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Genome-wide Association Study of Tenofovir Pharmacokinetics and Creatinine Clearance in AIDS Clinical Trials Group Protocol A5202

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Abstract

Background—Tenofovir disoproxil fumarate (TDF) causes kidney toxicity in some patients. We performed genome-wide analyses to identify associations with plasma tenofovir clearance and change in creatinine clearance (CrCl) during the first 6 months after initiating therapy among subjects randomized to TDF/emtricitabine-containing regimens in AIDS Clinical Trials Group protocol A5202.

Methods—Pharmacokinetic analyses involved 501 subjects randomized to the tenofovir arm. The CrCl analyses involved 1096 subjects, including 548 control subjects randomized to abacavircontaining regimens. All had been randomized to also receive atazanavir/ritonavir or efavirenz. Multivariable linear regression and generalized least squares models tested for associations between polymorphisms and tenofovir clearance and CrCl change, with Bonferroni correction. Planned sub-analyses considered candidate genes and polymorphisms.

Results—Median CrCl at baseline was 116 ml/min (interquartile range [IQR] 99.8 to 135.5). Median change in CrCl after 6 months was -0.5 ml/min (-10.7 to $+10.8$) and 2.2 (IQR -9.9 to +13.2) in tenofovir and abacavir arms, respectively. In genome-wide analyses *SLC17A1* rs12662869 was associated with an increase in tenofovir clearance (P = 7.1x10⁻⁹). In candidate gene analysis for tenofovir clearance, most polymorphisms evaluated were in *ABCC4*. In the *ABCC4* region, the lowest p-value was for *CLDN10* rs12866697 (P=1.4x10⁻³). Among African

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Conflict of Interest/Disclosure:

David W. Haas has been principal investigator on a research grant to Vanderbilt from Merck, and has been a consultant to Merck. Eric S. Daar has received research grants from Bristol Myers Squibb, Abbott, Merck, Pfizer, ViiV, Gilead and a consultant/advisor to Bristol Myers Squibb, Merck, ViiV and Gilead.

Americans, *SLC22A2* rs3127573 was associated with a greater 6-month CrCl increase in the tenofovir arm after correcting for multiple comparisons (P = $3.3x10^{-5}$).

Conclusions—Among subjects randomized to receive TDF/emtricitabine in A5202, there were no genome-wide significant associations with change in CrCl. This study did not replicate polymorphisms previously implicated in tenofovir-associated renal injury.

Keywords

HIV; tenofovir; pharmacokinetics; creatinine clearance

Introduction

Tenofovir disoproxil fumarate (TDF) is included among recommended first-line regimens for human immunodeficiency virus type 1 (HIV-1) infection [1]. It is converted *in vivo* to tenofovir, which undergoes intracellular diphosphorylation to its active moiety, tenofovir diphosphate [2]. Although generally safe, effective and well tolerated [3, 4], some HIVinfected patients prescribed TDF experience declines in creatinine clearance (CrCl) [4, 5-7], particularly in regimens that include an HIV-1 protease inhibitor plus low-dose ritonavir [4, 6]. In AIDS Clinical Trials Group (ACTG) protocol A5202, median change in CrCl from baseline to week 96 decreased by 3 mL/min in subjects who received TDF/emtricitabine with atazanavir/ritonavir, but increased by 5 mL/min in subjects who received TDF/ emtricitabine with efavirenz [4]. Discontinuation or dose reduction of TDF/emtricitabine for changes in renal function in A5202 was infrequent [4].

Renal elimination of tenofovir involves glomerular filtration and tubular secretion [8]. Tenofovir entry into proximal tubule cells appears to be mediated by two transporters, organic anion transporter 1 (OAT1, also called solute carrier family 22 member 6 (SLC22A6) and OAT2 (also called SLC22A7) [9]. Renal tubular secretion is mediated by efflux transporters including multidrug resistance protein 4 (MRP4, also called ATP-binding cassette, sub-family C, member 4 (ABCC4)) [9], and possibly MRP2 (also called ABCC2), although the importance of MRP2 is uncertain [9]. Declines in CrCl associated with concomitant HIV-1 protease inhibitors may reflect ABCC4 inhibition, with resultant tenofovir accumulation in proximal tubule cells.

Candidate gene studies have suggested associations between single nucleotide polymorphisms (SNPs) and adverse renal effects with tenofovir-containing regimens. A study of 30 patients in France suggested increased risk for proximal renal tubulopathy with an *ABCC2* polymorphism (1249G \rightarrow A, rs2273697, P = 0.02) [10]. A study of 190 Japanese patients suggested increased risk for renal tubular dysfunction with two polymorphisms in *ABCC2* (−24T→C, rs717620, and 1249 G→A, each P = 0.02) [11]. An analysis of 115 patients in Spain suggested increased risk of tubular dysfunction with *ABCC2* −24T→C (P = 0.03) [29], and two polymorphisms in *ABCC10* (rs9349256, P = 0.02; and rs2125739, P = 0.05) [12]. Another study of 30 patients suggested an association between higher peripheral blood mononuclear cell tenofovir diphosphate concentrations and an *ABCC4* polymorphism $(3463A \rightarrow G, rs1751034, P = 0.04)$ [13]. Kidney tubular dysfunction included serum creatinine and/or creatinine clearance differences in some reports [10][11] but not others

[12][14]. Previous reports showed limited replication other than perhaps *ABCC2* polymorphisms [10][11].

We present two genome-wide association studies (GWAS) based on HIV-infected subjects from a prospective randomized clinical trial. The first GWAS considers plasma tenofovir clearance among subjects randomized to tenofovir (treatment-only study); the second considers change in estimated CrCl among patients randomized to tenofovir versus abacavir (treatment-and-control study). Both tenofovir clearance and change in CrCl are treated as continuous variables. This is the first GWAS of tenofovir pharmacokinetics, and of tenofovir-related change in renal function. We identified SNPs of potential interest, including SNPs that were genome-wide significant after Bonferroni correction. Polymorphisms previously implicated in tenofovir renal toxicity did not replicate.

Methods

Study subjects

AIDS Clinical Trials Group (ACTG) Protocol A5202 (ClinTrials.gov NCT00118898) was a phase IIIb study of once-daily regimens for initial treatment of HIV-1 infection [3, 4]. Briefly, 1,858 HIV-infected subjects were randomized to receive either TDF/emtricitabine (300 mg/200 mg) or abacavir/lamivudine (600 mg/300 mg), with either open-label atazanavir (300 mg) plus ritonavir (100 mg), or efavirenz (600 mg). Serum creatinine determinations were performed before entry, at entry, at weeks 4, 8, 16 and 24, and every 12 weeks thereafter until week 96 after the last subject enrolled. Creatinine clearance was calculated using the Cockcroft-Gault formula based on ideal body weight [15].

Tenofovir assays and plasma sampling

Pharmacokinetic samples include those collected between weeks 4 and 24 of A5202. A sparse sampling strategy was designed to measure antiretroviral concentrations in 3 plasma samples per subject. Plasma collection times included a 24-hour post-dose sample followed by an observed-dose sample 3-4 hours post-dose, and another sample 5-15 hours post-dose. The TDF dose of 300 mg is equivalent to 245 mg of tenofovir disoproxil and to 136 mg of tenofovir. Steady-state plasma concentrations of tenofovir were measured using tandem mass spectrometry detection [16].

Pharmacokinetic model development

A total of 2,172 plasma tenofovir determinations from 818 participants were analyzed using a nonlinear mixed-effects modeling approach (NONMEM version VII; ICON, Ellicott City, MD). One- and two-compartment disposition models with first-order absorption were tested to determine the pharmacokinetic structural model. First-order conditional estimation method with interaction (FOCEI) was used throughout. The final model was a twocompartment model that estimated apparent oral and intercompartmental clearances, and volumes of distribution of central and peripheral compartments. Because concentration data were lacking in the absorption phase, the absorption rate constant was fixed to 1 h⁻¹ based on previous data [17]. Exponential errors with log-normal distribution were used for intersubject variability of pharmacokinetic parameters. A proportional error model was

assigned to residual variability. The final structural pharmacokinetic model was assessed by successful convergence and goodness-of-fit plots. Individual Bayesian estimates of oral clearance values of tenofovir were estimated from the final model.

Genetic polymorphisms

Genetic consent was obtained under protocol A5128 [18]. Of 1,858 subjects with clinical data, 1,356 consented to A5128, including 677 randomized to tenofovir-containing regimens (350 with efavirenz, 327 with atazanavir/ritonavir) and 679 randomized to abacavircontaining regimens (349 with efavirenz, 330 with atazanavir/ritonavir). Genome-wide genotype data on 1,221 subjects from Illumina Human-1M-Duo were from a separate immunogenomics project [19]. The Vanderbilt Institutional Review Board and the ACTG approved this use of genotype data.

For pharmacokinetic association analyses, we considered candidate SNPs of potential relevance to tenofovir [10-12, 14, 21-27]. Initially, 25 candidate SNPs in 11 genes were identified using PharmGKB (ABCB1, ABCC10, ABCC2, ABCC4, AK2, AK3, NME1, SLC22A6, SLC22A8 and *SLC22A11*) [28], of which 15 were in our genotype data. Proxies were identified for 3 of the other 10 (a total of 15 proxies) through SNP annotation and proxy (SNAP) search [29], using an r^2 threshold of 0.8, providing 30 SNPs (representing 18 candidate SNPs) for pharmacokinetic association analysis. For separate analyses we considered all available SNP data between transcription start and end positions of these 11 genes, based on the human reference genome hg18/NCBI36 [30]. We identified 594 such SNPs: 110 in *ABCB1*, 12 in *ABCC10*, 38 in *ABCC2*, 378 in *ABCC4*, 8 in *AK2*, 18 in *AK3*, 6 in *NME1*, 6 in *SLC22A6*, 14 in *SLC22A8*, 4 *SLC22A11* and 0 in *NME1*.

For CrCl association analyses, we identified 91 SNPs previously associated with any renal trait at $P < 1.0 \times 10^{-5}$ in any cohort, as posted to the NHGRI GWAS Catalog [31], of which 43 were available in our genotype data. These GWAS Catalog traits were chronic kidney disease, chronic kidney disease and serum creatinine levels, creatinine levels, end-stage renal disease, renal function and chronic kidney disease, renal function-related traits (BUN), renal function-related traits (eGRF creatinine), renal function-related traits (sCR), renal function-related traits (urea), glomerulosclerosis, IgA nephropathy, nephropathy, nephropathy (idiopathic membranous), and nephrotic syndrome (acquired). Proxies were identified for 34 of the other 48 SNPs (a total of 169 proxies) as described above, providing 212 SNPs (representing 77 candidate SNPs) for CrCl association analysis.

Quality control of genetic data

Quality control (QC) was done using PLINK version 1.07 [20]. Before QC, 546 subjects met inclusion criteria for pharmacokinetic (1,212 for CrCl) association analyses as described in the statistical analyses section, and with \sim 1.2 million SNPs. We excluded subjects with $>$ 2% missing genotypes, extreme heterozygosity ($|F| > 0.1$), for duplicates or relatedness (pihat > 0.125), or sex mismatch. We excluded SNPs that deviated from Hardy-Weinberg equilibrium within principal component (PC)-derived race/ethnicity groups (P < 10^{-6}), with $\langle 98\%$ genotyping efficiency, and minor allele frequency (MAF) $\langle 5\%$. Quality control was performed for the combined group (African Americans, European Americans and Hispanic

We generated PCs to infer and adjust for genetic ancestry. Before generating PCs we removed non-autosomal SNPs, and SNPs from two regions of high linkage disequilibrium (LD), 25.5 MB to 33.5 MB spanning the MHC region on chromosome 6, and from 8.0 MB to 12.0 MB on chromosome 8. Subsets of SNPs in low pairwise LD $(r^2 < 0.2)$ were used to generate PCs using smartpca in EIGENSTRAT [32]. Race/ethnicity was derived by analyzing these samples in concert with HapMap 3 samples from 11 populations [19].

Imputing genotypes

Imputation was done by Dr. Marylyn Ritchie's laboratory at Pennsylvania State University. Briefly, post QC data were imputed to 1000 Genomes [33] after converting to genome build 37 using liftOver [34] and stratifying by chromosome to parallelize imputation processing. ShapeIt2 [35] was used to check strand alignment and to phase data. The IMPUTE2 algorithm [36] was used to impute additional genotypes that were available in the 1000 Genomes reference panel, but not directly genotyped. Each chromosome was segmented into 6 MB regions with at least 3500 reference variants in each region. Imputed genotypes were included if posterior probabilities exceeded 0.9. Chromosomes 23 through 26 were not imputed.

Quality of imputed data was assessed following the Electronic Medical Records and Genomics (eMERGE) protocol [37]. Each chromosome from each phase was checked for 100% concordance with genotyped data. No batch effects were found. Imputed SNPs were dropped for imputation scores < 0.3 , genotyping call rates $< 98\%$ and minor allele frequencies < 0.05 .

Tenofovir clearance association analyses

Pharmacokinetic association analyses included only subjects that had been randomized to tenofovir-containing arms and had available clinical, pharmacokinetic, and genotype data. Multivariable linear regression models were fit. Plasma tenofovir clearance values approximated a normal distribution (**Supplemental Digital Content Figure 1)**. Analyses were performed on all subjects, and separately in each group (White, Black, and Hispanic) based on PCs. Meta-analysis of the three stratified models was also performed.

Tenofovir clearance, estimated from the pharmacokinetic model, was regressed using multiple linear regression on genotype, adjusting for sex, age, body mass index (BMI), concomitant efavirenz versus atazanavir/ritonavir use, and baseline CrCl. In the combined analysis, we also adjusted for the first two PCs (adjusting for additional PCs did not substantially change results; see **Supplemental Digital Content Table 1**) and self-reported race coded as White, Black, Hispanic, and other. For QC we tested for the known genomewide association between *UGT1A1* SNPs and baseline plasma bilirubin concentration [38].

As a sensitivity analysis, we repeated the TDF clearance analyses as described above, but evaluated the combined effect of genotype and a genotype-by-efavirenz/atazanavir interaction using a likelihood ratio test with 2 degrees of freedom.

Creatinine clearance association analyses

Creatinine clearance association analyses included subjects randomized to TDF or abacavir arms, and with available clinical and genotype data. All determinations within 200 days after randomization were included in analyses; 200 days was chosen to represent 6 months plus a grace period. At least two CrCl determinations after baseline were available from 91% of subjects.

The TDF and abacavir arms were expected to result in different changes in creatinine clearance over time, and we were interested in identifying SNPs that influence this difference. We addressed this using a one-degree-of-freedom test for significance of a threeway interaction among time, treatment, and genotype. We used a generalized least squares regression model with compound symmetric correlation structure, with creatinine clearance (hereafter called *time-dependent CrCl change*) as the outcome and including all main, twoway and three-way interactions of time, treatment arm (TDF or abacavir), and genotype. Generalized least squares models, instead of linear mixed effects models, were chosen for analyses with multiple measurements per subject because of their computational efficiency and so not to assume a distributional form for the random effects. The model was adjusted for sex, age, BMI, self-reported race, concomitant antiretroviral (efavirenz or atazanavir/ ritonavir), baseline CrCl, and the first two PCs. Baseline CrCl was the value at randomization (i.e., day 0); for subjects without data on day 0, we used the first available value before randomization (preferred) or after randomization. Three additional models, stratified by PC-inferred race, were fit in the same manner as above, but without adjusting for self-reported race and PCs. Meta-analysis of regression output from the stratified models was also done. For CrCl we evaluated the 212 candidate GWAS Catalog SNPs.

As sensitivity analyses, we repeated analyses as described above, but using change in CrCl from baseline to 6 months (defined as the value closest to day 183 ± 30 days) as the phenotype. We hereafter call this the *6-month CrCl change*. This cut-off is based on reported time to change in creatinine, much of which is apparent within the first 6 months of initiating TDF-containing regimens. Time was excluded in this model, and the p-value for two-way interaction between genotype and treatment arm (TDF or abacavir) was calculated. Because patients prescribed tenofovir in A5202 were more likely to experience a decline in CrCl if also prescribed a ritonavir-boosted protease inhibitor [4], we performed an additional sensitivity analysis by repeating the analyses for 6-month CrCl change with the inclusion of an interaction between treatment arm and concomitant ARV.

Statistical software and technicalities

Genetic data management and statistical analyses were done using PLINK version 1.07 [20] and R version 3.0.1. Meta-analyses were performed in PLINK, and the random effects pvalues reported. Analysis scripts are available upon request. Except where indicated otherwise, we used Bonferroni correction to determine significance thresholds, with $P < 5.0$ x 10−8 for genome-wide analyses, and 0.05 divided by number of SNPs in candidate gene and SNP analyses. QQ-plots of each analysis showed no evidence of genomic inflation (**Supplemental Digital Content Figures 2-7**). QQ-plots of tenofovir clearance and CrCl

residuals suggested linear models were appropriate (**Supplemental Digital Content Figures 8-10**).

Results

Study subjects and genetic data

Characteristics of subjects in tenofovir and abacavir arms are shown in **Table 1**. Randomization provided similar distributions of sex (86-87% male), concomitant antiretroviral (49% atazanavir and 51% efavirenz), age (median 38-39 years), BMI (median 24.8 kg/m^2), baseline creatinine clearance (median 116 ml/min), and race/ethnicity between study arms. **Figure 1** describes data management and QC steps in the combined group analyses. After QC, there were 501 subjects and ~890,000 SNPs for pharmacokinetic analyses, and 1096 subjects (548 randomized to TDF-containing regimens) and ~840,000 SNPs for creatinine clearance analyses. There were ~ 4.3 million imputed SNPs for both analyses.

Tenofovir clearance pharmacokinetic association analyses

For pharmacokinetic association analyses, median plasma tenofovir clearance was 46.8 L/hr (IQR 39.7 to 53.7). **Table 2** shows the 20 SNPs with the smallest p-values in meta-analyses based on GWAS with genotyped SNPs, GWAS with imputed SNPs, association analyses with candidate SNPs, and association analyses with candidate genes. Minor allele frequencies of these 20 SNPs are in **Supplemental Digital Content Table 2**. In the GWAS analysis with imputed SNPs, rs12662869 in *SLC17A1* was associated with increased tenofovir clearance ($P = 7.1x10^{-9}$); five *SLC17A1* polymorphisms in strong LD with rs12662869 (rs6926425, rs1179086, chr6:25792711:D, rs1575535, rs1165216) were also among the top ten SNPs with the lowest p-values. Results of similar analyses, but for all subjects adjusting for PC-derived ancestry, and separately within each race/ethnicity group, are provided in **Supplemental Digital Content Table 3**. Of 30 candidate SNPs evaluated, 15 (50%) were in *ABCC4*. In a LocusZoom plot of this region, the lowest p-value was in *CLDN10* (rs12866697, P=1.4x10−3), not *ABCC4* (**Figure 2, Panel A**). As a positive control, log-transformed baseline bilirubin concentration was analyzed [38]; multiple *UGT1A1* SNPs were associated (P = 2.2 x 10⁻¹¹ for *UGT1A1* rs887829), confirming our ability to detect true associations.

Based on results from a prior study [4], we performed an additional GWAS with genotyped SNPs (non-imputed) including a genotype-efavirenz or atazanavir/r interaction on TDF clearance. The results, based on a likelihood ratio test, were similar: No SNPs were genomewide significant, and SNPs with the smallest p-values were those seen in the initial analyses (results not shown).

Creatinine clearance association analyses

The median change in CrCl from baseline to 6 months was -0.5 ml/min (IQR −10.7 to $+10.8$) and 2.2 (IQR -9.9 to $+13.2$) in the tenofovir and abacavir arms, respectively. No SNP was significantly associated with a differential time-dependent CrCl change between the tenofovir and abacavir arms in the first 200 days of therapy, after Bonferroni correction.

The 20 SNPs with the lowest meta-analysis p-values in GWAS with genotyped SNPs, GWAS with imputed SNPs, and association analyses with candidate SNP meta-analyses for time-dependent CrCl change are shown in **Table 3**. Minor allele frequencies of these 20 SNPs are in **Supplemental Digital Content Table 2**. Results of similar analyses, but for all subjects adjusting for PC-derived ancestry, and separately within each race/ethnicity group, are provided in **Supplemental Digital Content Table 4**. In the entire population, rs1751036 in *ABCC4* was among the top 20 SNPs for time-dependent CrCl change ($P = 2.4 \times 10^{-5}$, **Supplemental Digital Content Table 4**). In a LocusZoom plot of this region, 12 *ABCC4* SNPs in LD with rs1751036 at $r^2 > 0.8$ were associated with time-dependent change in creatinine clearance at unadjusted P < 0.01 (**Figure 2, Panel B**).

Sensitivity analyses were performed using the outcome 6-month CrCl change (i.e., CrCl at 6-months minus CrCl at baseline). The 20 SNPs with the lowest meta-analysis p-values in GWAS with genotyped SNPs, GWAS with imputed SNPs, and association analyses with candidate SNP meta-analyses for 6-month CrCl change are shown in **Supplemental Digital Content Table 5**; similar to primary analyses, no SNP was significant after adjusting for multiple comparisons.

In candidate SNP analyses stratified by population, rs3127573 in *SLC22A2* was significantly associated with a positive 6-month CrCl change among African Americans (**Supplemental Digital Content Table 6**, $P = 3.3 \times 10^{-5}$), and was also among the top 20 SNPs in the analysis of combined group (**Supplemental Digital Content Table 6, P = 0.036**). This SNP was also among the top 20 SNPs in the genome-wide analysis of 6-month CrCl change among African Americans (**Supplemental Digital Content Table 5**), had the second lowest P-value ($P = 0.0018$) among 212 candidate SNPs in the time-dependent CrCl change analyses among African Americans (**Supplemental Digital Content Table 7**), and was among the top 20 SNPs in the 212 candidate SNPs analysis of the combined group with time-dependent CrCl change (**Supplemental Digital Content Table 7**, P = 0.09).

Analyses of 6-month CrCl change in which the interaction between treatment arm and efavirenz or atazanavir/r was included yielded results similar to those in which this interaction was not included. Except for the above SNP in the 212 candidate SNPs analysis of the African American group (rs3127573, P = 4.1×10^{-5}), no SNPs were significantly associated with the outcome.

Discussion

Tenofovir disoproxil fumarate is extensively prescribed worldwide. The present report describes the first GWAS of associations with tenofovir pharmacokinetics, and the first GWAS of change in CrCl with tenofovir-containing regimens. A polymorphism in *SLC17A1* was significantly associated with tenofovir clearance (rs12662869, P = $7.1x10^{-9}$). However, no polymorphism achieved genome-wide significance ($P < 5.0 \times 10^{-8}$) for association with change in CrCl. The tenofovir clearance GWAS was complemented by targeted analyses involving 594 SNPs in genes suggested to affect tenofovir disposition, and an even more focused analysis involving 30 candidate SNPs suggested to affect tenofovir disposition. No polymorphism was significant in either of these analyses. Our CrCl GWAS was

complemented by a more targeted analyses of 212 SNPs associated with any renal trait in prior GWAS. Again, no polymorphism was significant in these targeted analyses.

Several aspects of the present study favored our likelihood of identifying true genotypephenotype associations if present. Both CrCl and tenofovir clearance analysis involved over 500 subjects, considerably more than in previous candidate gene association studies of tenofovir renal toxicity [10-12, 15]. The extent of genotype data analyzed far exceeded previous candidate gene analyses [10-12, 15]. Clinical data were from a prospective randomized clinical trial, which included rigorous quantification of change in creatinine clearance over time, and which showed TDF/emtricitabine with atazanavir/ ritonavir to be less favorable in this regard [4, 38, 39]. For CrCl analyses, availability of well matched randomized TDF and abacavir arms allowed the use of the arm containing abacavir (which is not nephrotoxic) as a control to test for associations between SNPs and CrCl change present in the TDF arm but not the abacavir arm, thus permitting an investigation of SNPs that might interact with tenofovir to change CrCl. Substantial numbers of White, Black and Hispanic subjects afforded the opportunity to examine associations in the combined population, and in each population separately, an approach that has proven valuable in pharmacogenomic analyses of other antiretrovirals [38, 39]. Longitudinal models in our analyses allowed us to capture associations between genotype and change in CrCl over time.

There are possible reasons for the paucity of significant associations in the present analyses. With GWAS the threshold for significance after correcting for multiple comparisons is stringent. However, functional polymorphisms that affect drug disposition and/or pharmacodynamics may be genome-wide significant with modest sample sizes. For example, genetic prediction of abacavir hypersensitivity would be genome-wide significant $(P<5.0x10^{-8})$ with 15 cases and 200 controls [40], and statin-induced myopathy with 85 cases and 90 controls [41]. In addition, we complemented our GWAS with more focused candidate gene/SNPs analyses with less stringent P-value thresholds, which still did not identify significant associations. It is possible that effects of genetic polymorphisms are context dependent, and may not have been detected with concomitant efavirenz or atazanavir/ritonavir (analyses with efavirenz or atazanavir/r interactions also showed insufficient evidence that the effect of genotype on tenofovir clearance or 6-month CrCl change differed by efavirenz or atazanavir/r), but could have been apparent with other concomitant antiretrovirals. We cannot exclude the possibility that previously reported associations were spurious, as reported P-values were marginally significant and would not have withstood correction for multiple comparisons even for the few SNPs genotyped.

We considered plasma tenofovir clearance in the present analyses, despite intracellular tenofovir diphosphate being the presumed toxic moiety. While plasma tenofovir pharmacokinetics do not equate with drug exposure within renal tubular cells, we hypothesized that functional drug transporter gene polymorphisms that affect drug disposition across cell membranes might also affect plasma drug clearance. Analyses with imputed SNPs detected a genome-wide association of *SLC17A1* rs12662869 with plasma tenofovir clearance, and additional SNPs in strong LD with rs12662869 in this gene were among the top SNPs detected. Although not a gene known to be associated with tenofovir

clearance, the encoded protein sodium-dependent phosphate transport protein 1 is a urate transporter speculated to be relevant to the kidney [42]. Its potential relevance to tenofovir disposition may warrant further study.

Within each analysis, there was some overlap for a few SNPs, especially in the combined and meta-analyses. Although not significant, most of the top SNPs in pharmacokinetic candidate SNP analyses were in ABCC genes, which have been reported to be involved in tenofovir clearance and creatinine clearance among patients receiving tenofovir [8-12]. A previous study of the association of *ABCC10* polymorphisms with kidney tubular dysfunction identified an association between rs9349256 (odds ratio = 2.3, $P = 0.02$) and rs2125739 (OR = 2.0, P = 0.05) and tubular dysfunction [12]. In our study, rs9349256 was among the top 20 (of 30) candidate SNPs evaluated in the combined, Black, and White group analyses, and was among the top 20 (of 594) candidate SNPs evaluated in the White population ($P = 0.10$), which also suggests an association of this SNP with tenofovir clearance.

Although none of the SNPs in the ABCC family were significant at the genome-wide or candidate SNP level, a SNP near *ABCC4*, rs12866697 located in *CLDN10*, was the top SNP in the *ABCC4* region (± 500 KB). A biological study in mice linked loss of *CLDN10* to hypermagnesemia and nephrocalcinosis because this gene is involved in paracellular sodium permeability [43], but the relevance of this to tenofovir is not apparent. We cannot exclude the possibility that SNPs in *CLDN10* regulate *ABCC4* expression.

Only the sensitivity analysis of the 212 candidate SNPs identified SNP rs3127573 as significant in the CrCl associations. However, this SNP appeared among the top 20 SNPs in some of our genome-wide and candidate SNPs analyses as outlined in the results section. Previous studies have suggested a potential role of SLC22A6 and SLC22A7 in renal proximal tubules [9, 25]. Furthermore, a study of the association of *SLC22A2* polymorphisms with phenotypes of net tubular creatinine secretion in which rs3127573 was one of two SNPs genotyped in patients with end-stage renal disease found an association between end-stage renal disease and rs3127573: odds ratios [95% CI] 1.39 [1.16-1.67] [44]. Our results are in the same direction as this finding, affirming the association of some *SLC22A2* SNPs with renal phenotypes.

There were limitations to the present study. Renal toxicity associated with tenofovir in A5202 was modest, so did not include extreme phenotypes. The present analysis focused on change in CrCl as the primary phenotype, but it is possible that other markers of renal tubular function are more affected by genotype. The sample size within each PC-derived race/ethnicity was small, although studies have reported significance with even fewer individuals $[10-12]$. It is also possible that analyses with \sim 4.3 million imputed SNPs were limited in power by small sample sizes. Nevertheless, we detected a genome-wide association in *SLC17A.* It is conceivable that alternative statistical approaches (e.g. joint multiple-SNP analysis) could identify associations not identified herein. Finally, intracellular tenofovir exposure and secretory clearance of tenofovir, which are likely more directly relevant to renal toxicity than is plasma exposure, was not measured in A5202.

In summary, we identified a genome-wide significant association with plasma tenofovir clearance, but not with change in CrCl among patients randomized to TDF-containing regimens in A5202. Further research is warranted to replicate the *SLC17A* association with tenofovir disposition, and to assess whether previously suggested genetic associations with tenofovir-associated renal tubular injury depend on context, such as specific concomitant medication.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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Figure 1. Disposition of study subjects and SNPs through the data management and QC process *Panel A* is the disposition of study subjects. The number of subjects included in PK and CrCl association analyses varied depending on the SNPs included in the analysis, with a median (IQR) of 501 (500 to 501) PK analysis subjects, and 1039 (1038 to 1040) CrCl analysis subjects. *Panel B* is the disposition of genetic polymorphisms.

Figure 2. LocusZoom plots of *ABCC4* **gene region for association with tenofovir pharmacokinetics and change in creatinine clearance by meta-analysis**

The region of $ABCC4 \neq 500 \text{ KB}$ is shown. Genes in the region are shown at the bottom. Filled circles represent p-values for SNPs in our data. Markers are color coded to represent their degree of correlation (r^2) with the lowest p-value SNP as estimated internally by LocusZoom using the hg18/HapMap Phase II CEU genome build [45]. The blue lines correspond to the recombination rate [45]. *Panel A* represents tenofovir pharmacokinetic analyses. The lowest p-value SNP for tenofovir pharmacokinetics in this region, rs12866697, is represented by the purple diamond. *Panel B* represents change in creatinine clearance analyses. The lowest p-value SNP for change in creatinine clearance in this region, rs1751036, is represented by the purple diamond. The 12 SNPs with the lowest p-values for change in creatinine clearance are rs7330330, rs7331488, rs4148540, rs2766475, rs1678387, rs1678409, rs1678365, rs1189466, rs1751043, rs943289, rs1189435, and rs1189434.

Table 1

Baseline characteristics of study subjects

TDF/FTC = tenofovir disoproxil fumarate with emtricitabine; ABC/3TC = abacavir with lamivudine; n = number; kg/m² = kilogram per square meter; mL/min = milliliter per minute; BMI = body mass index; CrCl = creatinine clearance; IQR = interquartile range.

Table 2

Meta-analysis Results of Pharmacokinetic Associations (top 20 SNPs) Meta-analysis Results of Pharmacokinetic Associations (top 20 SNPs)

CHR = Chromosome; SNP = SNP identifier; P = P-value.

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Highlighted: imputed SNP found to be associated with tenofovir clearance Highlighted: imputed SNP found to be associated with tenofovir clearance

 $a_{\text{Significance}}$ threshold was 5×10^{-8} for the genome-wide analyses. *a*Significance threshold was 5×10−8 for the genome-wide analyses.

 $b_{\rm Significance}$ threshold was 0.002 for the subset of 30 SNPs. $b_{\text{Significance threshold was 0.002}$ for the subset of 30 SNPs.

 c Significance threshold was 8.4×10^{-5} for the subset of 594 SNPs. *c*Significance threshold was 8.4×10−5 for the subset of 594 SNPs.

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Table 3

Meta-analysis Results of Creatinine Clearance Associations (top 20 SNPs) Meta-analysis Results of Creatinine Clearance Associations (top 20 SNPs)

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 $a_{\text{Significance threshold was 5\times10^{-8}}$ for the genome-wide analyses. *a*Significance threshold was 5×10−8 for the genome-wide analyses.

 $^{\rm c}$ For intergenic SNPs, indicated are the nearest known gene $3'$ and $5'$ genes. *c*For intergenic SNPs, indicated are the nearest known gene 3′ and 5′ genes.