Short- and Long-Term Pharmacologic Measures of HIV Pre-exposure Prophylaxis Use Among High-Risk Men Who Have Sex With Men in HPTN 067/ADAPT

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Background: The effectiveness of oral emtricitabine (FTC)/tenofovir (TFV) disoproxil fumarate–based HIV pre-exposure prophylaxis (PrEP) depends on adherence. Pharmacologic measures help interpret patterns and predictors of PrEP adherence.

Setting: We analyzed data from the subsample of men who have sex with men enrolled in HPTN 067/ADAPT in Bangkok, Thailand, and Harlem, NY, U.S.

Methods: After a 5-week directly observed therapy period, participants were randomized to daily, time-driven, or event-driven PrEP. Follow-up occurred at weeks 4, 12, and 24 after randomization. Plasma and hair FTC/TFV levels indicated short- and long-term PrEP use, respectively. Electronic pill bottle data (Wisepill) were collected weekly. Pearson correlation coefficients between PrEP use measures were calculated; linear mixed models assessed predictors of plasma and hair drug concentrations.

Results: Among 350 participants (median age: 31 years, interquartile range: 25–38), 49.7% were from Harlem, half had less than college education, and 21% reported heavy alcohol use. In multivariable models, being enrolled in Harlem, being in non–daily arms, and having less than college education were associated with lower hair FTC/TFV concentrations; heavy alcohol use was associated with higher concentrations. Similar results were found for plasma concentrations by site and arm, but older age and greater number of sex partners were associated with higher concentrations. Hair and plasma FTC/TFV concentrations were moderately correlated with Wisepill data ($r \approx 0.29$) across visits.

Conclusions: In HPTN067, plasma, hair, and Wisepill data correlated with one another and served as complementary adherence measures. Site, arm, education, age, alcohol, and sexual behavior influenced patterns of adherence.

Key Words: pre-exposure prophylaxis, HIV prevention, men who have sex with men, biomarkers, hair levels, plasma levels

(J Acquir Immune Defic Syndr 2019;82:149–158)
INTRODUCTION

Daily oral emtricitabine (FTC)/tenofovir (TFV) disoproxil fumarate (TDF)-based pre-exposure prophylaxis (PrEP) has demonstrated efficacy in preventing HIV transmission and is being scaled up among high-risk populations, including men who have sex with men (MSM). Randomized trials of PrEP, delivered either daily or on-demand, reported reductions in HIV incidence (between 44% and 86% in intervention groups), which correlated strongly with objective adherence measures. Moreover, in trials where pharmacologic measures identified low overall PrEP adherence (eg, FEM-PrEP, VOICE), the efficacy of the intervention was nil. PrEP demonstration projects have shown the effectiveness of PrEP for HIV prevention in more “real-world” settings and, whereas some participants seem to be more adherent to PrEP when they know the product is effective, not all choose to initiate or adhere during risk periods. PrEP delivery programs must now focus on understanding PrEP pill-taking patterns and improving PrEP adherence to maximize its effectiveness among high-risk populations.

PrEP adherence monitoring is crucial for accurately interpreting PrEP effectiveness and identifying individuals who may benefit from additional adherence support. However, PrEP delivery projects vary in the adherence metrics used, despite limitations of each. For example, self-reported adherence is subject to recall or social desirability bias and may considerably overestimate PrEP use. Electronic monitoring devices, such as Wisepill (Wisepill Technologies, Cape Town, South Africa), and medication event monitoring systems overcome some of these biases but do not measure actual drug ingestion or drug levels in target tissues. PrEP drug levels in various biomatrices represent different periods of drug exposure and have shown utility in PrEP studies. Plasma drug concentrations represent a small window of exposure (up to 1 week before sample collection, depending on the assay) and could be susceptible to intrapatient variability and “white-coat effects,” whereby participants take doses just before a clinic visit without consistent use, although this issue was not observed in previous PrEP clinical trials. PrEP drug levels in hair samples (which are noninvasive to collect and inexpensive to store) provide data on long-term drug exposure (weeks to months) and have been used in several PrEP studies.

Combining and comparing metrics of PrEP adherence (electronic and pharmacologic) will further assess their utility, characterize predictors and patterns of short- and long-term PrEP dosing, and inform future PrEP delivery and adherence interventions. An analysis found that the combination of plasma and hair data had a higher ability to discriminate between low, moderate, and high levels of adherence than the use of a single PrEP exposure measure. In our study, we compared Wisepill data on PrEP dosing with plasma and hair FTC and TFV concentrations in a sample of 350 HIV-uninfected MSM participating in a PrEP delivery trial in Cape Town, South Africa, and medication event monitoring systems and Wisepill data on PrEP dosing with plasma and hair FTC and TFV concentrations in a sample of 350 HIV-uninfected MSM participating in a PrEP delivery trial in Cape Town, South Africa, and medication event monitoring systems. The HIV Prevention Trials Network (HPTN) 067/Alternative Dosing to Augment PrEP Pill Taking (ADAPT) study was a phase 2, randomized, open-label clinical trial of daily versus intermittent oral FTC/TDF-based PrEP conducted from 2011 to 2014. The study enrolled MSM in Bangkok, Thailand, and Harlem, NY, US, with the main study findings described previously. Although this study also enrolled transgender women in Bangkok and Harlem and cisgender women in Cape Town, South Africa, as has been reported elsewhere, this particular analysis is restricted to MSM participants to minimize variability in risk factors. Participants were eligible for enrollment if they were HIV-antibody–negative, 18 years and older, literate in English or Thai and able to consent, reported sex with a man in the past 6 months, and had at least 1 risk factor for HIV in the 6 months before enrollment, including sex with more than 1 male partner, history of sexually transmitted infection, transactional sex, or sex without a condom with an HIV-infected partner or a partner of unknown status.

Participants completed a 5-week directly observed therapy period and were then randomly assigned to 1 of 3 open-label FTC/TDF PrEP dosing regimens: daily (1 tablet every day); time-driven (1 tablet twice a week, plus a post-sex dose); and event-driven (1 tablet both before and after sex). Regimens were assigned in a 1:1:1 ratio for each site, and participants, staff, and investigators were all aware of treatment assignments. After randomization, participants received a 1-month supply of PrEP with the Wisepill device and counseling about their dosing regimen. Follow-up visits occurred every 4 weeks until week 24 after randomization, with 30-day PrEP refills provided at each visit.

Data Collection

During enrollment and follow-up visits, participants underwent HIV testing and received HIV counseling, adherence support (Next Step Counseling), and PrEP refills. Blood and hair samples were collected at 4-, 12-, and 24-week visits for retrospective analysis of drug concentrations, which were not reported to participants or used in adherence counseling. Participants completed computer-assisted self-interviewing surveys at all visits to collect data on demographics, HIV risk perception, knowledge, attitudes, and beliefs about PrEP, drug and alcohol use, and depression, along with facilitators and barriers to adherence. These questions were developed based on knowledge of the study sites and previous PrEP trials. Alcohol use was measured using the validated Alcohol Use Disorders Identification Test (AUDIT) scale (range 0–40), in which a sum score ≥8 indicates heavy alcohol use.
Measures of PrEP Use

Daily PrEP use was measured using data from Wisepill electronic monitoring devices. Participants were asked to complete weekly in-person or phone interviews with trained staff who reviewed each recorded device opening and asked the participant to confirm whether the Wisepill device opening was reflective of an ingested dose (rather than a curiosity opening, device refill, or pocket dose). Weekly interview data were used to adjust Wisepill data by correcting dates and times for doses removed and taken later, doses removed but not taken, and doses taken from a container other than the Wisepill (“Wisepill-prompted weekly interviews”). Weekly interview data were used as a measure of PrEP use if no Wisepill data were available, and participants were also asked about dates, times, and types of sex acts during these interviews.

Blood was collected and processed for plasma, and FTC/TFV levels were quantified via liquid chromatographic–tandem mass spectrometric analysis within the Clinical Pharmacology Analytical Laboratory (Johns Hopkins University, Baltimore, MD). The lower limits of quantification for both FTC and TFV in plasma are 0.31 ng/mL. For hair collection, approximately 50–100 stands of hair were cut as close as possible to the scalp in the occipital region, placed in aluminum foil, and stored at room temperature until shipped to the University of California, San Francisco Hair Analytical Laboratory. The proximal section of the hair was chopped into 1- to 2-mm segments (corresponding to dosing in the previous month) and FTC/TFV concentrations quantitated via liquid chromatographic–tandem mass spectrometric. Hair levels were normalized by weight, and lower limits of quantification for TFV and FTC concentrations were 0.002 and 0.02 ng/mg, respectively. Plasma and hair assays were validated in accordance with the U.S. Food and Drug Administration bioanalytical guidelines and have been approved by the Division of AIDS (DAIDS) Clinical Pharmacology and Quality Assurance program in the DAIDS at the National Institutes of Health.25,32

Statistical Analyses

Descriptive statistics summarized sample characteristics. FTC and TFV drug concentrations were log-transformed in all analyses by taking the natural logarithm of the concentration. Pharmacologic measures below the lower limits of quantification were set equal to that limit before log transformation.

Pearson correlation coefficients assessed correlations between Wisepill and pharmacologic measures at the 3 follow-up visits when plasma and hair samples were collected. In the primary correlation analysis, we not only included Wisepill and continuous drug concentration values from participants in all arms together but also conducted sensitivity analyses restricting the sample to each arm separately. We compared the total number of device openings from the Wisepill data in the previous week to plasma drug concentrations. We compared Wisepill data in the previous month to hair drug concentrations. Correlation analyses were restricted to the sample of participants with Wisepill, plasma, and hair data available at a given time point, and those missing at least one measure were excluded.

Four linear mixed models with random intercepts assessed predictors of log-transformed plasma and hair FTC/TFV drug concentrations while accounting for repeated measures. In our primarily models, plasma and hair drug concentrations were parameterized as continuous outcomes, rather than using a cutoff to represent adherence thresholds defined in daily dosing studies, and served as proxy measures for recent PrEP dosing and longer-term PrEP use, respectively. Study visit, arm (daily, time-driven, and event-driven), site (Harlem, Bangkok), sexual activity (number of sex acts in the previous 3 months), and interaction terms for arm and sexual activity were included in all models based on a priori knowledge that these factors were related to PrEP dosing. We assessed several additional covariates for inclusion in the models, including age, education, marital status, drug use, alcohol use, height, weight, serum creatinine, depression, sex without a condom, and perceived HIV vulnerability and used a forward stepwise selection method to choose the maximum covariate set for all 4 models. Covariates were added to the multivariable model if they demonstrated $P$ values <0.10. We back-transformed regression model covariates to determine fold-effects, defined as the fold change in drug concentration associated with a 1-unit increase in the predictor. We also conducted a secondary analysis examining covariates associated with hair TFV concentrations indicative of about 4 PrEP doses per week (TFV $\geq 0.023$ ng/mL as established in the STRAND study).25 This analysis was restricted to participants in the daily arm only.

All analyses were conducted using SAS 9.4 (Cary, NC).

Ethical Statement

Institutional review board approvals were obtained locally in Harlem and Bangkok and via the U.S. Centers for Disease Control and Prevention. The study protocol was reviewed by the National Institutes of Health DAIDS before implementation. Participants provided written informed consent in their preferred language. The protocol was registered at ClinicalTrials.gov (identifier NCT01327651).

RESULTS

Participant Characteristics

The HPTN 067 study randomized 350 MSM participants, including 174 (49.7%) in Harlem and 176 (50.3%) in Bangkok (Table 1). A total of 116 (33.1%) participants were randomized to the daily PrEP arm, and 117 (33.4%) were assigned to each of the intermittent dosing arms. The median age at enrollment was 31 years [interquartile range (IQR) 25–38 years]. Approximately, 143 (82.2%) participants at the Harlem site and 28 (15.9%) participants at the Bangkok site received less than a college education ($P$ value <0.001). Over half of the participants in Harlem reported substance use in the 3 months before enrollment (N = 108; 62.1%), compared with only 24.4% of Bangkok...
participants (N = 43; P value <0.001). More participants in Harlem reported having any unprotected sex in the previous 3 months than in Bangkok (69.5% versus 37.8%, P value <0.001).

Wisepill data indicate that participants took PrEP differently according to the study arm, as expected (P value <0.001). For example, participants in the daily dosing arm took a median of 6.0 doses/wk (IQR 3.7–6.7), compared with 1.4 doses/wk in the event-driven arm (IQR 0.7–2.4) and 2.2 doses/wk in the time-driven arm (IQR 1.8–2.8).

We had Wisepill data indicating the occurrence of at least 1 bottle opening for 344 (98.3%) participants over follow-up, including 344 from weeks 1–4, 335 from weeks 5–12, and 312 participants from weeks 13–24 visits. Plasma samples were collected and analyzed at 969 of 999 attended study visits (97.0%), including 100% of attended visits in Bangkok and 93.6% of attended visits in Harlem. Hair samples were collected at 827 study visits (519 visits in Bangkok and 308 visits in Harlem), with a 78.8% completion rate of sample collection reflecting acceptability and availability of hair for sampling. However, only a subset of these data were processed for analysis (N = 436 samples) because of prespecified cost restrictions for hair assays. The primary reason for missing hair samples was insufficient quantity of hair for sample collection, which was more prevalent in Harlem than in Bangkok. Retention rates were high in the cohort, with 88.0% of participants attending the 24-week visit, although retention differed by site (96.6% in Bangkok vs. 78.8% in Harlem). Geometric mean FTC and TFV concentrations were greater among participants in the daily arm than in the full sample and decreased over the duration of follow-up in both the full sample and among participants in the daily arm, indicating waning PrEP use over time (Table 2).

**Correlations Between Measures of PrEP Use**

Correlation analysis between Wisepill data, plasma FTC/TFV concentrations, and hair FTC/TFV concentrations was restricted to participants with all PrEP use measures at a given visit (151 participants at week 4; 125 at week 12; and 128 at week 24). Wisepill data were moderately correlated with hair and plasma concentrations of both drugs across all arms (correlation coefficients ranged from 0.29–0.61, all P values <0.05; Fig. 1). In general, the correlations between measures were weaker at the week-4 visit (range 0.29–0.47) than at the 24-week visit (range 0.37–0.61). Correlations between plasma and hair TFV levels were weaker than other reported correlations and did not increase substantially over time in comparison with correlations between Wisepill data and pharmacologic measures. Similar correlations were observed when restricting the analysis to participants in the daily arm only (range 0.24–0.70), the time-driven arm (range 0.24–0.58), and the event-driven arm (range 0.27–0.59).

**Factors Associated With Pharmacologic Measures of PrEP Use**

The analysis of factors associated with hair and plasma drug concentrations included data for 381 hair TFV, 379 hair FTC, 946 plasma TFV, and 946 plasma FTC samples, after excluding those with missing covariate data.

In multivariable models of hair concentrations, participants in the intermittent arms who reported zero sex acts had lower concentrations of log-transformed hair TFV and FTC during follow-up than those in the daily arm who reported zero sex acts (P value <0.001; Table 3) when controlling for other variables in the model. The number of sex acts did not influence hair drug concentrations among participants in the daily arm (the main effect for sexual activity was not statistically significant). However, we observed a statistically significant interaction effect between the study arm and number of sex acts. Specifically, as the number of reported sex acts increased, participants in the event-driven arm were estimated to have higher hair TFV and FTC concentrations than those in the daily or time-driven arms, indicating that those with

| TABLE 1. Enrollment Characteristics Among MSM Randomized in the HIV Prevention Trials Network (HPTN) 067 Study in Bangkok, Thailand, and Harlem, New York, United States, 2011–2014 |
|---------------------------------------------------------------|
| **Harlem, United States (N = 174; 49.7%)** | **Bangkok, Thailand (N = 176; 50.3%)** | **P** |
| Study arm | | 0.98 |
| Daily PrEP | 57 (32.8%) | 59 (33.5%) | |
| Event-driven PrEP | 58 (33.3%) | 59 (33.5%) | |
| Time-driven PrEP | 59 (33.9%) | 58 (33.0%) | |
| Age, yrs | 31 (23–43) | 31 (27–34) | 0.47 |
| Education | | <0.001 |
| Primary school or less | 44 (25.3%) | 3 (1.7%) | |
| Secondary school | 99 (56.9%) | 25 (14.2%) | |
| College | 31 (17.8%) | 148 (84.1%) | |
| Unmarried | 167 (96.0%) | 173 (98.3%) | 0.19 |
| Race/ethnicity† | | <0.001 |
| Black | 122 (70.1%) | 0 (0.0%) | |
| Thai | 0 (0.0%) | 176 (100.0%) | |
| White | 21 (12.1%) | 0 (0.0%) | |
| Other | 31 (17.8%) | 0 (0.0%) | |
| Height, cm | 176 (171–182) | 170 (166–174) | <0.001 |
| Weight, kg | 80 (70–93) | 65 (60–71) | <0.001 |
| Any drug use in the previous 3 mo | 108 (62.1%) | 43 (24.4%) | <0.001 |
| AUDIT score ≥8‡ | 36 (20.7%) | 37 (21.0%) | 0.94 |
| Number of sex partners in the previous 3 mo | 4 (3–10) | 3 (2–6) | <0.001 |
| Any HIV-positive partners in prior 3 mo | 31 (17.8%) | 13 (7.4%) | 0.95 |
| Any unprotected sex in the previous 3 mo (N = 346) | 121 (69.5%) | 65 (37.8%) | <0.001 |

Data are number (%) or median IQR.

*P* values are based on the Wilcoxon rank-sum test for continuous variables and χ² tests for categorical variables.

†Participants were coded as “Other” if they reported being American native, Alaska native, Asian American, or other race/ethnicity.

‡AUDIT score ≥8 is indicative of heavy alcohol use.

AUDIT, Alcohol Use Disorders Identification Test.
high numbers of sex acts in the event-driven arm were taking PrEP more often than those reporting the same number of sex acts but in the daily dosing arm (top 2 panels, Fig. 2). Participants from Harlem had lower hair TFV and FTC concentrations than those from Bangkok ($P$ values $<0.001$). Lower education status was negatively associated with hair FTC and TFV concentrations, and heavy alcohol use (AUDIT score $\geq 8$) was associated with higher FTC/TFV concentrations. We found similar directions and magnitudes of association in our model assessing correlations between covariates and hair TFV levels $\geq 0.023$ ng/mL ($\sim 4$ doses per week) among participants in the daily arm only (Table 4), but this analysis had limited power to detect statistically significant associations given the smaller number of included visits ($N = 127$; 29.1% with TFV levels $\geq 0.023$ ng/mL and 70.9% with TFV levels $<0.023$ ng/mL).

In models of plasma concentrations, we similarly found that assignment to the intermittent arms was associated with lower FTC and TFV concentrations than assignment to the daily arm among participants who reported zero sex acts, and participants from Harlem had statistically significantly lower TFV concentrations than those from Bangkok, although the association between the site and FTC concentrations (Table 3) was not statistically significant. Age was statistically significantly associated with plasma concentrations. Specifically, every 10-year increase in age was associated with a 1.40-fold higher plasma TFV concentration [95% confidence interval (CI): 1.13 to 1.75; $P$ value $<0.001$] and a 1.48-fold higher plasma FTC concentration (95% CI: 1.13 to 1.95; $P$ value $<0.001$). The main effect for number of sex acts was associated with plasma concentrations in the model. Among participants in the daily arm, a 10-act increase in the number of sex acts was associated with a 1.34-fold higher plasma TFV concentration (95% CI: 1.03 to 1.73; $P$ value 0.03) and a 1.48-fold higher plasma FTC concentration (95% CI: 1.08 to 2.01; $P$ value 0.01). Unlike in the models of hair TFV and FTC concentrations, we did not observe statistically significant differences in the association between number of sex acts and plasma drug concentrations across the study arms; plasma concentrations were highest for participants in the daily arm regardless of the number of reported sex acts (bottom 2 panels, Fig. 2). We also did not find statistically significant effects of education or alcohol use on plasma concentrations.

### TABLE 2. Geometric Mean Plasma and Hair Drug Concentrations Among MSM During Follow-up in the HIV Prevention Trials Network (HPTN) 067 Study in Bangkok, Thailand, and Harlem, New York, United States, 2011–2014

| Visit        | Hair TFV     | Hair FTC     | Plasma TFV   | Plasma FTC   |
|--------------|--------------|--------------|--------------|--------------|
|              | Geometric Mean (95% CI) |               |              |              |
| Daily, time-driven, and event-driven arms, combined |              |              |              |              |
| Week 4       | 0.006 (0.005 to 0.007) | 0.145 (0.114 to 0.184) | 9.913 (7.678 to 12.798) | 19.326 (14.204 to 26.295) |
| Week 12      | 0.007 (0.006 to 0.009) | 0.137 (0.103 to 0.181) | 6.079 (4.586 to 8.057) | 11.310 (8.072 to 15.848) |
| Week 24      | 0.006 (0.005 to 0.008) | 0.114 (0.087 to 0.149) | 5.255 (3.918 to 7.047) | 8.913 (6.261 to 12.689) |
| Daily arm only |              |              |              |              |
| Week 4       | 0.008 (0.006 to 0.011) | 0.232 (0.148 to 0.364) | 20.128 (12.934 to 31.324) | 48.051 (28.144 to 82.037) |
| Week 12      | 0.013 (0.008 to 0.020) | 0.275 (0.163 to 0.466) | 16.161 (9.929 to 26.305) | 38.096 (21.069 to 68.884) |
| Week 24      | 0.010 (0.006 to 0.016) | 0.222 (0.127 to 0.391) | 13.344 (7.882 to 22.592) | 29.616 (15.685 to 55.920) |

FTC, emtricitabine; TFV, tenofovir.

**FIGURE 1.** Pearson correlation coefficients between log-transformed hair and plasma drug concentrations and Wisepill data by follow-up visit, among MSM in the HIV Prevention Trials Network (HPTN) 067 study in Bangkok, Thailand, and Harlem, New York, United States, 2011–2014. FTC, emtricitabine; TFV, tenofovir. All correlation coefficients have $P$ values $<0.05$.  

*Neither correlation coefficients have $p$-values $<0.05*
Prior studies examining correlations between PrEP measures also found moderate associations between hair, plasma, and electronic data but used medication event monitoring systems caps to measure bottle openings rather than Wisepill. For example, high-risk younger individuals may require enhanced adherence counseling and support particularly during the time period between monthly or quarterly clinic visits.

In this cohort of MSM participating in a trial to assess behavioral feasibility of non-daily PrEP dosing regimens, Wisepill and pharmacologic measures of PrEP use were moderately correlated and served as complementary indicators of PrEP exposure. Arm and site were significantly associated with both pharmacologic measures, whereas education and alcohol use were statistically significantly related to hair concentrations. Age and the number of sex acts were associated with plasma concentrations. These findings demonstrate that demographic and behavioral factors may impact participants’ patterns of PrEP use in the immediate period before a study visit and during longer-term follow-up, which has important implications for future PrEP delivery programs focused on providing tailored adherence counseling within contexts of changing risk behaviors and PrEP decision-making. For example, high-risk younger individuals may require enhanced adherence counseling and support particularly during the time period between monthly or quarterly clinic visits.

Factors associated with PrEP use just before a study visit were older age and sexual behavior, whereas higher

### TABLE 3. Estimated Multivariable Associations of Demographic and Behavioral Covariates With Hair (N = 381) and Plasma (N = 946) Drug Concentrations Among MSM During Follow-up in the HIV Prevention Trials Network (HPTN) 067 Study in Bangkok, Thailand, and Harlem, New York, United States, 2011–2014*

| Covariate                  | Hair Drug Concentrations | Plasma Drug Concentrations |
|----------------------------|--------------------------|----------------------------|
|                            | TFV (n = 381 Visits)     | FTC (n = 379 Visits)       | TFV (n = 946 Visits)     | FTC (n = 946 Visits) |
|                            | Adjusted Fold-Effect     | Adjusted Fold-Effect       | Adjusted Fold-Effect     | Adjusted Fold-Effect |
|                            | (95% CI)                 | (95% CI)                  | (95% CI)                 | (95% CI)            |
|                            | P                        | P                          | P                        | P                    |
| Visit mo                   | 0.99 (0.99 to 1.00)      | 0.99 (0.99–1.00)           | 0.06                     | 0.99 (0.99–1.00)     |
| Study arm                  | <0.001                   | <0.001                     | <0.001                   | 0.06                 |
| Time-driven                | 0.64 (0.45 to 0.91)      | 0.51 (0.32 to 0.79)        | 0.68 (0.39 to 1.21)      | 0.61 (0.30 to 1.22)  |
| Event-driven               | 0.43 (0.29 to 0.63)      | 0.25 (0.15 to 0.39)        | 0.11 (0.06 to 0.19)      | 0.07 (0.04 to 0.14)  |
| Daily                      | Reference                | Reference                  | Reference                | Reference            |
| Site                       | 0.01                     | <0.001                     | 0.02                     | 0.10                 |
| Ballard                    | 0.48 (0.30 to 0.76)      | 0.31 (0.20 to 0.48)        | 0.50 (0.29 to 0.88)      | 0.57 (0.28 to 1.12)  |
| Education                  | 1.03 (0.90 to 1.20)      | 1.15 (0.99 to 1.31)        | 1.40 (1.13 to 1.75)      | 1.48 (1.13 to 1.95)  |
| Age, yr†                   | 0.01                     | 0.01                       | 0.11                     | 0.13                 |
| Primary or less            | 0.43 (0.25 to 0.76)      | 0.31 (0.17 to 0.55)        | 0.44 (0.19 to 0.99)      | 0.38 (0.13 to 1.05)  |
| Secondary school           | 0.78 (0.48 to 1.26)      | 0.66 (0.44 to 0.99)        | 0.62 (0.35 to 1.09)      | 0.57 (0.28 to 1.14)  |
| College                    | Reference                | Reference                  | Reference                | Reference            |
| AUDIT ≥8‡                  | 1.45 (1.01 to 2.10)      | 1.60 (1.12 to 2.32)        | 1.20 (0.78 to 1.88)      | 1.38 (0.79 to 2.39)  |
| No. of sex acts since the  | 1.52 (0.99 to 1.60)      | 1.16 (0.90 to 1.51)        | 1.34 (1.03 to 1.73)      | 1.48 (1.08 to 2.01)  |
| previous visit§            | 0.04                     | 0.07                       | 0.43                     | 0.01                 |
| Time-driven × Sex acts§    | 0.85 (0.66 to 1.11)      | 0.94 (0.70 to 1.26)        | 0.86 (0.61 to 1.22)      | 0.78 (0.51 to 1.20)  |
| Event-driven × sex acts§   | 1.11 (0.80 to 1.51)      | 1.38 (1.01 to 1.88)        | 1.27 (0.86 to 1.90)      | 1.20 (0.76 to 1.92)  |
| Daily × sex acts§          | Reference                | Reference                  | Reference                | Reference            |

Statistically significant effects (P value < 0.05) are indicated in bold.

*Models included all covariates shown here. TFV and FTC concentrations are log-transformed (using a natural logarithm transformation), and all regression coefficients were then back-transformed to determine fold-effects.

†Measured per 10 yrs.
‡AUDIT score ≥8 is indicative of heavy alcohol use.
§Measured per 10 sex acts.
AUDIT, Alcohol Use Disorders Identification Test; FTC, emtricitabine; TFV, tenofovir.
education and alcohol use were associated with long-term PrEP use during the follow-up period. A qualitative substudy with MSM in HPTN 067 found that participants described taking PrEP only during times when they were planning to have unprotected sex, when they had a high number of sexual partners, or when HIV concerns were on their minds. These data lend important context to the association we found between sexual behavior and recent PrEP use. Other studies have also found associations between PrEP adherence and the number of sex acts and sexual partners among men, indicating that individuals may be tailoring their PrEP use to perceived risk or to saliency of their HIV risk because of an upcoming study visit appointment. Recent data have shown that intermittent or on-demand PrEP may be efficacious for HIV prevention among MSM, and strategies to align PrEP use to periods of sexual risk may be appropriate in this population. Older age has been associated with increased PrEP adherence measured by plasma concentrations, self-reported adherence, electronic data, and pharmacy records among men across multiple settings. This finding could in part be explained by more white-coat adherence among older participants (because age was not associated with long-term adherence) and also by greater goal-directed behavior among older versus younger individuals.

In our sample, higher education was related to longer-term PrEP use, which has been previously observed, and is plausible given that education may be an indicator of more stable individual contexts that promote adherence over a period of weeks to months rather than a contributor to PrEP dosing in the period just before a study visit. We did not observe a statistically significant main effect between long-term PrEP use and sexual behavior, implying that sexual behavior was not linked to long-term PrEP adherence among those in the daily dosing arm potentially because HIV risk perceptions, motivations to continue participating in the study, or other factors were more important in driving regular PrEP use in the month before a visit. However, we did see a significant interaction effect which reveals that those with high numbers of sex acts in the event-driven arm took PrEP...
more consistently throughout follow-up than those reporting the same number of sex acts but in the daily dosing arm. We also found that heavier alcohol use was associated with higher levels of long-term adherence, although we cannot rule out that alcohol use was associated with higher FTC/TFV concentrations due to pharmacokinetic effects. In the U.S. PrEP Demo Project, amphetamine use was associated with higher hair PrEP drug concentrations, which was believed to represent higher levels of adherence among MSM with higher-risk behavior.13,27 Heavy alcohol use is linked with unprotected sex among MSM, and HPTN 067 participants who drank alcohol regularly may have adjusted their PrEP use based on perceived HIV risk.53,54 Consistent with this hypothesis, in secondary data analyses, we found that having an AUDIT score \( \geq 8 \) was associated with greater frequency of unprotected sex in this study sample although more work is needed to understand links between alcohol use and frequency of sexual activity, patterns of condom use, transactional sex, and HIV risk perceptions. An AUDIT score \( \geq 8 \) is meant to capture individuals with regular heavy alcohol use rather than those who sporadically drink, and it is possible that heavy alcohol use and corresponding high-risk sexual behavior may have influenced HIV risk perceptions and longer-term PrEP use (as captured by hair drug concentrations) but did not have as strong of an impact on recent PrEP dosing and plasma drug concentrations. Similarly, in another phase II study of PrEP, substance use (khat and marijuana) was significantly associated with hair concentrations.28 Additional research is necessary to examine predictors of long-term PrEP dosing among high-risk populations, disentangle them from sexual behaviors and age that have been consistently shown to predict PrEP dosing shortly before study visits, and guide adherence approaches for consistent PrEP use.

The strengths of this study included the large sample with participants from 2 distinct geographic regions and the use of multiple measures of PrEP exposure. Overall retention rates were high, which minimized concerns about selection bias and differential attrition, but did differ across the 2 study sites. Limitations of this study included the lack of a gold-standard PrEP adherence measure, which prevented us from quantifying the magnitude of bias due to “white-coat effects,” “curiosity openings,” and “pocket dosing.” Although we were able to adjust our Wisepill data based on weekly interview data, the validity of these self-report data was potentially limited due to social desirability and recall bias. Although objective benchmarks of adherence have been established for pharmacologic measures in directly observed therapy studies,6,25 it was difficult to apply them to this work given important differences in expected PrEP dosing and definitions of adherence by the 3 randomized study arms. The HPTN 067 primary manuscript provides additional data on PrEP adherence and coverage of sex events for each dosing arm, and further analyses of patterns of adherence around recent sex events and using pharmacologic adherence measures are forthcoming.27 We were only able to analyze hair samples during 43.6% of 999 attended visits due to budget restrictions. Moreover, our results in this MSM cohort may not be generalizable to women or to all men or MSM, and the study only enrolled 5 transgender women, which prevented us from being able to examine correlates of PrEP adherence in this group. Finally, due to a low number of HIV seroconversions (only 1 acute HIV infection after randomization in a participant from Harlem), we could not examine associations between drug concentrations and HIV acquisition in the sample.

In conclusion, Wisepill, plasma, and hair data were moderately correlated with one another in this phase II PrEP trial, suggesting that these adherence measures can be combined to better understand PrEP exposure during roll-out. In particular, plasma measures may be useful for examining short-term adherence, whereas hair measures can assess longer-term PrEP adherence after a period of steady-state dosing is achieved. Age and sexual behavior may be related to recent PrEP dosing among MSM. Higher education and longer-term risk behavior (eg, alcohol use) may meaningfully influence steady patterns of PrEP use. Future research on electronic and pharmacologic measures of PrEP adherence should consider factors such as cost, feasibility, and acceptability of each metric in the study design. In addition to the measures presented here, additional pharmacologic measures could also be used to provide similar

### TABLE 4. Estimated Multivariable Associations of Covariates With Hair Drug Concentrations Consistent With Approximately 4 Doses/wk Among Men Who Have Sex With Men Assigned to the Daily Dosing Arm in the HIV Prevention Trials Network (HPTN) 067 Study in Bangkok, Thailand, and Harlem, New York, United States, 2011–2014*

| Covariate                  | Adjusted Fold-Effect (95% CI) | P     |
|----------------------------|--------------------------------|-------|
| Visit mo                   | 1.00 (0.99 to 1.01)            | 0.84  |
| Site                       |                                | 0.01  |
| Harlem                     | 0.66 (0.50 to 0.87)            |       |
| Bangkok                    | Reference                      |       |
| Age, yrs†                  | 1.02 (0.95 to 1.08)            | 0.64  |
| Education                  | 0.60                           |       |
| Primary or less            | 0.90 (0.68 to 1.19)            |       |
| Secondary school           | 0.97 (0.76 to 1.26)            |       |
| College                    | Reference                      |       |
| AUDIT \( \geq 8 \)        | 1.12 (0.86 to 1.19)            | 0.39  |
| No. of sex acts since the previous visit‡ | 1.10 (0.99 to 1.19)            | 0.06  |

Statistically significant effects (P value <0.05) are indicated in bold.

*Models included all covariates shown here and were restricted to participants in the daily arm only with available hair concentrations (N = 57 participants). TFV concentrations are log-transformed (using a natural logarithm transformation), categorized around the natural log of 0.023 (approximately \(-1.37 \text{ ng/mg}\)), and all regression coefficients were then back-transformed to determine fold-effects.

†Measured per 10 years.

‡AUDIT score \( \geq 8 \) is indicative of heavy alcohol use.

§Measured per 10 sex acts.

AUDIT, Alcohol Use Disorders Identification Test; FTC, emtricitabine; TFV, tenofovir.
assessment of short-term (eg, urine) and long-term (eg, peripheral blood mononuclear cells, dried blood spots) PrEP use. Each objective measure comes with its own benefits and trade-offs for data collection, storage, cost, and interpretation. Our findings highlight a need for additional studies to continue exploring factors associated with recent and steady-state PrEP use, characterize patterns of adherence, and explore whether PrEP use aligns with sexual behaviors and risk perceptions among high-risk populations. These results support combining pharmacologic tools in future HIV prevention research both for outcome interpretation and to identify individuals in need of enhanced adherence support to improve PrEP effectiveness in key populations.

ACKNOWLEDGMENTS
The authors thank the individuals who participated in the study, and the teams at the Bangkok and Harlem study sites, and the HIV Prevention Trials Network that supported data collection and management for this work.

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