines aimed at inducing HIV-specific cytotoxic T lymphocyte (CTL) responses has been one of the main focuses in the field of HIV vaccinology for several reasons. Firstly, HIV-specific CTLs play a key role in the control of HIV-1 replication during acute infection and in determining the consequent viral set point [4]. Secondly, studies in macaques have shown that vaccine induced recruitment of Simian Immunodeficiency Virus (SIV)-specific CTLs can effectively control viral replication and slow disease progression [5,6]. Thirdly, unlike

neutralizing antibodies, CTLs target proteins such as Gag and Pol, which are relatively conserved across various clades [1,2,7]. Currently, there are 13 prototype HIV clades and 43 circulating recombinant forms (CRF) of HIV-1 group M in the world which are of global importance [2]. However, most immunogenicity studies of the CTL epitopes are conducted in the setting of clade B infection in Caucasian cohorts or clade C infection in African or Indian populations (Epitope Maps, Los Alamos database. <http://www.hiv.lanl.gov/>), and limited information is available on the immunogenicity of CTL epitopes in the CRF01\_AE subtype dominating the epidemic in south-east Asian countries such as Thailand. Here there is a unique class I HLA allele distribution and the prevalence of the highly protective HLA allele B\*57 is lower than in other ethnicities; 7%–9% among Africans, 5%–7% among Caucasians, and less than 5% among Asians [1].

HLA polymorphisms can also present a challenge in the design of a vaccine. The HLA loci are the most polymorphic genes in the

human genome [8]. As of February 2012, 1,757 of class I HLA-A, 2,338 of HLA-B, and 1,304 of HLA-C alleles have been reported in the IMGT/HLA database [9]. The pattern of HLA distribution and their influence on clinical progression differs among ethnic groups [1,10–12]. How this divergence across populations plays an effect on the CTL recognition of HIV-1 peptides is not yet fully elucidated, but understanding this is critical for the development of a universal CTL vaccine which delivers protection across various populations.

In the present study, the extent of T cell cross-reactivity to published HIV-1 CRF01\_AE sequences in 66 HIV-1 infected Thai patients was evaluated in *ex vivo* ELISpot assays using 14 peptides encoding the Gag protein of the CRF01\_AE sequence. The cross-clade specific T cell responses were further elucidated in a standard chromium release assay. We report here that 43% of CRF01\_AE infected individuals reacted to at least one peptide of the CRF01\_AE sequences that were tested. In this study we aimed to discern the effect of HLA polymorphisms and the cross-clade reactivity or clade-specificity of epitopes among HIV-1 CRF01\_AE infected Thai patients, in order to fill in the missing information on epitopes and HLA alleles in Asia.

## Materials and Methods

### Subjects

This study was approved by Thai Ministry of Public Health Ethics Committee as described elsewhere [13]. Written informed consent was obtained from all patients after explaining the purpose and expected consequences of the study. In case of patients who were school-age, we obtained the written informed consent from their parents as well. 66 HIV-1 CRF01\_AE chronically infected patients were recruited at the Lampang hospital, a government referral hospital in northern Thailand. Patients were eligible for inclusion if they were antiretroviral drug naïve at the time of the study. When we attempted to confirm the transmission route, we found one study patient transmitted as an intra-venous drug user (IDU). Thus we excluded this patient from the analysis and corrected the candidate number from 67 to 66. The heterosexual transmission is the predominant mode of HIV transmission in Thailand. It is known that CRF01\_AE spread mainly in heterosexually transmitted population. Although rare, subtype B is detected among IDUs [14–16]. In our 66 study patients, the transmission route of all infection was confirmed to be heterosexual by direct interview. Furthermore a part of study patients were confirmed to carry a CRF01\_AE virus by direct sequencing [13].

### Class I HLA typing

Genomic DNA was extracted from buffy coats using the QIAamp DNA blood Mini Kit (Qiagen, Hilden, Germany) and 4-digit class I HLA typing for A, B and C loci was performed by bead-based array hybridization (WAKFlow HLA typing kit, Wakunaga Pharmaceutical, Hiroshima, Japan) at the Kyoto HLA Laboratory, Kyoto, Japan.

### Synthetic peptides containing previously reported CTL epitopes

A set of 14 HIV-1 CRF01\_AE Gag peptides were designed based on CTL epitope regions published in the Los Alamos database at the time this study was planned in the year 2000. Of these, 7 encoded previously reported CRF01\_AE epitopes. For the remaining epitopes unreported in CRF01\_AE infections, the peptide sequences were altered to fit the dominant CRF01\_AE sequence as published in the Los Alamos database. The most predominant sequences among available single isolate sequences

were selected to design the peptides. We often extended the peptide length up to 12-mer to maximize the frequency of responses if the extension spanned other epitopes restricted by different allele. p24<sub>131–143</sub> KRWILGLNKIVR (KR13) was also included despite 13-mer, as it spans both HLA-B27-restricted KRWILGLNK (KK10) and HLA-A11 and A3-restricted ILGLNKIVR (IR9). Peptides were synthesized by Sigma Genosys (Hokkaido, Japan) with a high purity of >90% as determined by high-pressure liquid chromatography.

We further summarised the optimal epitope sequences of the tested 14 peptides and their variants reported in the Los Alamos database for consequent cross-clade reactivity or clade-specificity analysis (Figure 1). In total, 97 variants of the 14 epitopes have been previously reported from various clades; all of the 14 peptides included reported epitopes from clade B, and 7 of these included epitope reports from CRF01\_AE [p17<sub>18–29</sub>: KIRLRPGGKKKY (KY12), p17<sub>28–36</sub> KYRMKHLVW (KW9), p17<sub>77–85</sub> SLFNTIATL (SL9), p17<sub>82–91</sub> IATLWCVHQR (IR10), p24<sub>131–143</sub> KRWILGLNKIVR (KR13), p24<sub>161–172</sub> FRDYVDRFYKTL (FL12) and p24<sub>217–227</sub> ACQGVGGPSHK (AK11)]. The greatest diversity was found in KR13 with 18 epitope variants, followed by 14 in FL12 and p24<sub>127–138</sub> GDIYKRWILGL (GL12). In contrast, p17<sub>131–</sub> p24<sub>6</sub>: NYPIVQNA (NA8) had only one epitope variant, reported from clade B, while p24<sub>19–27</sub> TLNAWVKVV (TV9) had 3 epitope variants. Almost all of the restricting HLA alleles were derived from HLA-A or HLA-B alleles, and only 6 epitope variants in 3 peptides included HLA-C alleles as their restricting HLA allele. Out of 66 tested patients, 63 (95.5%) patients had at least one of previously reported HLA alleles which were responsible for CRF01\_AE epitope recognition: 63 (95.5%) patients with relevant A alleles, 21 (31.8%) with B alleles, and 7 (10.6%) with C alleles.

### Peptide-based IFN- $\gamma$ ELISpot assay

In ELISpot assay, 14 peptides were tested against all of 66 patients. Peripheral blood mononuclear cells (PBMCs) were isolated by density gradient separation using a Vacutainer CPT Cell Preparation Tube (BD, Franklin Lakes, NJ, USA) and washed twice with RPMI-1640 medium (Sigma-Aldrich, St. Louis, MO, USA).  $1 \times 10^5$  fresh PBMCs/well were then plated onto multi-Screen plates (MAHA54510; Millipore, Billerica, MA, USA) that had been coated overnight at 4°C with 50  $\mu$ l of anti-IFN- $\gamma$  capture Ab 1-D1-K (2  $\mu$ g/ml; Mabtech, Nacka Strand, Sweden). Peptides were added directly to wells at a final concentration of 1  $\mu$ M in 50  $\mu$ l of R10 and incubated at 37°C in 5% CO<sub>2</sub> for 24 hrs. PBMCs were stimulated with either media alone in negative control wells, 10  $\mu$ g/ml phytohaemagglutinin (PHA; Sigma-Aldrich) in positive control wells or peptides (1  $\mu$ M final concentration) for 24 hrs at 37°C. Plates were washed extensively with wash buffer (PBS/Tween20 0.001%), followed by incubation with biotinylated anti-human IFN- $\gamma$  mAb (0.5  $\mu$ g/ml; clone 7-B6-1; Mabtech) in PBS/10% FBS for 2 hrs at 37°C. Following six further washes with wash buffer, 2  $\mu$ g/ml streptavidin HRP (Mabtech) was added to wells and incubated for 1 hr at room temperature. Spots were visualized by adding BCIP/NBT substrate (Millipore) and counted by an independent scientist in a blinded fashion using an automated Enzyme-Linked Immunospot (ELISpot) Plate Reader System with the KS 4.3 software. Positive spot forming units (SFU) were counted and results were expressed as SFU/ $1 \times 10^6$  PBMCs. A response was considered positive if it was four times higher than the negative control and greater than 55 SFU/ $1 \times 10^6$  PBMC [17].



p24<sub>3</sub>: SSSKVSQNYPIV (SV12) had the least number of responders, recognized by one individual, followed by NA8 and KR13 recognized by two and three patients, respectively.

Amongst the 79 responses detected in the ELISpot assay, 42 (53.2%) were responses against the 7 peptides that contained previously reported CRF01\_AE epitopes. 52 of the 79 ELISpot responses (65.8%) were induced in patients carrying at least one HLA allele previously reported to restrict the tested epitopes. Of these, 28 out of 52 responses (53.8%) were induced in patients with HLA alleles known to restrict the tested CRF01\_AE epitopes, and the remaining 24 responses (46.2%) were in patients carrying HLA alleles reported to restrict the epitopes in other subtypes. Furthermore, 18 out of these 24 responses (75%) were against peptides containing epitopes previously unreported in CRF01\_AE infections, indicating that these are cross-clade reactive epitopes, while 6 out of these 24 responses (25%) were against peptides containing known CRF01\_AE epitopes.

The remaining 27 out of 79 (34.2%) responses were in individuals carrying HLA alleles previously not known to restrict the tested epitopes, suggesting that at least one third of the peptide responses were restricted by unknown HLA alleles (Table S2). 19 out of these 27 responses were against the peptides containing epitopes previously unknown to be CRF01\_AE epitopes, and the remaining 8 were against peptides containing reported CRF01\_AE epitopes.

#### Prediction of epitopes and their HLA restriction using an *in silico* model

For the 27 responses induced in patients carrying HLA alleles previously not known to restrict the tested epitopes, we performed a prediction of the epitope and its restricting HLA allele using the latest peptide-binding motif based *in silico* program, HLARESTRICTOR (Figure 2). In total, 19 dominant epitope candidates and their associated HLA alleles were detected amongst 6 peptides. Within these 6 peptides, the 2 peptides KW9 and SL9, which contained previously reported CRF01\_AE epitopes, 7 dominant epitope candidates were detected, while we identified 12 epitope candidates and their associated HLA alleles in the remaining 4 peptides containing epitopes unreported in CRF01\_AE (SV12, QV12, GL12, and NL10). 11 out of 19 (57.9%) epitope candidates were associated with HLA-C alleles, while 7 were associated with HLA-B alleles, and 1 was associated with an HLA-A allele. According to the binding affinity thresholds set by HLARESTRICTOR, out of the 19 epitope-HLA complex candidates identified in our study, 1 was detected as SB, 13 as WB, and 5 as CB. Surprisingly, more than half (11/19) were associated with HLA-C alleles including SB, suggesting the possibility that there may be many HLA-C-associated epitopes that remain unreported.

#### Identification of a novel epitope-HLA association in CRF01\_AE infection with a <sup>51</sup>Cr release assay

Using a <sup>51</sup>Cr release assay, we further succeeded in demonstrating a novel HLA association of the CRF01\_AE Gag epitope p24<sub>122-130</sub> PPIPVGDIY (PY9), which had been previously reported to be restricted by HLA-B35 and B53 in clade A, B, C, D, CRF02\_AG and HIV-2, but not in CRF01\_AE. Significant lysis against the PY9 CRF01\_AE variant was only detected in the presence of HLA-B\*40:01-matched target cells, confirming HLA-B\*40:01 as the restricting HLA allele (Figure 3). Out of 9 patients who made an ELISpot response to the peptide PY9, one patient carried the previously reported B7 supertype HLA-B\*55:02, and two responders carried the newly detected HLA-B\*40:01 allele (Table S2).

## Discussion

HIV-1 vaccines in clinical trials today are based on sequences derived from clades B, C, or A, but the identification of conserved HIV-1 CTL epitopes and an understanding of cross-clade CTL responses will be essential to broaden the vaccine responses to include other subtypes of HIV. In the present study, we performed the IFN- $\gamma$  secreting CTL responses in a Thai cohort with CRF01\_AE infection using a set of 14 well-established epitopes and designing CRF01\_AE peptide analogues to these epitopes. Our Thai patients infected with CRF01\_AE responded to all CRF01\_AE analogues, which were not previously reported as CRF01\_AE epitopes. Interestingly, however, these analogues were recognized by patients carrying HLA alleles that differed from those reported to restrict the published epitopes, exemplified by our confirmation of a novel HLA restriction of the p24 epitope PY9 by HLA-B\*40:01 with a <sup>51</sup>Cr release assay. Our findings indicate that the CTL recognition sites in HIV-1 Gag may be shared among different clades but these can be restricted by different HLA molecules, depending on the HLA polymorphism within the cohort.

The process of CTL activation is a highly sensitive and specific process, and a single mutation in the epitope can result in the lack of recognition by the CTLs, the impairment of peptide processing [19,20], or the inhibition of the formation of peptide-HLA complexes [21,22]. Therefore, the inter-clade and intra-clade sequence diversity of HIV-1 has been considered to be the primary barrier to the development of a globally effective vaccine. However, in this study, we have identified the cross-clade epitope candidates which had previously not been reported in CRF01\_AE. 37 responses were found across 7 non-CRF01\_AE epitopes, suggesting that these are novel cross-clade epitope candidates. It is noteworthy that although CRF01\_AE is a recombinant HIV-1 with its Gag sequence derived from clade A (13.4% of Gag sequence discrepancy between clade A and CRF01\_AE) [2], the three peptides SV12, NA8 and NL10 have not been reported in clade A.

Over the years, there has been much effort to identify HIV-1 epitopes that mediate potent cross-clade T cell responses [23,24]. However, previous methods utilised peptide pools [23–26] or CTL clones with predetermined HLA alleles to observe cross-clade reactivity [27,28]. The results of our study has shown at the level of single peptide, the lack of peptide recognition seen in the previous studies may have been due to the difference in HLA restriction allele among different population, rather than lack of CTL recognition.

Compared to clade B or C, there is far less epitope information available for clade A. This is the dominant clade circulating in eastern Europe, central Asia and eastern to central Africa, and given that HLA frequencies differ greatly between each region, we anticipate that a detailed epitope mapping study would further reveal the effect of HLA polymorphisms on a particular epitope's immunodominance and its association with viral control, as has been observed among other clades and ethnic groups [29,30].

There are many reports of cross-clade reactivity in HIV-specific CTL responses [31–33]. The mechanism of epitope cross-clade reactivity is poorly understood, however it has been proposed that the more conserved the epitope, the more likely it is to instigate cross-clade reactivity [7], and the sequence variability at anchor positions of the HLA binding motif is thought to be the determining factor [2,32–35]. However, our previous studies of ELISpot assays using overlapping peptides have shown that some peptides containing previously reported epitopes did not induce T cell responses in patients carrying HLA alleles known to restrict

| Site    | Peptide | HXB2    | Sequence                | HLA     | Binding motif              | Affinity (nM) | % Rank | BL |
|---------|---------|---------|-------------------------|---------|----------------------------|---------------|--------|----|
| p17     | KW9     | 28-36   | K Y R M K H L V W       |         |                            |               |        |    |
|         | YW8     | 29-36   | - - - - -               | C*06:02 | xxxxxxx[LIVY]              | 197           | 0.25   | SB |
|         | KW9     | 28-36   | - - - - -               | C*06:02 | xxxxxxx[LIVY]              | 764           | 1.5    | WB |
|         | KV8     | 28-35   | - - - - -               | C*06:02 | xxxxxxx[LIVY]              | 789           | 1.5    | WB |
|         | YW8     | 29-36   | - - - - -               | C*07:01 | x[RHK]xxxxx[Y]             | NA            | 1.5    | WB |
|         | YW8     | 29-36   | - - - - -               | C*07:02 | xxxxxxx[YFL]               | NA            | 1.5    | WB |
|         | SL9     | 77-85   | S L F N T I A T L       |         |                            |               |        |    |
|         | SL9     | 77-85   | - - - - -               | C*03:02 | x[A]xxxxx[FWY]             | 145           | 4.0    | CB |
|         | SL9     | 77-85   | - - - - -               | C*03:04 | x[A]xxxxx[LM]              | 399           | 5.0    | CB |
| p17-p24 | SV12    | 124-3   | S S S K V S Q N Y P I V |         |                            |               |        |    |
|         | KI8     | 127-2   | - - - - -               | C*07:04 | x[RQ]xxxxx[LM]             | NA            | 2.0    | WB |
| p24     | QV12    | 13-24   | Q P L S P R T L N A W V |         |                            |               |        |    |
|         | QA10    | 13-22   | - - - - -               | B*35:60 | (B*35:01) x[P]xxxxx[YFMLI] | NA            | 1.5    | WB |
|         | SV9     | 16-24   | - - - - -               | B*56:21 | (B*56:01) x[P]xxxxx[A(L)]  | 1565          | 1.5    | WB |
|         | SW8     | 16-23   | - - - - -               | B*56:21 | (B*56:01) x[P]xxxxx[A(L)]  | 1950          | 1.5    | WB |
|         | QL8     | 13-20   | - - - - -               | B*56:21 | (B*56:01) x[P]xxxxx[A(L)]  | 2188          | 1.5    | WB |
|         | QW11    | 13-23   | - - - - -               | B*56:21 | (B*56:01) x[P]xxxxx[A(L)]  | 2243          | 2.0    | WB |
|         | QA10    | 13-22   | - - - - -               | B*56:21 | (B*56:01) x[P]xxxxx[A(L)]  | 2298          | 2.0    | WB |
|         | LV10    | 15-24   | - - - - -               | C*12:03 | x[A]xxxxx[FWY]             | 214           | 5.0    | CB |
|         | LW9     | 15-23   | - - - - -               | C*12:03 | x[A]xxxxx[FWY]             | 282           | 6.0    | CB |
|         | LV10    | 15-24   | - - - - -               | C*14:02 | x[YP]xxxxx[FWY]            | 488           | 6.0    | CB |
|         | GL12    | 127-138 | G D I Y K R W I I L G L |         |                            |               |        |    |
|         | DL11    | 128-138 | - - - - -               | A*26:01 | x[VTIFL]xxxxx[YF]          | 647           | 1.5    | WB |
|         | NL10    | 193-202 | N A N P D C K S I L     |         |                            |               |        |    |
|         |         | 195-202 | - - - - -               | B*07:02 | x[P(V)]xxxxx[L]            | 302           | 1.5    | WB |

**Figure 2. *In silico* epitope prediction for ELISpot responders carrying HLA alleles currently unknown to restrict CRF01\_AE epitopes.** We found 27 CRF01\_AE specific CTL responses induced in patients carrying HLA alleles previously unknown to restrict CRF01\_AE epitopes. Prediction of the optimal epitope within the peptide and its restricting HLA allele was performed using the *in silico* epitope prediction model HLArestrictor. In total, 19 epitope-HLA combinations were detected with binder levels defined as SB (Strong Binder), WB (Weak Binder), or CB (Combined Binder). NA: Not available, and BL: Binder level.  
doi:10.1371/journal.pone.0041696.g002

these epitopes even if their epitope sequences at anchor positions were compatible with the binding motif of the restricting HLA alleles [36]. The lack of a T cell response despite the binding motif matching with the epitope sequences may be accounted for by the amino acid sequence of the flanking regions, especially when the epitopes are shorter than the peptide tested, [19,20] or sequence variation in positions other than the anchor regions, both of which may influence the recognition of the MHC-peptide complex by T cell receptors (TCRs) [21,22].

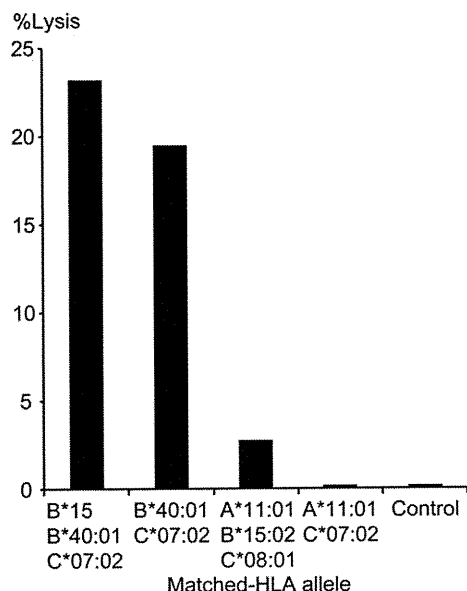
Recently, *in silico* algorithms have been used to biometrically recombine and design vaccine epitopes that elicit CTL responses of higher breadth (number of peptide recognition) and depth (response of variants within an epitope) for experimental studies in rhesus macaques [37,38]. Taken together with our data suggesting the potential of multiple epitopes with cross-clade reactivity, these studies support the possibility of the development of a cross-clade reactive vaccine.

In our study we were also able to use epitope prediction models to identify epitopes within peptides that induced responses in patients carrying HLA alleles previously unknown to restrict the tested CRF01\_AE epitopes, highlighting the potential of such *in silico* models to identify epitopes restricted by rare HLA alleles like HLA-C. CTL-epitope information for HLA-C alleles has been sparse compared to A and B alleles, as can be observed in the Los

Alamos database. The lower level of cell surface expression of HLA-C alleles compared to the other alleles [39–41] and the lack of protective HLA-C allele information in population studies [10–12] has hampered epitope mapping against HLA-C alleles. However, a recent single nucleotide polymorphism (SNP) study in a Caucasian cohort identified a region 35 kb upstream of the gene encoding the HLA-C molecule (–35(C/T)) as the second strongest determining factor for viral control [42], capable of inducing either a higher (C) or lower (T) expression level of HLA-C on the cell surface [43]. As seen from the recent identification of dominant HLA-C-restricted epitopes [44], we can expect an increasing number of studies extending our understanding of how the HLA-C alleles contribute to viral control. Epitope information from HLA-C alleles will also contribute to our knowledge of a given epitope's cross-clade reactivity or clade-specificity. It is warranted to study further especially to demonstrate the potentially novel HLA alleles restriction listed in Figure 2.

As a post hoc analysis, this study also has several limitations. Firstly, due to limited PBMCs available from the patients we focused on Gag peptides and did not investigate responses to whole viral proteins. However, Gag, especially the p24 protein, is one of the most important target antigens for viral control [36,45,46], due to their role in the selection of escape mutations that lead to viral fitness costs [47], its sequence stability compared





**Figure 3. Cytotoxicity assay with T cells Demonstration of a novel epitope-HLA association by  $^{51}\text{Cr}$  release assay.** Specific lysis of Gag peptide p24<sub>122–130</sub> PPIPVGDIY (PY9) pulsed allogeneic target cells by effector CTLs from a HLA-B\*40:01+ donor was assessed in a chromium release assay. The Y axis shows percentage specific lysis at an E:T ratio of 20:1 with the lysis (%) of unpulsed target cells subtracted. Effector cells were derived from patient 1509. HLA-B\*40:01 matched cells pulsed with PY9 were also recognized by patient 326 (data not shown). HLA alleles shared by target cells and effector cells are shown; control indicates HLA-unmatched cells. doi:10.1371/journal.pone.0041696.g003

to other viral particles [1,2,7], the abundance of the protein on incoming virions [48], as well as its rapid antigen presentation following viral infection [49]. For the development of a globally effective CTL-induced vaccine, detailed mapping of Gag epitopes and their restricting HLA alleles will be essential. Secondly, in this study we analysed 66 subjects, but further studies with larger population sample sizes may help identify cross-clade CTL epitopes restricted by minor HLA alleles and allow us to differentiate linkage disequilibrium effects from true associations. Thirdly, since the CTL epitope information was limited when these 14 peptides were designed in the year 2000, this peptide selection may not be optimal in the current setting. However, even after 2000, surprisingly only three CRF01\_AE-associated epitopes with responsible four digits HLA allele were reported according to the latest Los Alamos database 2012; p24<sub>35–43</sub> EVIPMFSAI restricted by HLA-A\*26:01 and A\*26:03 [50], p24<sub>145–153</sub> YSPVSILDI by HLA-C\*01:02 [51], and p24<sub>209–217</sub> ATLEEMMTA by HLA-A\*02:06 [52]. This is why we think that our data is still worth reporting. Fourthly, we used five 12-mer peptides and one 13-mer peptide in this study to maximize the frequency of responses by spanning more epitopes. However, this extension of the peptides may have lowered the peptide responses

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but we did not find an obvious tendency that the longer peptides had less response. For optimal epitope and responsible HLA confirmation, further experiment with peptide narrow down will be required.

Fifthly, in computational epitope prediction, although more than half of candidates were detected from HLA-C alleles, prediction of HLA-C allele-associated epitopes was not accurate compared to that of HLA-A or B-associated as commented by programmers [18]. It is warranted to demonstrate the potentially novel HLA alleles restriction listed in Figure 2.

From our findings, we conclude that the HLA restriction of an epitope in a given population is dictated by two factors: HLA polymorphism within the population and viral sequence diversity. Previous studies on CTL cross-recognition have focused on the sequence divergence between the clades, and have promoted the inclusion of highly conserved epitopes in CTL-epitope vaccines [7,32–35]. However, we have shown that in different cohort populations, CTL recognition of the same epitopes may occur through unique HLA restrictions. We believe that the HLA restriction of epitopes should be determined for a given population prior to the selection of vaccine candidate immunogens, as certain epitopes will be able to induce broad, cross-clade responses which will increase the potential efficacy of the vaccine in the given population. We hope that the novel epitopes and HLA restrictions identified in this study will contribute to the development of a cross-clade reactive HIV vaccine.

## Supporting Information

**Table S1 HLA distribution among 66 HIV-1 CRF01\_AE-infected Thais.** HLA distribution by population frequency is shown. (XLSX)

**Table S2 HLA allele information of ELISpot assay responders and its compatibility with previous report.** In total, 79 responses among 14 epitopes were identified. HLA allele information of ELISpot assay responders and its compatibility with previous report of responsible HLA alleles listed in Los Alamos database are shown. (XLSX)

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## Author Contributions

Conceived and designed the experiments: BS PS KA. Performed the experiments: BS MT SN. Analyzed the data: MM TM KA. Contributed reagents/materials/analysis tools: BS MT SN PP KA. Wrote the paper: MM SN TM KA.

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